

MINI-SENTINEL SYSTEMATIC EVALUATION OF HEALTH OUTCOME OF INTEREST DEFINITIONS FOR STUDIES USING ADMINISTRATIVE DATA

DEPRESSION REPORT

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Mini-Sentinel is a pilot project sponsored by the <u>U.S. Food and Drug Administration (FDA)</u> to inform and facilitate development of a fully operational active surveillance system, the Sentinel System, for monitoring the safety of FDA-regulated medical products. Mini-Sentinel is one piece of the <u>Sentinel</u> <u>Initiative</u>, a multi-faceted effort by the FDA to develop a national electronic system that will complement existing methods of safety surveillance. Mini-Sentinel Collaborators include Data and Academic Partners that provide access to health care data and ongoing scientific, technical, methodological, and organizational expertise. The Mini-Sentinel Coordinating Center is funded by the FDA through the Department of Health and Human Services (HHS) Contract number HHSF223200910006I.



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Depression Report

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I. EXECUTIVE SUMMARY

A. OVERVIEW OF PROJECT

The Food and Drug Administration (FDA) Mini-Sentinel contract is a pilot program that aims to conduct active surveillance to detect and refine safety signals that emerge for marketed medical products. To perform this active surveillance, it is necessary to develop and understand the validity of algorithms for identifying health outcomes of interest in administrative data. Thus, the goal of this project was to identify algorithms used to detect selected health outcomes of interest using administrative data sources and describe the performance characteristics of these algorithms as reported by the studies in which they were used. This report summarizes the process and findings of the depression algorithm review.

B. SUMMARY OF FINDINGS

Incomplete recognition of depression in routine clinical practice constrains the performance of electronic health information to identify depressive disorders. No single algorithm demonstrated sufficiently strong operating characteristics to be recommended for general use. However, the results suggest that for some purposes including preliminary case finding, claims-based algorithms may have acceptable properties. Among adolescent outpatients with asthma, for example, 31.5% who were identified with a claims based algorithm met formal criteria for major depressive disorder or dysthymia (prevalence 7.5%). Sensitivities of approximately 50% were also achieved in two studies of claims-based algorithms in relation to independent assessments of depression.

Most adults who receive administrative codes for depression report depressive symptoms and a majority have notations of depression in their medical records. Because antidepressants are prescribed for a wide variety of psychiatric disorders and some general medical conditions, reliance on only claims for antidepressant medications tends to capture many patients without depression. The current value of administrative depression codes appears to be strongest for identifying selected cases with a reasonable probability of having clinically recognized depression and depressive symptoms.

C. RECOMMENDATION FOR ALGORITHMS AND SUGGESTION FOR FUTURE RESEARCH

No one algorithm can be confidently recommended for achieving high agreement with depression as measured by independent assessment. The highest agreement with clinically diagnosed depression was achieved by an algorithm that required over a 12 month period at least 2 first listed ICD-9 codes for 296.2 (major depressive episode, single episode), 296.3 (major depressive episode, recurrent episode), 300.4 (dysthymic disorder), or 311 (depression not elsewhere classified) as well as a filled prescription for an antidepressant medication (1). In a large population of primary care patients, the chance corrected agreement of this algorithm was moderate (Kappa: 0.464) (1, 2).

The validity of algorithms to identify independently assessed depression is ultimately dependent upon the quality of clinical depression case identification. For this reason, it is suggested that research should focus on practices that systematically screen for depression. Routine screening adults and youth for depression, though consistent with recommendations from the US Preventive Services Task Force (3, 4), is not currently widespread.



II. PROJECT OBJECTIVES

The primary objective of this project was to identify studies that have validated algorithms used to identify various health outcomes of interest (HOIs) using administrative data from the United States or Canada, and to summarize the results of those validation studies. If fewer than five validation studies were identified, a secondary objective was to identify non-validated algorithms that have been used to identify the HOIs using administrative data.

III. BACKGROUND

The Food and Drug Administration (FDA) Mini-Sentinel contract is a pilot program that aims to conduct active surveillance to detect and refine safety signals that emerge for marketed medical products. In order to perform this work, the program needed to identify algorithms used to detect various health outcomes of interest using administrative data sources and identify the performance characteristics of these algorithms as measured in the studies in which they were used. The data sources of interest were limited to those from the United States or Canada to increase their relevance to the Mini-Sentinel data sources, which are all from the United States. The Mini-Sentinel Protocol Core developed a preliminary list of approximately 140 potential health outcomes of interest, based on several criteria. These criteria included: 1) previous validation studies had been identified in a textbook chapter reviewing the validity of drug and diagnosis data used in pharmacoepidemiologic studies (5), 2) a list of designated medical events from a proposed FDA rule on the safety reporting requirements for human drug and biological products (6), 3) the Observational Medical Outcomes Partnership (OMOP) (5) had commissioned reports on algorithms used to identify the health outcome using administrative data (7).

From the original list of 140 HOIs, the Protocol Core worked with FDA to select 20 for which reviews of algorithms would be completed. HOIs for which OMOP had already commissioned reports were purposefully excluded in order to avoid duplication of effort.

Depression was one of the 20 HOIs selected for review. This report describes the review process and findings for the depression definition algorithms.

IV. METHODS

A. SEARCH STRATEGY

The general search strategy was developed based on prior work by OMOP and its contractors, and modified slightly for these reports. Originally, OMOP contracted with two organizations to perform reviews of 10 HOIs. Because the search strategies used by each organization resulted in very different sets of articles, OMOP investigators reviewed the PubMed indexing of the articles deemed useful in final reports and developed a strategy that would identify the majority of these citations while maintaining efficiency in the number of abstracts that would need to be reviewed. Mini-Sentinel investigators made minor changes to this strategy that would result in the identification of more citations, and confirmed empirically that the majority of relevant articles from one set of OMOP reports (angioedema) (8, 9) would be identified using this approach. The base search strategy was then combined with PubMed terms representing the HOIs. Medical subject heading (MeSH) terms were generally preferred as HOI search terms due to their likely specificity. Text word searches were sometimes used, particularly when the MeSH search resulted in a small number of citations for review. The workgroup also searched the



database of the Iowa Drug Information Service (IDIS) using a similar search strategy to identify other relevant articles that were not found in the PubMed search. For a limited number of outcomes where very few citations were identified from PubMed and IDIS searches, Embase searches were conducted. Search results were restricted to articles published on or after January 1, 1990.

University of Iowa investigators compiled the search results from different databases and eliminated duplicate results using a citation manager program. The results were then output into two sets of files, one containing the abstracts for review and the other for documenting abstract review results.

The search strategy and results for depression are detailed in the Results section. The PubMed search was conducted on May 14, 2010, and the IDIS searches on June 11, 2010.

B. ABSTRACT REVIEW

1. Abstract Review Methods

Each abstract was reviewed independently by two investigators to determine whether the full-text article should be reviewed. Exclusion criteria were documented sequentially (i.e. if exclusion criterion 1 was met then the other criteria were not documented). If the reviewers disagreed on whether the full-text should be reviewed, then it was selected for review. Inter-rater agreement on whether to include or exclude an abstract was calculated using a Cohen's kappa statistic. The goal was to review any administrative database study that used data from the United States or Canada and studied the HOI, as validation components of studies are not necessarily included in the abstract and other relevant citations might be identified from the references of such studies.

2. Abstract Exclusion Criteria

- 1. Did not study the HOI.
- 2. Not an administrative database study. Eligible sources included insurance claims databases as well as other secondary databases that identify health outcomes using billing codes.
- 3. Data source not from the United States or Canada.

C. FULL-TEXT REVIEW

1. Full-Text Review Methods

Full-text articles were reviewed independently by two investigators, with a goal of identifying validation studies described in the article itself or from the reference section of the article. Citations from the article's references were selected for full-text review if they were cited as a source for the HOI algorithm, or were otherwise deemed likely to be relevant. Full-text review exclusion criteria were applied sequentially, since if fewer than 5 validation studies were identified, up to 10 of the articles excluded based on the second criterion would need to be incorporated into the final report. If there was disagreement on whether a study should be included, the two reviewers attempted to reach consensus on inclusion by discussion. If the reviewers could not agree, a third investigator would be consulted to make the final the decision.



2. Full-Text Exclusion Criteria

- 1. Poorly described HOI identification algorithm that would be difficult to operationalize.
- 2. No validation of outcome definition or reporting of validity statistics.

D. MINI-SENTINEL INVESTIGATOR SURVEY

Mini-Sentinel investigators were surveyed to request information on any published or unpublished studies that validated an algorithm to identify an HOI in administrative data. Studies that would not be excluded by one of the aforementioned criteria were included in the final report.

E. EVIDENCE TABLE CREATION

A single investigator abstracted each study for the final evidence table. The data included in the table were confirmed by a second investigator for accuracy.

F. CLINICIAN OR TOPIC-EXPERT CONSULTATION

A clinician or topic-expert was consulted to review the results of the evidence table and discuss how they compare and contrast to diagnostic methods currently used in clinical practice. This included whether certain diagnostic codes used in clinical practice were missing from the algorithms, and the appropriateness of the validation definitions compared to diagnostic criteria currently used in clinical practice. A summary of this consultation was included in the results.

V. RESULTS

A. SEARCH STRATEGY AND RESULTS

The following summarizes the search results obtained from PubMed and IDIS searches. The PubMed search identified 1664 citations (Table 1), and the two IDIS searches identified 138 unique citations (Table 2). The total number of unique citations from the combined searches was 1731. An additional PubMed search was conducted at a later date to amend the original search strategy with names of relevant databases that were not included in the original search. This search identified 30 citations (Table 3).



Table 1. PubMed Search Strategy and Results: Performed on 05/14/10

Results = 1164

Search	Query	Results
#1	((("Depression"[Mesh] OR "Depressive Disorder"[Mesh:NoExp]) OR "Depressive Disorder, Major"[Mesh]) OR "Dysthymic Disorder"[Mesh]) OR "Seasonal Affective Disorder"[Mesh]	115292
#2	Limits: Humans, English, Publication Date from 1990/01/01 to 2010/06/01	6118555
#3	("Pharmaceutical preparations/adverse effects" [Mesh] OR "Pharmaceutical preparations/contraindications" [Mesh] OR "Pharmaceutical preparations/poisoning" [Mesh] OR "Pharmaceutical preparations/therapeutic use" [Mesh] OR "Pharmaceutical preparations/toxicity" [Mesh] OR "Pharmaceutical preparations/therapy" [Mesh] OR "Pharmaceutical preparations/analysis" [Mesh] OR "Chemical actions and uses/adverse effects" [Mesh] OR "Chemical actions and uses/contraindications" [Mesh] OR "Chemical actions and uses/poisoning" [Mesh] OR "Chemical actions and uses/therapeutic use" [Mesh] OR "Chemical actions and uses/toxicity" [Mesh] OR "Chemical actions and uses/therapeutic use" [Mesh] OR "Chemical actions and uses/toxicity" [Mesh] OR "Chemical actions and uses/therapy" [Mesh] OR "Chemical actions and uses/toxicity" [Mesh] OR "Chemical actions and uses/therapy" [Mesh] OR "Chemical actions and uses/toxicity" [Mesh] OR "Chemical actions and uses/therapy" [Mesh] OR "Drug toxicity" [Mesh] OR "Diseases Category/chemically induced" [Mesh] OR "Diseases Category/drug therapy" [Mesh] OR "Diseases Category/epidemiology" [Mesh] OR "Validation Studies" [pt] OR "Validation Studies as Topic" [Mesh] OR "Sensitivity and Specificity" [Mesh] OR "Predictive Value of Tests" [Mesh] OR "Reproducibility of Results" [Mesh] OR "Predictive Value" [tw]) Limits: Humans, English, Publication Date from 1990/01/01 to 2010/06/01	1882144
#4	("Premier"[All] OR "Solucient"[All] OR "Cerner"[All] OR "Ingenix"[All] OR "LabRx"[All] OR "IHCIS"[All] OR "marketscan"[All] OR "market scan"[All] OR "Medstat"[All] OR "Thomson"[All] OR "pharmetrics"[All] OR "healthcore"[All] OR "united healthcare"[All] OR "UnitedHealthcare"[All] OR "UHC"[All] OR "GPRD"[All] OR "general practice research database"[All] OR "Research Database"[All] OR "Group Health"[All] OR "HCUP"[All] OR ("Healthcare Cost"[All] AND "Utilization Project"[All]) OR ("Health Care Cost"[All] AND "Utilization Project"[All]) OR "MEPS"[All] OR "Medical Expenditure Panel Survey"[All] OR "NAMCS"[All] OR "National Hospital Ambulatory Medical Care Survey"[All] OR "National Ambulatory Medical Care Survey"[All] OR "NHIS"[All] OR "Medical Care Survey"[All] OR "HMO"[All] OR "Kaiser"[All] OR "HMO Research"[All] OR "NHIS"[All] OR "Mational Health Interview Survey"[All] OR "Cleveland Clinic"[All] OR "Lovelace"[All] OR "Department of Defense"[All] OR "Henry Ford"[All] OR "Cleveland Clinic"[All] OR "Lovelace"[All] OR "Department of Defense"[All] OR "Henry Ford"[All] OR "Institute for Drug Outcome Research"[All] OR "Intercontinental Marketing Services"[All] OR "Institute for Drug Outcome Research"[All] OR "MEMO"[All] OR "Mayo Clinic"[All] OR "Regenstrief"[All] OR "Indiana Health Information Exchange"[All] OR "Mayo Clinic"[All] OR "Rochester Epidemiology"[All] OR "rayside"[All] OR "MeMO"[All] OR "Mayo Clinic"[All] OR "Rochester Epidemiology"[All] OR "Indiana Health Information Exchange"[All] OR "Nayo Clinic"[All] OR "MediPlus"[All] OR "National Inpatient Sample"[All] OR "health services"[All] OR "Nationwide Inpatient Sample"[All] OR "National Inpatient Sample"[All] OR "indiana Health"[All] OR "Regenstrief"[All] OR "National Inpatient Sample"[All] OR "indiana Health"[All] OR "Intermountain"[All] OR "The health plan"[All] OR "Medicare"[All] OR "Nationwide Inpatient Sample"[All] OR "National Inpatient Sample"[All] OR "incerance"[All] OR "Nationwide Inpatient Sample"[All] OR "National Inpatient Sample"[All] OR "incerance"[395570



	10-CM"[All Fields] Limits: Humans, English, Publication Date from 1990/01/01 to 2010/06/01	
#5	("Clinical Trial"[pt] OR "Editorial"[pt] OR "Letter"[pt] OR "Meta-Analysis"[pt] OR "Randomized Controlled Trial"[pt] OR "Clinical Trial, Phase I"[pt] OR "Clinical Trial, Phase II"[pt] OR "Clinical Trial, Phase III"[pt] OR "Clinical Trial, Phase IV"[pt] OR "Comment"[pt] OR "Controlled Clinical Trial"[pt] OR "case reports"[pt] OR "Clinical Trials as Topic"[Mesh] OR "double-blind"[All] OR "placebo- controlled"[All] OR "pilot study"[All] OR "pilot projects"[Mesh] OR "Review"[pt] OR "Prospective Studies"[Mesh]) Limits: Humans, English, Publication Date from 1990/01/01 to 2010/06/01	2704544
#6	Search #1 and #3 and #4 Limits: Humans, English, Publication Date from 1990/01/01 to 2010/06/01	2840
#7	Search #6 not #5 Limits: Humans, English, Publication Date from 1990/01/01 to 2010/06/01	1664



Table 2. IDIS Search Strategy and Results: Performed on 06/11/10

Results = 138

Search 1: 17 Results

ADVANCED SEARCH

All Fields:

"Premier" OR "Solucient" OR "Cerner" OR "Ingenix" OR "LabRx" OR "IHCIS" OR "marketscan" OR "market scan" OR "Medstat" OR "Thomson" OR "pharmetrics" OR "healthcore" OR "united healthcare" OR "UnitedHealthcare" OR "UHC" OR "GPRD" OR "general practice research database" OR "Research Database" OR "Group Health" OR "HCUP" OR ("Healthcare Cost" AND "Utilization Project") OR ("Health Care Cost" AND "Utilization Project") OR "MEPS" OR "Medical Expenditure Panel Survey" OR "NAMCS" OR "National Hospital Ambulatory Medical Care Survey" OR "National Ambulatory Medical Care Survey" OR "NHIS" OR "National Health Interview Survey" OR "Kaiser" OR "HMO Research" OR "Health Maintenance Organization" OR "HMO" OR "Cleveland Clinic" OR "Lovelace" OR "Department of Defense" OR "Henry Ford" OR ("Denmark" AND "Epidemiology") OR "i3 Drug Safety" OR "i3" OR "Aetna" OR "Humana" OR "Wellpoint" OR "IMS" OR "Intercontinental Marketing Services" OR "IMS Health" OR "Geisinger" OR "GE Healthcare" OR "MQIC" OR "PHARMO" OR "Institute for Drug Outcome Research" OR "Pilgrim" OR "Puget Sound" OR "Regenstrief" OR "Saskatchewan" OR "Tayside" OR "MEMO" OR "Medicines Monitoring Unit" OR "Veterans Affairs" OR "Partners Healthcare" OR "Mayo Clinic" OR "Rochester Epidemiology" OR "Indiana Health Information Exchange" OR "Indiana Health" OR "Intermountain" OR "THIN" OR "The health improvement network" OR "blue cross" OR "health partners" OR "health plan" OR "health services" OR "Nationwide Inpatient Sample" OR "National Inpatient Sample" OR "medicaid" OR "medicare" OR "MediPlus" OR "Outcome Assessment" OR "insurance database" OR "insurance databases" OR "Data Warehouse" OR "ICD-9" OR "international statistical classification" OR "international classification of diseases" OR "ICD-10" OR "Database Management Systems" OR "Medical Records Systems, Computerized" OR "CPT" OR "Current procedural terminology" OR "drug surveillance" OR ("claims" AND "administrative") OR ("data" AND "administrative") OR "Databases, Factual" OR "Databases" OR "Medical Record Linkage" OR "ICD-9-CM" OR "ICD-10-CM"

AND Descriptor:

"SIDE EF PSYCHIATRIC 88" not ("CASE REPORT ADULT 0" or "FDA APPROVAL PACKAGE 155" OR "FDA BLACK BOX WARNING 165" OR "PIVOTAL STUDY 162" OR "FDA ADVISORY COMMITTEE 164" or "CASE REPORT PEDIATRIC 1" or "CASE REPORT GERIATRIC 2" or "REVIEW ADULT 6" or "STUDY NON-CLINICAL 8" or "REVIEW PEDIATRIC 21" or "REVIEW GERIATRIC 23" or "STUDY RANDOMIZE ADULT 135" or "STUDY RANDOMIZE PEDIATRIC 136" or "STUDY RANDOMIZE GERIATRIC 137" or "CROSS-OVER 144" or "META-ANALYSIS 145" or "N-OF-ONE TRIAL 146" or "PRACTICE GUIDELINE 156" or "SYSTEMATIC REVIEW 161" or "ANNOTATED BIBLIOGRAPHY 167" or "PRIORITY CLIN PRACT GUIDE 168")

AND NOT Author:

"Editorial" OR "(Letter to Ed)"

AND Abstract:

Depression

Years: 1990-2010

Records = 17

Search 2: 128 Results



ADVANCED SEARCH

All Fields:

"Premier" OR "Solucient" OR "Cerner" OR "Ingenix" OR "LabRx" OR "IHCIS" OR "marketscan" OR "market scan" OR "Medstat" OR "Thomson" OR "pharmetrics" OR "healthcore" OR "united healthcare" OR "UnitedHealthcare" OR "UHC" OR "GPRD" OR "general practice research database" OR "Research Database" OR "Group Health" OR "HCUP" OR ("Healthcare Cost" AND "Utilization Project") OR ("Health Care Cost" AND "Utilization Project") OR "MEPS" OR "Medical Expenditure Panel Survey" OR "NAMCS" OR "National Hospital Ambulatory Medical Care Survey" OR "National Ambulatory Medical Care Survey" OR "NHIS" OR "National Health Interview Survey" OR "Kaiser" OR "HMO Research" OR "Health Maintenance Organization" OR "HMO" OR "Cleveland Clinic" OR "Lovelace" OR "Department of Defense" OR "Henry Ford" OR ("Denmark" AND "Epidemiology") OR "i3 Drug Safety" OR "i3" OR "Aetna" OR "Humana" OR "Wellpoint" OR "IMS" OR "Intercontinental Marketing Services" OR "IMS Health" OR "Geisinger" OR "GE Healthcare" OR "MQIC" OR "PHARMO" OR "Institute for Drug Outcome Research" OR "Pilgrim" OR "Puget Sound" OR "Regenstrief" OR "Saskatchewan" OR "Tayside" OR "MEMO" OR "Medicines Monitoring Unit" OR "Veterans Affairs" OR "Partners Healthcare" OR "Mayo Clinic" OR "Rochester Epidemiology" OR "Indiana Health Information Exchange" OR "Indiana Health" OR "Intermountain" OR "THIN" OR "The health improvement network" OR "blue cross" OR "health partners" OR "health plan" OR "health services" OR "Nationwide Inpatient Sample" OR "National Inpatient Sample" OR "medicaid" OR "medicare" OR "MediPlus" OR "Outcome Assessment" OR "insurance database" OR "insurance databases" OR "Data Warehouse" OR "ICD-9" OR "international statistical classification" OR "international classification of diseases" OR "ICD-10" OR "Database Management Systems" OR "Medical Records Systems, Computerized" OR "CPT" OR "Current procedural terminology" OR "drug surveillance" OR ("claims" AND "administrative") OR ("data" AND "administrative") OR "Databases, Factual" OR "Databases" OR "Medical Record Linkage" OR "ICD-9-CM" OR "ICD-10-CM"

AND Disease:

300.4 or 311. (note: DISORDER, DEPRESSIVE NEC 311. DEPRESSION, NEUROTIC 300.4)

and not **Descriptor**: "CASE REPORT ADULT 0" or "FDA APPROVAL PACKAGE 155" OR "FDA BLACK BOX WARNING 165" OR "PIVOTAL STUDY 162" OR "FDA ADVISORY COMMITTEE 164" or "CASE REPORT PEDIATRIC 1" or "CASE REPORT GERIATRIC 2" or "REVIEW ADULT 6" or "STUDY NON-CLINICAL 8" or "REVIEW PEDIATRIC 21" or "REVIEW GERIATRIC 23" or "STUDY RANDOMIZE ADULT 135" or "STUDY RANDOMIZE PEDIATRIC 136" or "STUDY RANDOMIZE GERIATRIC 137" or "CROSS-OVER 144" or "META-ANALYSIS 145" or "N-OF-ONE TRIAL 146" or "PRACTICE GUIDELINE 156" or "SYSTEMATIC REVIEW 161" or "ANNOTATED BIBLIOGRAPHY 167" or "PRIORITY CLIN PRACT GUIDE 168"

AND NOT Author:

"Editorial" OR "(Letter to Ed)"

Years: 1990-2010

Records = 128



Table 3. Search to Update the Original PubMed Search with Additional Database Names: Performedon 07/06/10

Results = 30

Search	Query	Results
#1	("Pharmaceutical preparations/adverse effects" [Mesh] OR "Pharmaceutical preparations/contraindications" [Mesh] OR "Pharmaceutical preparations/poisoning" [Mesh] OR "Pharmaceutical preparations/therapeutic use" [Mesh] OR "Pharmaceutical preparations/toxicity" [Mesh] OR "Pharmaceutical preparations/therapy" [Mesh] OR "Pharmaceutical preparations/analysis" [Mesh] OR "Chemical actions and uses/adverse effects" [Mesh] OR "Chemical actions and uses/contraindications" [Mesh] OR "Chemical actions and uses/poisoning" [Mesh] OR "Chemical actions and uses/therapeutic use" [Mesh] OR "Chemical actions and uses/toxicity" [Mesh] OR "Chemical actions and uses/therapy" [Mesh] OR "Chemical actions and uses/analysis" [Mesh] OR "Chemical actions and uses/epidemiology" [Mesh] OR "Drug toxicity" [Mesh] OR "Diseases Category/chemically induced" [Mesh] OR "Diseases Category/drug therapy" [Mesh] OR "Diseases Category/epidemiology" [Mesh] OR "Validation Studies" [pt] OR "Validation Studies as Topic" [Mesh] OR "Sensitivity and Specificity" [Mesh] OR "Predictive Value of Tests" [Mesh] OR "Reproducibility of Results" [Mesh] OR "Predictive Value of Tests" [Mesh] OR "Reproducibility of Results" [Mesh] OR "Predictive Value" [tw]) Limits: Humans, English, Publication Date from 1990/01/01 to 2011/01/01	1867752
#2	("Premier"[All] OR "Solucient"[All] OR "Cerner"[All] OR "Ingenix"[All] OR "LabRx"[All] OR "IHCIS"[All] OR "marketscan"[All] OR "market scan"[All] OR "Medstat"[All] OR "Thomson"[All] OR "pharmetrics"[All] OR "healthcore"[All] OR "united healthcare"[All] OR "UnitedHealthcare"[All] OR "UHC"[All] OR "OFRD"[All] OR "general practice research database"[All] OR "Research Database"[All] OR "Group Health"[All] OR "HCUP"[All] OR ("Healthcare Cost"[All] AND "Utilization Project"[All]) OR ("Health Care Cost"[All] AND "Utilization Project"[All]) OR "MEPS"[All] OR "Medical Expenditure Panel Survey"[All] OR "NAMCS"[All] OR "National Hospital Ambulatory Medical Care Survey"[All] OR "National Ambulatory Medical Care Survey"[All] OR "NHIS"[All] OR "Health Maintenance Organization"[All] OR "Kaiser"[All] OR "HMO Research"[All] OR "Lovelace"[All] OR "Department of Defense"[All] OR "HMO Research"[All] OR "Lovelace"[All] OR "Humana"[All] OR "Wellpoint"[All] OR "IMS"[All] OR "Intercontinental Marketing Services"[All] OR "Humana"[All] OR "Wellpoint"[All] OR "IMS"[All] OR "Intercontinental Marketing Services"[All] OR "HAMO"[All] OR "Institute for Drug Outcome Research"[All] OR "Pigrim"[All] OR "MEMO"[All] OR "Medicines Monitoring Unit"[All] OR "Saskatchewan"[All] OR "Tayside"[All] OR "MEMO"[All] OR "Medicines Monitoring Unit"[All] OR "Intercontinential Marketing Services"[All] OR "Medicines Monitoring Unit"[All] OR "Intermountain"[All] OR "THIN"[All] OR "The health improvement network"[All] OR "Intermountain"[All] OR "THIN"[All] OR "The health plan"[All] OR "health services"[All] OR "Nationwide Inpatient Sample"[All] OR "National Inpatient Sample"[All] OR "Intermountain"[All] OR "Indiana Health Information Exchange"[All] OR "Indiana Health"[All] OR "Intermountain"[All] OR "Indiana Health Information Exchange"[All] OR "Indiana Health"[All] OR "Internountain"[All] OR "Indiana Health Information Exchange"[All] OR "Indiana Health"[All] OR "International statistical classification"[All] OR "Outcome Assessment"[All] OR "	399576



	from 1990/01/01 to 2011/01/01	
#3	("Clinical Trial"[pt] OR "Editorial"[pt] OR "Letter"[pt] OR "Meta-Analysis"[pt] OR "Randomized Controlled Trial"[pt] OR "Clinical Trial, Phase I"[pt] OR "Clinical Trial, Phase II"[pt] OR "Clinical Trial, Phase III"[pt] OR "Clinical Trial, Phase IV"[pt] OR "Comment"[pt] OR "Controlled Clinical Trial"[pt] OR "case reports"[pt] OR "Clinical Trials as Topic"[Mesh] OR "double-blind"[All] OR "placebo-controlled"[All] OR "pilot study"[All] OR "pilot projects"[Mesh] OR "Review"[pt] OR "Prospective Studies"[Mesh]) Limits: Humans, English, Publication Date from 1990/01/01 to 2011/01/01	2729582
#4	#1 NOT #2 Limits: Humans, English, Publication Date from 1990/01/01 to 2011/01/01	1748136
#5	#4 NOT #3 Limits: Humans, English, Publication Date from 1990/01/01 to 2011/01/01	819148
#6	(TennCare [tiab]) OR (RAMQ [tiab]) OR (Cigna [tiab]) OR ((british columbia[tiab]) AND ((health[tiab]) OR (data[tiab]) OR (database[tiab]) OR (population[tiab]))) OR (CIHI [All Fields]) OR ((manitoba[tiab]) AND ((center for health policy[all fields]) OR (population[tiab]) OR (health insurance[tiab]))) OR ((ontario[tiab]) AND ((population[tiab]) OR (OHIP[tiab]) OR (registered persons database[tiab]) OR (health insurance [tiab]) OR (ICES[All Fields]) OR (Institute for Clinical Evaluative Sciences[All Fields]))) OR ((Alberta[tiab]) AND ((health[tiab]) OR (data[tiab]) OR (database[tiab]) OR (population[tiab]) OR (Alberta Health and Wellness[All Fields]))) Limits: Humans, English, Publication Date from 1990/01/01 to 2011/01/01	5128
#7	#5 AND #6 Limits: Humans, English, Publication Date from 1990/01/01 to 2011/01/01	1579
#8	Search #7 AND (((("Depression"[Mesh] OR "Depressive Disorder"[Mesh:NoExp]) OR "Depressive Disorder, Major"[Mesh]) OR "Dysthymic Disorder"[Mesh]) OR "Seasonal Affective Disorder"[Mesh]) Limits: Humans, English, Publication Date from 1990/01/01 to 2011/01/01	30

B. ABSTRACT REVIEWS

Of the 1761 abstracts reviewed, 286 were selected for full-text review; 219 were excluded because they did not study depression, 994 were excluded because they were not administrative database studies, and 262 were excluded because the data source was not from the United States or Canada. Cohen's kappa for agreement between reviewers on inclusion vs exclusion of abstracts was 0.77.

C. FULL-TEXT REVIEWS

Of the 286 full-text articles reviewed, 10 were included in the final evidence tables; 142 were excluded because the HOI identification algorithm was poorly defined, and 134 were excluded because they included no validation of the outcome definition or reporting of validity statistics. Reviewers identified 36 citations for review from full-text article references. Of these, 1 was included in the final report; 9 did not study depression, 12 were not database studies, 5 were excluded because the HOI algorithm was poorly defined, and 9 were excluded because they included no validation of the outcome definition or reporting of validity statistics. The final evidence table thus includes 11 articles. Cohen's kappa for agreement between reviewers on inclusion vs exclusion of full-text articles reviewed was 0.95.



D. MINI-SENTINEL INVESTIGATOR SURVEY

Mini-Sentinel investigators provided 0 published and 0 unpublished reports of validation studies that had been completed by their teams.

E. EVIDENCE INCLUDED IN TABLE

Of the 11 studies included in the table, 10 were identified from the initial search strategy and 1 was identified through references of articles that underwent full-text review. The table is organized from top to bottom with listing first those studies that focused on positive predictive value, followed by those which include information about positive predictive value and sensitivity, and finally one study with only information regarding sensitivity of the algorithm.

F. SUMMARY AND DISCUSSION OF ALGORITHMS AND VALIDATION

Codes Used in Algorithms. All 11 publications listed in the evidence table included algorithms with various combinations of four different ICD-9 diagnostic codes depression, NOS (311), dysthymic disorder (300.4), and major depressive disorder, single episode (296.2) or recurrent (296.3) to define depression (See Appendix C). Two studies further permitted adjustment disorder with brief depressive reaction (309.0), adjustment reaction with prolonged depressive reaction (309.1), adjustment reaction with mixed emotional features (309.28), and depressive type psychosis (298.0) (10, 11) (See Appendix C). For some of the algorithms in one study (12), the following codes were also included: other specified alcohol-induced mental disorder (291.89), other specified drug-induced mental disorders (292.89), bipolar affective disorder, depressed (296.5), and bipolar affective disorder, mixed (296.6). Algorithms in three studies also required a claim for a filled antidepressant prescription (1, 13, 14).

The algorithms for individual studies varied with respect to specific selected codes, treatment setting (outpatient or inpatient), code listing (principal or first listed vs secondary), billing health care professional, number of required codes, and timing of the codes. The heterogeneity of the algorithms across the studies constrains strict comparisons. For example, the study which defined depression on the basis of at least 2 outpatient or 1 inpatient codes for depression (296.2, 296.3, 300.4, 311) in a 12 month period likely included a narrower patient population (13) than the study which required only a single depression claim (296.2, 296.3, 311) (15).

Validation Criteria and Method. The studies used three general approaches to the validation of the algorithms: structured diagnostic interviews of depressive disorders (10, 16), self-report items or forms (11, 12, 15, 17, 18), and depression diagnoses in the medical record (1, 13, 14, 17, 19). Some of the self report validations were based on a single item for depression or depressed mood (15, 17) or whether patients had ever been told by a doctor that they had depression (12, 17). One study (17) used a 20-item self-report depression scale (CES-D) (20) and two studies (11, 18) used the PHQ-9, which is a brief nine item validated screen for major depression (21). One of the studies permitted direct comparison of four different validation criteria: a CES-D score of \geq 6, self report depression item, being told by a physician of a depression diagnosis, and a medical record diagnosis of depression (17).

Validation Algorithm. Four of the 11 studies provided sufficient information to derive a chance corrected measure of agreement (kappa) between the algorithm and a criterion standard. Landis and Koch have suggested the following kappa assessment standards: 0.0-0.20 (slight), 0.21-0.40 (fair), 0.41-0.60 (moderate), and 0.61-0.80 (substantial) (2). In the three studies which used an independent



assessment of depression based on structured diagnostic interview or symptom checklist as the criterion standard, agreement was either in the slight (16, 18) or fair (10, 16) range. The only study which permitted calculation of kappa and used a physician diagnosis of depression in the medical record as the criterion standard achieved a moderate level of chance corrected agreement (1).

Beyond overall agreement as measured by kappa, one key criterion by which to evaluate the performance of the algorithms is to consider the proportion of people identified as depressed by a claims-based measure whom have significant depression confirmed by a second information source (Positive Predictive Value). Ten of the 11 studies provide positive predictive values that ranged from 48.6% (14) to 98.8% (13). Because positive predictive values vary as a function of prevalence, the interpretation of the positive predictive values from several of the studies (12-15, 17, 19) is undermined by the absence of prevalence data.

Four studies included information about PPV and prevalence. One study, which compared claims-based algorithms with physician diagnoses in the medical record as the criterion standard (1), did not include an independent assessment of depression. In another study, the PPV (66.4%) using the PHQ-9 as the criterion standard was only marginally higher than the prevalence (55.8%) (18). Two studies, one of emergently admitted older adult medical inpatients (16) and one of adolescents with asthma (10), included prevalence information, an independent criterion standard, and PPV values that were substantially greater than base prevalence. In the study of older adults, PPVs ranged from 52.6% to 62.5% (prevalence 30.8%) (16), while in the study of adolescents PPVs ranged from 31.5% (prevalence 7.7%) to 39.4% (prevalence 14.6%) (10).

Another key criterion by which to evaluate claims-based algorithms is to consider what proportion of people with depression identified by an independent source will have depression identified by the algorithm (sensitivity). Five of the studies included information on sensitivity (1, 10, 11, 16, 18). One of these studies, however, used physician notes in medical records as the criterion standard (1) and did not include an independent measure of depression. Of the remaining 4 studies, the sensitivities ranged from 15.8% to 51.1%. Therefore, the most sensitive algorithms detected approximately one-half of patients who were determined to be depressed by independent assessment (10, 18).

Operating characteristics varied as a function of the validation algorithm. These relationships were most readily apparent in studies that tested different algorithms against the same criterion standard within the same patient population. In a study of Veterans treated for diabetes mellitus, for example, broadening the algorithm from unipolar depression codes to include also bipolar disorder and substance-related mood disorder codes markedly increased the percentage of patients captured by the algorithm from 4.5% to 16.5%, but reduced the positive predictive value (0.90 to 0.82). In this study, the criterion standard was patient report of being told by a doctor that the patient had depression (12).

In one primary care study in which physician medical record diagnosis of depression was the criterion standard, narrowing an algorithm markedly altered the operating characteristics (1). In the first algorithm, patients were required to have at least 2 events either of which could be an outpatient encounter with a primary diagnosis of depression or a pharmacy claim for an antidepressant medication. Thus patients with antidepressant claims without an outpatient depression diagnosis met algorithm requirements. The second algorithm required one outpatient claim with a primary depression diagnosis and another event which could be either a second outpatient depression diagnosis or an antidepressant claim. Perhaps not surprisingly, the less stringent first algorithm had a lower specificity (65.4% vs 88.4%),



but a much higher sensitivity (95.0% vs 52.1%) than the more stringent second algorithm. The kappa was slightly higher with the first (0.464) than the second (0.425) algorithm (1).

Selected Patients. The studies also varied with respect to patient population. Beyond differences in patient age, described below, clinical differences were evident among the study populations: three studies were limited to patients treated for diabetes mellitus (11, 12, 18), one focused exclusively on patients with a history of asthma treatment (10), and one involved only disabled persons (15). The patient populations included a range of sources payment for medical services. While some of the studies were limited to patients with Medicaid coverage (15, 18), others included only patients with private insurance (10, 11, 13). Two studies were based on patients receiving care that was financed and provided by the Veterans Health Administration (12, 14). One study of Veterans care indicated that supplementing Veterans Health Administration data with Medicare data enhanced the rate of depression detection (12) (Appendix D).

The validity of claims based measures likely varies with characteristics of the patient population. Several studies have examined whether patient and service characteristics influence the clinical recognition of depression in general medical settings (23-30). A consistent finding to emerge from this literature is that clinical detection erodes with declining depression symptom severity (23-25). Some indices of socio-economic disadvantage also appear to decrease the likelihood of clinical detection of depression. Depressed Medicaid financed patients (26), adults with less formal education (23, 24), African Americans (26), and patients with fewer (24) or shorter (26) primary care visits have each been reported to have a comparatively high risk of missed clinical depression diagnoses. An absence of current or past psychotropic treatment has also been linked to a failure to diagnose depression in primary care (23, 25).

Acute co-occurring general medical disorders may further compromise clinical recognition of depression (24, 27-29). Within the context of an individual visit, somatic complaints related to general medical problems may compete with depressive symptoms for clinical attention (24, 28) or lead physicians to misattribute signs and symptoms of depression to other medical problems (29). Over time, however, co-occurring chronic medical conditions may increase clinical recognition of depression (30). This effect may be mediated by a tendency for patients with chronic medical conditions to make frequent medical visits to a consistent source of care whom they trust (30). For these and related reasons, the validity of claims based measures of depression likely depends upon the clinical and service characteristics of the patient population.

Age of Study Population. One study was limited to adolescents (10), one included children as well as adults (19), and one included only patients at least 65 years of age (16). The remaining 8 studies involved non-elderly as well as elderly adults. The average patient age in these studies was between 50 and 60 years.

None of the studies included validation information stratified by patient age. Because positive predictive value depends upon the prevalence of the underlying condition, it is likely that PPV will be lower in children and adolescents than in adults because of the lower treated prevalence of depression in children and adolescents than adults (31). Clinical recognition of depression may also vary with patient age (30).

Patient Sex. Except for two studies of Veterans (12, 14), all of the studies involved a predominance of female patients. None of the studies, however, provided validation data stratified by patient sex. After



controlling for measures of severity and impairment, patient sex has not been found to be related to the rate of treatment of major depression (32).

Time Period of Data Collection. The 11 reviewed studies were published between 1997 and 2010. The earliest data were based on care delivered in 1986 (19) and the most recent data were derived from 2006 (18), though two studies did not specify the dates of service delivery (11, 16). During this period, there has been a substantial increase the proportion of Americans treated for depression (33, 34).

Principal vs Secondary Diagnosis. Only one of the studies included algorithms which required that the depression code appear in the principal or primary position (1). All of the other studies did not indicate the position of the depression codes. Whether the validity of depression codes varies with code position has not been subject to systematic study.

Hospitalization Diagnosis vs Outpatient Encounter. The studies included in this report examined depression outcomes based on billing codes for inpatient treatment (12, 13, 19), outpatient visits (1, 12, 13, 14, 16, 17) or emergency encounters (12, 14, 17). None of the studies separately assessed or compared the validation of depression outcomes from different treatment settings, though one study compared validity measures from primary care visit codes with mental health service codes (12).

G. SUMMARY OF EXCLUDED POPULATIONS AND DIAGNOSES

As indicated in section F above, five studies focused exclusively on populations with specific conditions including diabetes (11, 12, 18), asthma (10), and disability (15). Of the other six studies, two were limited to patients who had received inpatient treatment (16, 19) and one was limited to Veterans and focused on new onsets of depression (14).

Only one of the studies was based on a national population (12). The other studies were derived from a Canadian province (19), 2 acute care hospitals (16), 3 Veterans Health Administration medical centers (14), large managed care organizations (1, 18), a private health plan or health maintenance organization (10, 11, 13) or a group of 9 primary care clinics (17).



H. EVIDENCE TABLE

Table 4. Positive Predictive Values by Algorithm

Citation	Study Population and Time Period	Description of Outcome Studied	Algorithm	Validation/Adjudication Procedure and Operational Definition	Validation Statistics
Frayne et al., 2010	National sample (n=133,068) of Veterans who were treated for diabetes mellitus and responded to a health survey, 98.1% male, 76.6% white, mean age-66.3 years, 1998-1999.	Patient self- report of depression: "Has a doctor ever told you that you have depression?"	Diagnosis of ICD-9: 296.2x, 296.3x, 311 (Algorithm H).	Proportion of patients meeting algorithm criteria told that they have depression (PPV) and proportion not meeting algorithm criteria not told that they have depression (NPV).	PPV=84% NPV=72% (Algorithm H: see Appendix D for complete results)
Kramer et al., 2003	Veterans (n=109) from 3 VA medical centers with ≥1 outpatient claim for a depressive disorder (296.2- 296.26, 296.3- 296.36, or 311) after 180 days without such a claim or an AD fill, 95.2% male, mean age 55.5 years,1999-2001.	Presence of depression diagnosis in medical record during 180 day period after the new depressive disorder claim	≥1 outpatient claims for depression (ICD- 9: 296.2, 296.3, or 311) in any service setting after 189 days without such a claim or an antidepressant fill.	Estimate of PPV for new onset depression by determining proportion of cases with depression diagnosis in medical record during 180 days prior to new index claim for depression.	PPV= 48.6% (53 of 109) (New onset depression)
Rawson et al., 1997	Randomly selected inpatients with a first listed discharge diagnosis of depression (311) in administrative files, Saskatchewan, 30.1% male, male median age: 43 years, female median age: 51 years, 1986	A diagnosis of depression (311) or a depression- related disorder (ICD- 9: 296.1, 296.4, 296.6, 300.4, 309, 311) in the medical record discharge note.	First listed inpatient discharge diagnosis of depression (311) in administrative files.	Proportion with first listed discharge diagnosis of depression with ICD-9 311 (PPV ₁) or depression- related diagnosis (ICD-9: 296.1, 296.4, 296.6, 300.4, 309, 311) in medical record discharge note.	PPV ₁ = 58.3% (91 of 156) PPV ₂ = 93.6% (146 of 156)
Smith et al., 2009	Adult (19-64 years) work disabled Medicaid beneficiaries with depression claims	Self-rated depressed mood item.	≥1 Medicaid claims for ICD-9: 296.2, 296.3, or 311 during 12 months prior to	Proportion of beneficiaries with depression claims who report depressed mood (PPV ₁). Also the corresponding proportion	PPV ₁ = 87.9% (175 of 199) PPV ₂ = 91.1% (153



	who responded to an employment and disability survey, 65.3% female, 87.4% white, 19.1% married, mean age: 43.4 years, 2003 or 2005		survey	among subgroup with adequately treated depression (ATHF score of 3 or 4) (PPV ₂).	of 168)
Solberg et al., 2006	Adults (>19 years) from a large private health plan (N=135,842). 5 random samples (N=20) meeting different algorithms for depression, 2000.	Medical record diagnosis of depression.	D1. <u>Prevalent</u> <u>depression</u> : ≥ 2 outpatient or ≥ 1 inpatient ICD-9 296.2, 296.3, 300.4, 311 in 12 months D2. <u>Antidepressant</u> (<u>AD</u>) treatment (<u>A and B and C</u>): A. 6-months no AD prior to new AD fill B. ≥ 1 depression code 3 months before or after AD. C. ≥ 1 more depression code or AD fill in 1.5 years before or after new AD	Proportion of selected plan members with D1 claims- based algorithm found to have depression diagnosis in medical record (PPV ₁) and proportion with D2 algorithm found in medical record to have started a new antidepressant treatment episode for depression (PPV ₂)	PPV ₁ = 98.8% (79 of 80) PPV ₂ = 65.0% (13 of 20) and 90.0% (18 of 20)
Solberg et al., 2003	Adult (≥18 years) outpatients (n=274) from 9 staff model primary care clinics in a metropolitan area with depression code, no antidepressant prescription 6 months, no diagnosis bipolar, schizophrenia, or alcoholism past year, 74.1% female, 91.6% white, 60.6% married, mean age: 52.4 years, 1998- 1999.	1. Depressive symptoms (CES-D \geq 6) (PPV ₁) 2. Self- reported current depression (PPV ₂) 3. Reported told at index visit has depression (PPV ₃) 4. Chart audit	ICD-9 311 (only code available for depression) code, no other 311 codes in previous 6 months, no AP fills in previous 6 months.	Proportion of patients meeting administrative code definition of depression who met each of the four outcomes (CES- D score, self-reported current depression, told by health care professional at visit had depression, and chart audit with depression diagnosis or treatment at index visit.	PPV ₁ =71.5% (196 of 274) PPV ₂ =71.5% (196 of 274) PPV ₃ =54.6% (149 of 274) PPV ₄ =94.9% (260 of 274)



McCusker et al., 2008	Emergently admitted medical inpatients ages ≥65 years (n=185) from 2 university-affiliated acute care hospitals in Montreal, over sampled for depression, excluding patients with cognitive impairment, 64.3% female, mean age 80.0 years, 67.6% disabled, 48.1% lives alone	depression diagnosis or treatment (PPV ₄) DIS assessed major depressive disorder of > 6 months or < 6 months duration.	During 12 months after index inpatient admission, 3 Algorithms: 1. Outpatient claim for physicians services for ICD- 9: 311, 300.4. 2. Antidepressant prescription. 3. Psychiatrist visit	Proportion with DIS assessed major depression > 6 months (Sens ₁) and < 6months (Sens ₂) duration with outpatient claims for depression during 12 months before or after index inpatient admission	Sens ₁ = 15.8% (9 of 57) PPV ₁ =56.3% (9 of 16) (Kappa ₁ =0.129) Sens ₂ = 52.6% (30 of 57) PPV ₂ =54.5% (Kappa ₂ =0.334) Sens ₃ =17.5% (10 of 57) PPV ₃ =62.5% (10 of 16) (Kappa ₃ =0.161) Prevalence: 30.8%
Kahn et al., 2008	Adult (≥18 years) Medicaid behavioral health managed care organization enrollees (n=249) with a diagnosed mental disorder and diabetes, 63.1% female, mean age 52.2 years, 2006.	PHQ-9 assessed depression by mail survey	Depression (ICD- 9 code 311) in the encounter data.	Operating characteristics of depression diagnosis code in encounter data (screen) in relation to PHQ-9 score ≥ 10	Sens=51.1% (71 of 139) Spec=67.3% (74 of 110) PPV=66.4% (71 of 107) NPV=52.1% (74 of 142) Prevalence: 55.8% (Kappa: 0.178)
Katon et al., 2006	Adolescent (11-17 years) primary care outpatients (n=769) with history of asthma treatment, excluded patients treated for bipolar	C-DISC assessed DSM- IV major depression or dysthymia; C- DISC assessed DSM-IV panic,	≥1 ICD-9: 296.2,296.3, 298.0, 300.4, 309.0, 309.1, 309.28, or 311 "depressive disorder	Proportion of patients with utilization claim for depression who met C-DISC criteria for a depressive disorder (PPV ₁); Proportion of patients with utilization claim for depression who	Sens ₁ =48.3% (29 of 60) PPV ₁ =31.5% (29 of 92)



	disorder or schizophrenia; depressed subsample 64% female, 2004-2005	generalized anxiety, social phobia, agoraphobia, or separation anxiety disorder	diagnosis" in utilization record during 12 months before C-DISC	met C-DISC depressive or anxiety disorder criteria (PPV ₂)	Prevalence ₁ =7.7% (Kappa ₁ = 0.317) PPV ₂ = 39.4% (41 of 104) Sens ₂ =36.6% (41 of 112)
					Prevalence ₂ =14.6% (Kappa ₂ =0.278)
Spettell et al. 2003	Primary care physician panel members (≥12 years) from a large MCO (n=892,786) selected for meeting algorithm 1 or 2 and members matched by age, gender, and number of comorbid conditions not meeting algorithms, 59.6% female, median age algorithm positive: 44 years, median age algorithm negative: 41 years, 1997.	Physician diagnosis of depression in medical record during the 12 month study period.	Algorithm 1. In 12 months, ≥2: A. First listed ICD-9 296.2, 296.3, 300.4, 311 B. AD fill Algorithm 2. In 12 months, A. above and ≥1 of A. or B. Bipolar disorder, depressive psychosis or lithium fills excluded. A or B above during 12 months before study period also excluded.	Sensitivity (Sens), Specificity (Spec), positive predictive value (PPV), and negative predictive value (NPV) determined for a sample of 465 patients for algorithm 1 and 2 with physician diagnosis of depression in medical record as the criterion standard.	Sens ₁ = 95.0% (115 of 121) Spec ₁ = 65.4% (225 of 344) PPV ₁ = 49.1% (115 of 234) NPV ₁ = 97.4% (225 of 231) (Kappa ₁ =0.464) Sens ₂ = 52.1% (63 of 121) Spec ₂ = 88.4% (304 of 344) PPV ₂ = 60.6% (63 of 103) NPV ₂ = 84.0% (304 of 362) (Kappa ₂ =0.425) Prevalence: 26.0%
Katon et al., 2004	Adult HMO patients (n=4385) with treatment of diabetes mellitus and major depression as assessed by PHQ-9, 60% female, mean	PHQ-9 positive screen for current major depression.	In 12 months before assessment : 1. ICD-9 code for ≥1 depression: 296.2,296.3, 298.0, 300.4,	Proportion of patients with PHQ-9 major depression disorder who were detected by ICD-9 code (S ₁) or AD prescription (S2).	Sens (S ₁) = 36.3% (190 of 524) Sens (S ₂) = 42.9% (225 of 524) Prevalence: 11.9%



age 59 years,	309.0, 309.1,	
excluded patients without diabetes,	309.28, or 311*	
with cognitive impairment, too ill	AND	
to participate, or language/hearing problem.	2. Antidepressant (AD) prescription.	
problem.	(AD) prescription.	

I. TOPIC EXPERT CONSULTATION

The goal of identifying depression from claims data is constrained by incomplete clinical detection. In the community, just over one-half of adults with major depression receive treatment for their symptoms during the course of 1 year (32, 35). In clinical samples as well, primary care physicians recognize as depressed only about one half of all their depressed patients who present for treatment (36). The detection rate may be even lower in some clinical subgroups including patients with medical morbidity (30%) (29) and Veterans (40%) (37). Deficiencies in the clinical diagnosis of depression impose a ceiling on the performance of claims based efforts to detect depression. One countervailing consideration is that clinically detected or treated depression may be more severe than undetected or untreated depression (32, 38). Screening initiatives (39) and other efforts to improve the detection and management of depression in primary care practice (40) may have an incidental salutary effect on the validity of electronic health record based detection of depression.

Beyond problems with clinical detection, psychosocial considerations may further limit the accuracy of claims for depression. Concern over protecting patient confidentiality may lead some physicians to deliberately substitute alternative non-mental disorder diagnoses on claims and encounter forms for their patients receiving treatment for depression (41). Under reporting of depression may occur in a conscious effort by the clinician to reduce social stigma that might otherwise have adverse occupational or legal consequences for the patient (42, 43).

Constraints on clinical diagnosis may help to explain the range of sensitivities in the reported studies. When independent patient assessments of depression that capture clinically undetected depression serve as the criterion standard, sensitivities are low, ranging from 12.5% (16) to 51.1% (18). When medical record diagnoses are treated as the criterion standard, which excludes clinically undetected or unreported depression, the sensitivity of claims based algorithms reaches as high as 95.0% (1). These differences are also reflected in the kappa values.

Studies with independent assessments of depression (10-12, 15-18), rather than medical record diagnoses (1, 13, 14, 19) provide more credible evidence of algorithm validity. In this regard, the most rigorous studies involve using a structured diagnostic assessment (10, 16) followed by those that use a depression disorder screening instrument (18) as the criterion standard. Unfortunately, low chance corrected agreement of these studies precludes the algorithms in these studies from being recommended for general case identification, though the operating characteristics may be adequate for specific applications.



One strategy for broadening claims based algorithms and capturing more patients with depression is to include pharmacy records indicating an antidepressant prescription fill (1, 11, 13, 14). Although this strategy tends to capture more depressed patients thereby increasing sensitivity, it comes at the expense of a larger number of false positive cases thereby lowering specificity and positive predictive value (1, 11, 13). These trade-offs arise from the large proportion of antidepressant prescriptions that are for psychiatric and general medical conditions other than depression. In one national study, only 27% of individuals treated with antidepressants reported receiving them for depression (44).

Positive predictive value depends upon the prevalence of the underlying condition. Many of the studies were performed in highly enriched samples with base prevalence of depression that greatly exceeds primary care populations. Without careful attention to the prevalence of depression in the base population, the positive predictive values may appear deceptively high. While this may be obvious in samples that are limited only to patients with depression (13, 17), it also distorts estimates in samples that are enriched by oversampling of depressed patients. In one study, for example, the base prevalence of depression in a sample selected for treatment of a mental disorder (28.5%) (18) was associated with a PPV of 66.4%. In another study which involved matching non-depressed patients to depressed patients, the base prevalence of depression from the resulting study sample was 26.0% and the PPV ranged from 49.1% to 60.6% depending upon the algorithm (1). Substantially lower positive predictive values would be expected when using databases populated by general primary care patients. The prevalence of major depression is approximately 5%–10% in primary care patients and 10%–14% in medical inpatients (45).

VI. SUMMARY AND CONCLUSIONS

A. RECOMMENDATIONS FOR ALGORITHMS

No single algorithm consistently demonstrated sufficiently strong operating characteristics in relation to independent assessments of depression to be recommended for general use. The proportion of people identified by claims-based measures that met independent criteria for depression varied with the algorithm and patient population. In a study of adolescent outpatients with asthma, 31.5% of adolescents identified with one algorithm met formal criteria for major depressive disorder or dysthymia (prevalence 7.5%) (10). In a study of elderly adult inpatients over-sampled for clinical depression diagnoses (prevalence 30.8%), 62.5% of patients identified with another algorithm met criteria for major depression (16). For some purposes, such as first stage screening for participation in clinical depression research, these positive predictive values may be sufficient. For other purposes, such as monitoring clinical relapse in individual patients, these positive predictive values may not be acceptable.

The algorithms also varied in the percentage of people with independently confirmed depressive disorders that they successfully identified as depressed. The algorithms with the highest sensitivity detected approximately one-half of patients who were determined to be depressed by independent assessment (10, 18). Here as well, these performance characteristics may be adequate for some clinical and research purposes, but not for others.

Electronic health records provide sufficient information to identify with a moderate level of agreement adult primary care patients who have been diagnosed with depression. In this regard, the algorithm with the strongest psychometric properties required over the course of 12 months at least 2 first listed codes for depression (296.2, 296.3, 300.4, 311) as well as an antidepressant prescription claim (kappa: 0.464)



(1). This algorithm is recommended for the identification of clinically diagnosed depression on the basis of claims data. However, its operating characteristics for identifying independently assessed depression are not known.

B. SUGGESTIONS FOR FUTURE RESEARCH BASED ON EVIDENCE GAPS

Depression is an established adverse effect of several medications (46, 47). A well validated algorithm to identify depression from electronic health data would be valuable for post-marketing evaluation of drug safety.

Research priorities include:

- 1. Replication of an evaluation of the most promising depression algorithm (1) for identifying clinically diagnosed depression in a fee for service or other primary care setting.
- 2. Assessment of this depression algorithm in relation to an independent patient depression assessment standard. In view of the low agreement between depression codes and independently assessed depression in previous studies, future research should be conducted in general medical or specialty mental health settings that routinely screen for depression. In this context, it should be noted that even within specialty mental health settings correlations are modest between clinical diagnoses and structured diagnostic interviews (48). Some health systems have integrated measures of depression severity, such as the PHQ-9, within electronic health records (49). If implemented on a large scale, this would provide opportunities for validating algorithms based on traditional service and prescription claims and provide an alternative method of case ascertainment.
- 3. Because of increasing concern over depression-related adverse events in youth (50, 51) and the paucity of information that is currently available for this age group (10), priority should be given to developing administrative data base algorithms to identify depression in children and adolescents.



VII. REFERENCES

- Spettell CM, Wall TC, Allison J, et al. Identifying physician-recognized depression from administrative data: Consequences for quality measurement. *Health Serv Res.* 2003; 38: 1081-1102.
- 2. Landis JR, Koch GG: The measurement of observer agreement for categorical data. *Biometrics*. 1977; 33: 159-174.
- 3. *Screening for Depression in Adults*, December 2009. U.S. Preventive Services Task Force. <u>http://www.uspreventiveservicestaskforce.org/uspstf/uspsaddepr.htm</u>. Accessed 6/4/2010.
- 4. Williams SB, O'Connor EA, Eder M, Whitlock EP. Screening for child and adolescent depression in primary care settings: A systematic evidence review for the US Preventive Services Task Force. *Pediatrics*. 2009; 123(4): e716-35.
- 5. West SL, Strom BL, Poole C. Validity of pharmacoepidemiologic drug and diagnosis data. In: Strom BL, ed. *Pharmacoepidemiology*. Chichester: John Wiley; 2005: 709-766.
- FDA Designated Medical Events (DME). Listing of DMEs is adapted from "Safety Reporting Requirements for Human Drug and Biological Products; Proposed Rule" at <u>http://www.fda.gov/OHRMS/DOCKETS/98fr/03-5204.pdf</u>. Accessed 6/4/2010.
- 7. The Observational Medical Outcomes Partnership (OMOP). Health Outcomes of Interest. Available at: <u>http://omop.fnih.org/HOI</u>. Accessed 6/4/2010.
- Jarrett N, Lux L, West S. Systematic evaluation of health outcome of interest definitions in observational studies and clinical definitions for the Observational Medical Outcomes Partnership: angioedema: report. Available at: <u>http://omop.fnih.org/sites/default/files/RTI%20Angioedema%20Final%20Report%20110509.pdf</u> . Accessed 6/7/10.
- Kachroo S, Jones N, Reynolds MW. Systematic literature review for evaluation of angioedema. Final report prepared for the Foundation of the National Institutes of Health via the Observational Medical Outcomes Partnership. Available at: <u>http://omop.fnih.org/sites/default/files/UBC-</u> <u>OMOP%20Systematic%20Lit%20Review%20Angioedema%20Final%20Report%209-11-2009.pdf</u>. Accessed 6/7/10.
- 10. Katon WJ, Richardson L, Russo J, Lozano P, McCauley E. Quality of mental health care for youth with asthma and comorbid anxiety and depression. *Med Care*. 2006; 44: 1064-1072.
- 11. Katon WJ, Simon G, Russo J, et al. Quality of depression care in a population-based sample of patients with diabetes and major depression. *Med Care*. 2004; 42: 1222-1229.
- 12. Frayne SM, Sharkansky EJ, Wang D, Berlowitz DR, Rosen CS. Using administrative data to identify mental illness: What approach is best? *Am J Med Quality*. 2010; 25(1): 42–50.
- 13. Solberg LI, Engebretson KI, Sperl-Hillen JM, Hroscikoski MC, O'Connor PJ. Are claims data accurate enough to identify patients for performance measures or quality improvement? The case of diabetes, heart disease, and depression. *Am J Med Qual*. 2006; 21: 238-245.



- 14. Kramer TL: How well do automated performance measures assess guideline adherence for newonset depression in the Veterans Health Administration? *Joint Comm J Quality & Safety.* 2003; 9: 479-489.
- 15. Smith EG, Henry AD, Zhang J, Hooven F, Banks SM. Antidepressant adequacy and work status among Medicaid enrollees with disabilities: A restriction-based, propensity score-adjusted analysis. *Community Ment Health J*. 2009; 45: 333-340.
- McCusker J, Cole M, Latimer E, et al. Recognition of depression in older medical inpatients discharged to ambulatory care settings: A longitudinal study. *Gen Hosp Psychiatry*. 2008; 30: 245-251.
- 17. Solberg LI, Fischer LR, Rush WA, Wei F. When depression is the diagnosis, what happens to patients and are they satisfied? *Am J Manag Care*. 2003; 9: 131-140.
- 18. Kahn LS, Fox CH, McIntyre RS, Tumiel-Berhalter L, Berdine DE, Lyle H. Assessing the prevalence of depression among individuals with diabetes in a Medicaid managed-care program. *Int J Psychiatry Med*. 2008; 38: 13-29.
- 19. Rawson NS, Malcolm E, D'Arcy C. Reliability of the recording of schizophrenia and depressive disorder in the Saskatchewan health care datafiles. *Soc Psychiatry Psychiatr Epidemiol*. 1997; 32: 191-199.
- 20. Radloff LS. The CES-D scale: A self report depression scale for research in the general population. *Applied Psychological Measurement*. 1977: 1, 385-401.
- 21. Kroenke K, Spitzer RL, Williams JB. The PHQ-9: validity of a brief depression severity measure. *J Gen Intern Med.* 2001; 16: 606-613.
- 22. Spitzer RL, Kroenke K, Williams JB. Validation and utility of a self-report version of PRIME-MD: the PHQ primary care study. Primary Care Evaluation of Mental Disorders. Patient Health Questionnaire. *JAMA*. 1999 Nov 10; 282(18): 1737-1744.
- Liu CF, Campbell DG, Chaney EF, Li YF, McDonell M, Fihn M. Depression diagnosis and antidepressant treatment among depressed VA primary care patients. *Adm Policy Ment Health*. 2006; 33: 331-341.
- 24. Nuyen J, Volkers AC, Nerhaak PF, Schellevis FG, Groenewegen PP, Van den Bos GA. Accuracy of diagnosis depression in primary care: the impact of chronic somatic and psychiatric co-morbidity. *Psychol Med.* 2005; 25: 1185-1195.
- 25. Pfaff JJ, Almeida OP. A cross-sectional analysis of factors that influence the detection of depression in older primary care patients. *Austr New Z J Psychiatry*. 2005; 39: 262-265.
- 26. Harman JS, Schulberg HC, Mulsant BH, Reynolds CF. The effect of patient and visit characteristics on diagnosis of depression in primary care. *J Fam Pract.* 2001; 50: 1068.
- Tiemans BG, VonKorff M, Lin EH. Diagnosis of depression by primary care physicians versus a structured diagnostic interview: Understanding discordance. *Gen Hosp Psychiatry*. 1999; 21: 87-96.
- 28. Rost K, Nutting P, Smith J, Coyne JC, Cooper-Patrick L, Rubenstein L. The role of competing demands in the treatment provided primary care patients with major depression. *Arch Fam Med.* 2000; 9: 150-154.



- 29. Tylee AT, Freeling P, Kerry S. Why do general practitioners recognize major depression in one woman patient yet miss it in another? *Br J Gen Practice*. 1993; 43(373): 327–30.
- 30. Carrie FT, Reynolds CF, Cleary PD. Quality of depression care for people with coincident chronic medical conditions. *General Hosp Psychiatry*. 2008; 30: 528-535.
- 31. Olfson M, Marcus SC, Druss BG, Tanelian T, Elinson L, Pincus HA. National trends in the outpatient treatment of depression. *JAMA*. 2002; 287: 203-209.
- 32. Kessler RC, Berglund P, Demler O, Jin R, et al. The Epidemiology of Major Depressive Disorder: Results from the National Comorbidity Survey Replication (NCS-R). *JAMA*. 2003; 289: 3095-3105.
- 33. Olfson M, Marcus SC, Druss BG, Tanelian T, Elinson L, Pincus HA. National trends in the outpatient treatment of depression. *JAMA*. 2002; 287: 203-209.
- 34. Marcus SC, Olfson M. National trends in the treatment for depression from 1998 to 2007. *Arch Gen Psychiatry*. 2010; 67(12): 1265-1273.
- 35. Hasin DS, Goodwin RD, Stinson FS, Grant BF. Epidemiology of major depressive disorder: Results from the National Epidemiologic Survey on Alcoholism and Related Conditions. *Arch Gen Psychiatry*. 2005; 62: 1097-1106.
- Wells KB, Hays RD, Burnam A, Rogers W, Greenfield S, Ware JE. Detection of depressive disorder for patients receiving prepaid or fee-for-service care: results from the Medical Outcomes Study. *JAMA*. 1989; 262(23): 3298–302.
- 37. Liu CF, Campbell DG, Chaney EF, Li YF, McDonell M. Depression diagnosis and antidepressant treatment among depressed VA primary care patients. *Adm Policy Ment Health & Ment Health Serv Res.* 2006; 33: 331–341.
- 38. Valenstein M, Ritsema T, Green L, Blow FC, et al. Targeting quality improvement activities for depression: implications of using administrative data. *J Fam Practice*. 2000; 49(8): 721–8.
- 39. Valenstein M, Vijan S, Zeber JE, Boehm K, Buttar A. The cost-utility of screening for depression in primary care. *Ann Intern Med.* 2001; 134: 345-360.
- Wells KB, Sherbourne C, Shoenbaum M, Duan N, et al. Impact of disseminating quality improvement programs for depression in managed primary care: a randomized controlled trial. *JAMA*. 2000; 283(2): 212-220.
- 41. Rost K, Smith R, Matthews DB, Guise B. The deliberate misdiagnosis of major depression in primary care. Arch Fam Med. 1994; 3(4): 333–7.
- 42. Hoyt DR, Conger RD, Valde JG, Weihs K. Psychological distress and help seeking in rural America. *Am J Commun Psychology*. 1997; 25(4): 449–70.
- Hirschfeld RM, Keller MB, Panico S, Arons BS, et al. The National Depressive and Manic-Depressive Association consensus statement on the undertreatment of depression. JAMA. 1997; 277(4): 333–40.
- 44. Olfson M, Marcus SC. National patterns in antidepressant medication treatment. Arch Gen Psychiatry. 2009; 66: 848-856.
- 45. Kayton W, Schulberg H. Epidemiology of depression in primary care. *Gen Hosp Psychiatry*. 1992; 14: 237-247.



- 46. Patten SB, Barbui C. Drug-induced depression: a systematic review to inform clinical practice. *Psychother Psychosom*. 2004; 73: 207-215.
- 47. Hull PR, D'Arcy C. Isotretinoin use and subsequent depression and suicide: Presenting the evidence. *Am J Clin Derm.* 2003; 4: 493-505.
- 48. Shear MK, Greeno C, Kang J, et al. Diagnosis of nonpsychotic patients in community clinics. *Am J Psychiatry*. 2000; 157: 581-587.
- 49. Klein EW, Hunt JS, LeBlanc BH. Depression screening interfaced with an electronic health record: A feasibility study in a Primary care clinic using optical mark reader technology. *Prim Care Companion J Clin Psychiatry*. 2006; 8(6): 324-328.
- 50. Hammad TA, Langhren T, Racoosin J. Suicidality in pediatric patients treated with antidepressant drugs. *Arch Gen Psychiatry*. 2006; 63: 332-339.
- Stone M, Laughren T, Jones ML, et al. Risk of suicidality in clinical trials of antidepressants in adults: analysis of proprietary data submitted to US Food and Drug Administration. *BMJ*. 2009; 339: b2880.



VIII. APPENDICES

A. APPENDIX A: ABSTRACTS OF STUDIES INCLUDED IN EVIDENCE TABLE

Frayne SM, Sharkansky EJ, Wang D, Berlowitz DR, Rosen CS. Using administrative data to identify mental illness: What approach is best? *Am J Med Quality.* 2010; 25(1): 42–50.

ABSTRACT: The authors estimated the validity of algorithms for identification of mental health conditions (MHCs) in administrative data for the 133,068 diabetic patients who used Veterans Health Administration (VHA) nationally in 1998 and responded to the 1999 Large Health Survey of Veteran Enrollees. They compared various algorithms for identification of MHCs from *International Classification of Diseases, 9th Revision* (ICD-9) codes with self-reported depression, posttraumatic stress disorder, or schizophrenia from the survey. (Positive predictive value (PPV) and negative predictive value (NPV) for identification of MHC varied by algorithm (0.65-0.86, 0.68-0.77, respectively). PPV was optimized by requiring ≥2 instances of MHC ICD-9 codes or by only accepting codes from mental health visits. NPV was optimized by supplementing VHA data with Medicare data. Findings inform efforts to identify MHC in quality improvement programs that assess health care disparities. When using administrative data in mental health studies, researchers should consider the nature of their research question in choosing algorithms for MHC identification.

Kahn LS, Fox CH, McIntyre RS, Tumiel-Berhalter L, Berdine DE, Lyle H. Assessing the prevalence of depression among individuals with diabetes in a Medicaid managed-care program. *Int J Psychiatry Med*. 2008; 38: 13-29.

OBJECTIVES: To determine the prevalence of self-reported depression symptoms among diabetic individuals enrolled in Gold Choice, a Medicaid managed care organization specifically for people with mental health and/or substance abuse diagnoses; and to assess the sensitivity and specificity of individuals' self-report with encounter data. METHODS: The 9-item depression scale of the Patient Health Questionnaire (PHQ-9) was mailed to 454 Gold Choice members in Western New York diagnosed with diabetes; and 249 completed PHQ-9 forms were returned (55% response rate). The PHQ-9 forms were compared to primary care encounter data to determine whether the respondents had been diagnosed with depression. Descriptive and inferential statistical analysis was undertaken. RESULTS: The majority (56%) of individuals in the sample screened positive for depression (PHQ-9 > or = 10), and half (49%) did not have evidence of a diagnosis in their encounter data. The percentage of those diagnosed with depression rose with increasing PHQ-9 severity levels, with 63% of individuals with the most severe depression (PHQ-9 > or = 20) having a diagnosis. This trend was statistically significant, confirmed by independent sample t-tests and chi-square tests. The sensitivity of the PHQ-9 was moderate (66%), as was the specificity (52%). CONCLUSIONS: The results of this study suggest that depressive disorders may be under-recognized and under-treated amongst individuals with diabetes in the primary care setting. Half (51%) of those with PHQ-9 scores > or = 10 had depression diagnoses, suggesting poor compliance rates and/or a need for therapy reassessment

Katon WJ, Richardson L, Russo J, Lozano P, McCauley E. Quality of mental health care for youth with asthma and comorbid anxiety and depression. *Med Care*. 2006; 44: 1064-1072.

OBJECTIVES: Youth with asthma have a high rate of anxiety and depressive disorders, and these comorbid disorders are associated with increased asthma symptom burden and functional impairment. This study examined the rates and predictors of recognition of anxiety and depressive disorders among youth (ages 11 to 17) with asthma who are seen in primary care settings as well as



the guality of mental health care provided to those with comorbid anxiety and depression over a 12month period. METHODS: This study used automated utilization and pharmacy data from a health maintenance organization to describe the rate of recognition of Diagnostic and Statistical Manual of Mental Disorders, edition IV, anxiety and depressive disorders and the quality of mental health care provided for the 17% of youth with asthma and comorbid anxiety and/or depression during the 12month period prior to diagnosis. Psychiatric diagnoses were based on a telephone version of the Computerized Diagnostic Interview Schedule for Children (Version 4.0). RESULTS: Approximately 35% of youth with 1 or more anxiety and depressive disorders and 43% of those with major depression were recognized by the medical system during a 12-month period. Greater functional impairment (odds ratio [OR] 3.32, 95% confidence interval [CI] 1.25-8.79), higher severity on parentrated anxiety and depressive symptoms (OR 2.49, 95% CI 1.04-6.00), and a greater number of primary care visits (OR 1.26, 95% CI 1.10-1.44) were associated with significantly higher recognition rates while having Medicaid or Washington state medical insurance was associated with lower rates of recognition (OR 0.27, 95% CI 0.08-0.92). Only approximately 1 in 5 youths with comorbid major depression received an adequate dosage and duration of antidepressant medication, and only 1 in 6 received a minimally adequate number of psychotherapy sessions (> or =4 visits). CONCLUSION: Rates of recognition of comorbid anxiety and depressive disorders are low in youth with asthma and few youth with asthma and comorbid anxiety and depression receive guideline-level mental health treatment.

Katon WJ, Simon G, Russo J, et al. Quality of depression care in a population-based sample of patients with diabetes and major depression. *Med Care*. 2004; 42: 1222-1229.

OBJECTIVES: Major depression occurs in approximately 11% to 15% of patients with diabetes and is associated with poor glycemic control and adverse medical outcomes. This study examined the rates and predictors of recognition of depression among primary care patients with diabetes and comorbid major depression and the quality of depression care provided during a 12-month period. METHODS: This study used automated utilization, pharmacy, and laboratory data from a health maintenance organization to describe the rate of recognition of depression and quality of care provided for patients with major depression and diabetes in the 12-month period before diagnosis. Major depression was diagnosed based on the Patient Health Questionnaire (PHQ-9) that was included in a mail survey sent to 9,063 patients on the Group Health diabetes registry from 9 primary care clinics. RESULTS: Approximately 51% of patients with major depression and diabetes were recognized as depressed by the health care system. Women were more likely to be recognized (odds ratio [OR] 1.58, 95% confidence interval [Cl 1.26-1.97]), as were those with dysthymia (OR 3.44, 95% CI 2.08-5.72), panic attacks (OR 1.55, 95% CI 1.19-2.19), patients with more than 7 primary care visits (OR 1.42, 95% CI 1.06-1.91) and patients reporting poor health (OR 1.62, 95% CI 1.04-2.53). Of the 51% of patients with major depression who were recognized, 43% received 1 or more antidepressant prescriptions but only 6.7% received 4 or more psychotherapy sessions during a 12-month period. DISCUSSION: There were large gaps in both recognition and quality of depression care provided to patients with major depression and diabetes within a health maintenance organization system.

Kramer TL, Miller TL, Phillips SD, Robbins JM. Quality of mental health care for depressed adolescents. *Am J Med Qual*. 2008; 23: 96-104.

Understanding the quality of routine care for adolescent depression constitutes the initial step in designing and implementing improvement strategies. This study assessed depression detection and type and duration of services for adolescents in mental health care settings. Medical record



diagnosis and standardized research interview results were compared for youth seeking mental health treatment. The majority of depressed adolescents received care consistent with guidelines and evidence. However, only 51% received appropriate medication; fewer than half received at least 8 sessions of outpatient care or follow-up after hospitalization. Males received significantly fewer components of quality care compared with females. Depression diagnoses in routine care may be facilitated by using structured interviews or questionnaires. Quality monitoring and improvement initiatives may also increase rates of care components that are consistent with guidelines and evidence. Methods tested in this study may facilitate the evaluation of quality improvement initiatives for adolescent depression or other mental health disorders.

McCusker J, Cole M, Latimer E, et al. Recognition of depression in older medical inpatients discharged to ambulatory care settings: A longitudinal study. *Gen Hosp Psychiatry*. 2008; 30: 245-251.

OBJECTIVE: This study aimed to examine the recognition of depression in older medical inpatients by nonpsychiatric physicians over a 2-year period. METHODS: A cohort of medical inpatients aged 65 and above was recruited at two university-affiliated hospitals, with oversampling of depressed patients. Participants were assessed with research diagnoses of major or minor depression (DSM-IV) at admission and at 3, 6 and 12 months. Indicators of recognition during the 12 months before and the 12 months after admission, derived from administrative databases, included the following: depression diagnosis, antidepressant prescription and psychiatric referral. Multiple logistic regression analyses were used to identify factors associated with recognition. RESULTS: Among 185 patients with at least one research diagnosis of depression during the study, recognition rates ranged up to 56% during the 12 months before admission among patients with major depression lasting at least 6 months and up to 61% during the 12 months after admission among patients with persistent major depression. In both study periods, a greater number of physician visits and prescription of a psychotropic medication (non-antidepressant) were independently associated with recognition. CONCLUSIONS: A longitudinal approach to measuring recognition of late-life depression in ambulatory care settings indicates that persistent major depression is more likely to be recognized than previously reported.

Rawson NS, Malcolm E, D'Arcy C. Reliability of the recording of schizophrenia and depressive disorder in the Saskatchewan health care datafiles. Soc Psychiatry Psychiatr Epidemiol. 1997; 32: 191-199. Administrative data have long been used in psychiatric epidemiology and outcomes evaluation. This article examines the reliability of the recording of schizophrenia and depressive disorder in three Saskatchewan administrative health care utilization datafiles. Due to their comprehensive nature, these datafiles have been used in a wide range of epidemiologic studies. Close agreement was found between hospital computer data and patients' charts for personal and demographic factors (> or = 94.7%). Diagnostic concordance between computerized hospital data and medical charts was very good for schizophrenia (94%) but poor for depressive disorder (58%). Appropriate physician services were identified for 60% and 72% of hospital discharges for schizophrenia and depressive disorder, respectively, and exact diagnostic agreement between hospital and physician datafiles was 62% for schizophrenia and 66% for depressive disorder. Appropriate provincial mental health branch services were found for 83% and 38% of hospital discharges for schizophrenia and depressive disorder, respectively; exact diagnostic concordance between these datafiles was 75% for schizophrenia and 0% for depressive disorder. A significant number of patients with major or neurotic depression appeared to be wrongly coded as having depressive disorder in the hospital file. The differences in diagnostic agreement may also be partly a function of how the two conditions are differentially treated in the health system. These findings suggest that more specific and severe



psychiatric diagnoses are likely to be recorded accurately and consistently in the Saskatchewan datafiles. However, disorders with multiple manifestations or those for which there are several possible codes should be examined with caution and ways sought to validate them. Attention should also be paid to which service sectors are involved in the treatment of specific disorders.

Smith EG, Henry AD, Zhang J, Hooven F, Banks SM. Antidepressant adequacy and work status among Medicaid enrollees with disabilities: A restriction-based, propensity score-adjusted analysis. *Community Ment Health J*. 2009; 45: 333-340.

Abstract: This cross-sectional study of adult survey respondents with disability and depression (n = 199) enrolled in Massachusetts' Medicaid program examined the association of adequately or inadequately prescribed antidepressant treatment and self-reported work status using conditional logistic regression, controlling for age, gender, race, marital status, education, receipt of SSI/SSDI, self-reported disabling condition, and health status. Confounding by severity was addressed by two methods: restriction of our sample and subsequent stratification by propensity score. Individuals receiving adequate antidepressant treatment, both in analyses in which restriction was used to limit confounding (OR = 3.45, 95% CI = 1.15-10.32, P < .03), and in analyses which combined restriction with adjustment by propensity score stratification (OR = 3.04, 95% CI = 1.01-9.62, P < .05). Among this sample of Medicaid enrollees with disability and depression, those receiving adequate antidepressant treatment were significantly more likely to report working.

Solberg LI, Engebretson KI, Sperl-Hillen JM, Hroscikoski MC, O'Connor PJ. Are claims data accurate enough to identify patients for performance measures or quality improvement? The case of diabetes, heart disease, and depression. *Am J Med Qual*. 2006; 21: 238-245.

The objective of this study was to demonstrate a method to accurately identify patients with specific conditions from claims data for care improvement or performance measurement. In an iterative process of trial case definitions followed by review of repeated random samples of 10 to 20 cases for diabetes, heart disease, or newly treated depression, a final identification algorithm was created from claims files of health plan members. A final sample was used to calculate the positive predictive value (PPV). Each condition had unacceptably low PPVs (0.20, 0.60, and 0.65) when cases were identified on the basis of only 1 International Classification of Diseases, ninth revision, code per year. Requiring 2 outpatient codes or 1 inpatient code within 12 months (plus consideration of medication data for diabetes and extra criteria for depression) resulted in PPVs of 0.97, 0.95, and 0.95. This approach is feasible and necessary for those wanting to use administrative data for case identification for performance measurement or quality improvement.

Solberg LI, Fischer LR, Rush WA, Wei F. When depression is the diagnosis, what happens to patients and are they satisfied? *Am J Manag Care*. 2003; 9: 131-140.

OBJECTIVES: To understand the process, outcomes, and patient satisfaction of usual primary care for patients given a diagnostic code for depression. STUDY DESIGN: Health plan data were used to identify patients with a diagnostic code for depression (and no such diagnosis in the preceding 6 months). Patients were surveyed by mail soon after the coded visit and again 3 months later about the care they had received; their charts were also audited. METHODS: The 274 patients in 9 primary care clinics who responded to both surveys reported on their personal characteristics, depression symptoms and history, the care received in that initial visit, and the follow-up care during the next 3 months. They also reported on their satisfaction with various aspects of that care. RESULTS: These patients were likely to be given antidepressant medications as their main or only treatment. Referral



for mental health therapies was not used often, even though referral is readily available in this setting; other types of self-management recommendations and support were even less frequent. Patient outcomes and levels of satisfaction during a 3-month follow-up period were unimpressive. CONCLUSIONS: To successfully maintain a key role in the care of this important problem for their patients, primary care physicians may need to incorporate a more comprehensive and systematic approach to management that involves other team members and is more satisfying to patients.

Spettell CM, Wall TC, Allison J, et al. Identifying physician-recognized depression from administrative data: Consequences for quality measurement. *Health Serv Res.* 2003; 38: 1081-1102.

BACKGROUND: Multiple factors limit identification of patients with depression from administrative data. However, administrative data drives many guality measurement systems, including the Health Plan Employer Data and Information Set (HEDIS). METHODS: We investigated two algorithms for identification of physician-recognized depression. The study sample was drawn from primary care physician member panels of a large managed care organization. All members were continuously enrolled between January 1 and December 31, 1997. Algorithm 1 required at least two criteria in any combination: (1) an outpatient diagnosis of depression or (2) a pharmacy claim for an antidepressant Algorithm 2 included the same criteria as algorithm 1, but required a diagnosis of depression for all patients. With algorithm 1, we identified the medical records of a stratified, random subset of patients with and without depression (n = 465). We also identified patients of primary care physicians with a minimum of 10 depressed members by algorithm 1 (n = 32,819) and algorithm 2 (n = 6,837). RESULTS: The sensitivity, specificity, and positive predictive values were: Algorithm 1: 95 percent, 65 percent, 49 percent; Algorithm 2: 52 percent, 88 percent, 60 percent. Compared to algorithm 1, profiles from algorithm 2 revealed higher rates of follow-up visits (43 percent, 55 percent) and appropriate antidepressant dosage acutely (82 percent, 90 percent) and chronically (83 percent, 91 percent) (p < 0.05 for all). CONCLUSIONS: Both algorithms had high false positive rates. Denominator construction (algorithm 1 versus 2) contributed significantly to variability in measured quality. Our findings raise concern about interpreting depression quality reports based upon administrative data.



B. APPENDIX B: LIST OF CITATIONS SELECTED FOR FULL-TEXT REVIEW BUT NOT INCLUDED, BY REASONS FOR EXCLUSION

1. Studies Excluded Due to Poorly Defined Algorithms

- Ackermann RT, Rosenman MB, Downs SM, et al. Telephonic case-finding of major depression in a Medicaid chronic disease management program for diabetes and heart failure. *Gen Hosp Psychiatry*. 2005; 27: 338-343.
- Arnow BA, Blasey CM, Lee J, et al. Relationships among depression, chronic pain, chronic disabling pain, and medical costs. *Psychiatr Serv*. 2009; 60: 344-350.
- Aubert RE, Fulop G, Xia F, Thiel M, Maldonato D, Woo C. Evaluation of a depression health management program to improve outcomes in first or recurrent episode depression. *Am J Manag Care*. 2003; 9: 374-380.
- Azoulay L, Blais L, Koren G, LeLorier J, Berard A. Isotretinoin and the risk of depression in patients with acne vulgaris: A case-crossover study. *J Clin Psychiatry*. 2008; 69: 526-532.
- Baillargeon J, Black SA, Contreras S, Grady J, Pulvino J. Anti-depressant prescribing patterns for prison inmates with depressive disorders. *J Affect Disord*. 2001; 63: 225-231.
- Bambauer KZ, Adams AS, Zhang F, et al. Physician alerts to increase antidepressant adherence: Fax or fiction? *Arch Intern Med*. 2006; 166: 498-504.
- Bambauer KZ, Soumerai SB, Adams AS, Mah C, Zhang F, McLaughlin TJ. Does antidepressant adherence have an effect on glycemic control among diabetic antidepressant users? *Int J Psychiatry Med*. 2004; 34: 291-304.
- Bambauer KZ, Soumerai SB, Adams AS, Zhang F, Ross-Degnan D. Provider and patient characteristics associated with antidepressant nonadherence: The impact of provider specialty. *J Clin Psychiatry*. 2007; 68: 867-873. [
- Bayliss EA, Ellis JL, Steiner JF. Seniors' self-reported multimorbidity captured biopsychosocial factors not incorporated into two other data-based morbidity measures. *J Clin Epidemiol*. 2009; 62: 550-7.e1.
- Bayliss EA, Ellis JL, Steiner JF. Barriers to self-management and quality-of-life outcomes in seniors with multimorbidities. *Ann Fam Med.* 2007; 5: 395-402.
- Busch AB, Huskamp HA, Landrum MB. Quality of care in a Medicaid population with bipolar I disorder. *Psychiatr Serv*. 2007; 58: 848-854.
- Callahan CM, Nienaber NA, Hendrie HC, Tierney WM. Depression of elderly outpatients: Primary care physicians' attitudes and practice patterns. *J Gen Intern Med*. 1992; 7: 26-31.



- Carnahan RM, Lund BC, Chrischilles EA, Perry PJ. Consistency of antidepressant and chronic nonpsychiatric medication use in a high-risk clinical population. *Res Social Adm Pharm*. 2008; 4: 367-374.
- Chan D, Cheadle AD, Reiber G, Unutzer J, Chaney EF. Health care utilization and its costs for depressed veterans with and without comorbid PTSD symptoms. *Psychiatr Serv*. 2009; 60: 1612-1617.
- Cohen H W, Gibson G, Alderman MH. Excess risk of myocardial infarction in patients treated with antidepressant medications: Association with use of tricyclic agents (ref art 442316). *Am J Med*. 2000; 108: 2-8.
- Cole JA, Rothman KJ, Cabral HJ, Zhang Y, Farraye FA. Migraine, fibromyalgia, and depression among people with IBS: A prevalence study. *BMC Gastroenterol*. 2006; 6: 26.
- Cooke CE, Hammerash WJ,Jr. Retrospective review of sex differences in the management of dyslipidemia in coronary heart disease: An analysis of patient data from a Maryland-based health maintenance organization. *Clin Ther*. 2006; 28: 591-599.
- Cooper WO, Willy ME, Pont SJ, Ray WA. Increasing use of antidepressants in pregnancy. *Am J Obstet Gynecol*. 2007; 196: 544.e1-544.e5.
- Croghan TW, Melfi CA, Dobrez DG, Kniesner TJ. Effect of mental health specialty care on antidepressant length of therapy. *Med Care*. 1999; 37: AS20-3.
- Crown WH, Hylan TR, Meneades L. Antidepressant selection and use and healthcare expenditures. an empirical approach. *Pharmacoeconomics*. 1998; 13: 435-448.
- Crown WH, Treglia M, Meneades L, White A. Long-term costs of treatment for depression: Impact of drug selection and guideline adherence. *Value Health*. 2001; 4: 295-307.
- Cuffel B, Wamboldt M, Borish L, Kennedy S, Crystal-Peters J. Economic consequences of comorbid depression, anxiety, and allergic rhinitis. *Psychosomatics*. 1999; 40: 491-496.
- Davis J, Fujimoto RY, Juarez DT, Hodges KA, Asam JK. Major depression associated with rates of cardiovascular disease state transitions. *Am J Manag Care*. 2008; 14: 125-128.
- Dewa CS, Goering P, Lin E, Paterson M. Depression-related short-term disability in an employed population. *J Occup Environ Med*. 2002; 44: 628-633.
- Dewa CS, Hoch JS, Goering P, Lin E, Paterson M. Use of antidepressants among Canadian workers receiving depression-related short-term disability benefits. *Psychiatr Serv*. 2003; 54: 724-729.
- Dewa CS, Hoch JS, Lin E, Paterson M, Goering P. Pattern of antidepressant use and duration of depression-related absence from work. *Br J Psychiatry*. 2003; 183: 507-513.



- Duru OK, Gerzoff RB, Selby JV, et al. Identifying risk factors for racial disparities in diabetes outcomes: The translating research into action for diabetes study. *Med Care*. 2009; 47: 700-706.
- Empana JP, Jouven X, Lemaitre RN, et al. Clinical depression and risk of out-of-hospital cardiac arrest. Arch Intern Med. 2006; 166: 195-200.
- Fairman KA, Teitelbaum F, Drevets WC, Engquist G, Kreisman JJ, Norusis MJ. Course of antidepressant treatment with tricyclic versus selective serotonin reuptake inhibitor agents: A comparison in managed care and fee-for-service environments. *Am J Manag Care*. 1997; 3: 453-465.
- Farney RJ, Lugo A, Jensen RL, Walker JM, Cloward TV. Simultaneous use of antidepressant and antihypertensive medications increases likelihood of diagnosis of obstructive sleep apnea syndrome. *Chest*. 2004; 125: 1279-1285.
- Finley PR, Rens HR, Pont JT, et al. Impact of a collaborative pharmacy practice model on the treatment of depression in primary care. *Am J Health Syst Pharm*. 2002; 59: 1518-1526.
- Fortney J, Rost K, Zhang M, Pyne J. The relationship between quality and outcomes in routine depression care. *Psychiatr Serv.* 2001; 52: 56-62.
- Gameroff MJ, Olfson M. Major depressive disorder, somatic pain, and health care costs in an urban primary care practice. *J Clin Psychiatry*. 2006; 67: 1232-1239.
- Gibbons RD, Hur K, Bhaumik DK, Mann JJ. The relationship between antidepressant medication use and rate of suicide. *Arch Gen Psychiatry*. 2005; 62: 165-172.
- Gilberg K, Laouri M, Wade S, Isonaka S. Analysis of medication use patterns: Apparent overuse of antibiotics and underuse of prescription drugs for asthma, depression, and CHF. *J Manag Care Pharm*. 2003; 9: 232-237.
- Gregor KJ, Overhage JM, Coons SJ, McDonald RC. Selective serotonin reuptake inhibitor dose titration in the naturalistic setting. *Clin Ther*. 1994; 16: 306-15, discussion 271-2.
- Horberg MA, Silverberg MJ, Hurley LB, et al. Effects of depression and selective serotonin reuptake inhibitor use on adherence to highly active antiretroviral therapy and on clinical outcomes in HIV-infected patients. *J Acquir Immune Defic Syndr*. 2008; 47: 384-390.
- Horn SD. Overcoming obstacles to effective treatment: Use of clinical practice improvement methodology. *J Clin Psychiatry*. 1997; 58 Suppl 1: 15-19.
- Jayawant SS, Bhosle MJ, Anderson RT, Balkrishnan R. Depressive symptomatology, medication persistence, and associated healthcare costs in older adults with glaucoma. *J Glaucoma*. 2007; 16: 513-520.
- Katon W, Cantrell CR, Sokol MC, Chiao E, Gdovin JM. Impact of antidepressant drug adherence on comorbid medication use and resource utilization. *Arch Intern Med*. 2005; 165: 2497-2503.



- Kelton CM, Rebelein RP, Heaton PC, Ferrand Y, Guo JJ. Differences in the cost of antidepressants across state Medicaid programs. *J Ment Health Policy Econ*. 2008; 11: 33-47.
- Kroner BA, Billups SJ, Garrison KM, Lyman AE, Delate T. Actual versus projected cost avoidance for clinical pharmacy specialist-initiated medication conversions in a primary care setting in an integrated health system. *J Manag Care Pharm.* 2008; 14: 155-163.
- Kurian B T, Ray W A, Arbogast P G, Fuchs D C, Et A. Effect of regulatory warnings on antidepressant prescribing for children and adolescents. *Arch Pediatr Adolesc Med*. 2007; 161: 690-696.
- Kwon A, Bungay KM, Pei Y, et al. Antidepressant use: Concordance between self-report and claims records. *Med Care*. 2003; 41: 368-374.
- Lapane KL, Hughes CM. An evaluation of the impact of the prospective payment system on antidepressant use in nursing home residents. *Med Care*. 2004; 42: 48-58.
- Lin EH, Katon W, Von Korff M, et al. Relationship of depression and diabetes self-care, medication adherence, and preventive care. *Diabetes Care*. 2004; 27: 2154-2160.
- Lin EH, Von Korff M, Katon W, et al. The role of the primary care physician in patients' adherence to antidepressant therapy. *Med Care*. 1995; 33: 67-74.
- Logan JE, Riley AW, Barker LE. Parental mental and pain-related health and pediatric ambulatory care sensitive emergency department visits and hospitalizations. *Health Serv Res.* 2008; 43: 656-674.
- Luber MP, Hollenberg JP, Williams-Russo P, et al. Diagnosis, treatment, comorbidity, and resource utilization of depressed patients in a general medical practice. *Int J Psychiatry Med*. 2000; 30: 1-13.
- Ma J, Vaillancourt R, Boddam R, Auger S, Sampalis J. Association between antidepressant use and prescribing of gastric acid suppressants. *Can J Psychiatry*. 2006; 51: 178-184.
- Mamdani M, Herrmann N, Austin P. Prevalence of antidepressant use among older people: Population-based observations. *J Am Geriatr Soc.* 1999; 47: 1350-1353.
- Mamdani MM, Parikh SV, Austin PC, Upshur RE. Use of antidepressants among elderly subjects: Trends and contributing factors. *Am J Psychiatry*. 2000; 157: 360-367.
- Mansfield AJ, Kaufman JS, Marshall SW, Gaynes BN, Morrissey JP, Engel CC. Deployment and the use of mental health services among U.S. army wives. *N Engl J Med*. 2010; 362: 101-109.
- Matza LS, Rajagopalan KS, Thompson CL, de Lissovoy G. Misdiagnosed patients with bipolar disorder: Comorbidities, treatment patterns, and direct treatment costs. J Clin Psychiatry. 2005; 66: 1432-1440.



- McCombs JS, Ahn J, Tencer T, Shi L. The impact of unrecognized bipolar disorders among patients treated for depression with antidepressants in the fee-for-services California Medicaid (Medi-Cal) program: A 6-year retrospective analysis. *J Affect Disord*. 2007; 97: 171-179.
- McCombs JS, Nichol MB, Stimmel GL, Sclar DA, Beasley CM, Jr, Gross LS. The cost of antidepressant drug therapy failure: A study of antidepressant use patterns in a medicaid population. *J Clin Psychiatry*. 1990; 51 Suppl: 60-9, discussion 70-1.
- McEwen LN, Bilik D, Johnson SL, et al. Predictors and impact of intensification of antihyperglycemic therapy in type 2 diabetes: Translating research into action for diabetes (TRIAD). *Diabetes Care*. 2009; 32: 971-976.
- Melfi CA, Chawla AJ, Croghan TW, Hanna MP, Kennedy S, Sredl K. The effects of adherence to antidepressant treatment guidelines on relapse and recurrence of depression. *Arch Gen Psychiatry*. 1998; 55: 1128-1132.
- Melfi CA, Croghan TW, Hanna MP. Access to treatment for depression in a Medicaid population. J Health Care Poor Underserved. 1999; 10: 201-215.
- Melfi CA, Croghan TW, Hanna MP, Robinson RL. Racial variation in antidepressant treatment in a Medicaid population. *J Clin Psychiatry*. 2000; 61: 16-21.
- Mirkin D, Murphy-Barron C, Iwasaki K. Actuarial analysis of private payer administrative claims data for women with endometriosis. *J Manag Care Pharm*. 2007; 13: 262-272.
- Morris CD, Giese AA, Turnbull JJ, Dickinson M, Johnson-Nagel N. Predictors of tobacco use among persons with mental illnesses in a statewide population. *Psychiatr Serv*. 2006; 57: 1035-1038.
- Mullins CD, Shaya FT, Meng F, Wang J, Bron MS. Comparison of first refill rates among users of sertraline, paroxetine, and citalopram. *Clin Ther*. 2006; 28: 297-305, discussion 296.
- Mullins CD, Shaya FT, Meng F, Wang J, Harrison D. Persistence, switching, and discontinuation rates among patients receiving sertraline, paroxetine, and citalopram. *Pharmacotherapy*. 2005; 25: 660-667.
- Nemeroff CB, Kalali A, Keller MB, et al. Impact of publicity concerning pediatric suicidality data on physician practice patterns in the United States. *Arch Gen Psychiatry*. 2007; 64: 466-472.
- O'Brien L, Laporte A, Koren G. Estimating the economic costs of antidepressant discontinuation during pregnancy. *Can J Psychiatry*. 2009; 54: 399-408.
- O'Reilly RL. Are the monamine oxidase inhibitors facing extinction? *Can J Psychiatry*. 1991; 36: 186-189.
- Ornstein S, Stuart G, Jenkins R. Depression diagnoses and antidepressant use in primary care practices: A study from the Practice Partner Research Network (PPRNet). *J Fam Pract*. 2000; 49: 68-72.



- Pamer CA, Hammad TA, Wu YT, et al. Changes in US antidepressant and antipsychotic prescription patterns during a period of FDA actions. *Pharmacoepidemiol Drug Saf.* 2010; 19: 158-174. [
- Patel N C, Crismon M L, Shafer A. Diagnoses and antipsychotic treatment among youths in a public mental health system. *Ann Pharmacotherapy*. 2006; 40: 205-211.
- Patten SB, Esposito E, Carter B. Reasons for antidepressant prescriptions in Canada. *Pharmacoepidemiol Drug Saf.* 2007; 16: 746-752.
- Petrakis I L, Leslie D, Rosenheck R. The use of antidepressants in alcohol-dependent veterans. *J Clin Psychiatry*. 2003; 64: 865-870.
- Pfeiffer PN, Ganoczy D, Ilgen M, Zivin K, Valenstein M. Comorbid anxiety as a suicide risk factor among depressed veterans. *Depress Anxiety*. 2009; 26: 752-757.
- Poret AW, Neslusan C, Ricci JF, Wang S, Khan ZM, Kwong JW. Retrospective analysis of the healthcare costs of bupropion sustained release in comparison with other antidepressants. *Value Health*. 2001 Sep-Oct; 4(5): 362-9.
- Pomerantz JM, Finkelstein SN, Berndt ER, et al. Prescriber intent, off-label usage, and early discontinuation of antidepressants: A retrospective physician survey and data analysis. *J Clin Psychiatry*. 2004; 65: 395-404.
- Poston S, Dickson M, Johnsrud M, Rupnow M F, Et A. Topiramate prescribing patterns among medicaid patients: Diagnosis, comorbidities, and dosing. *Clin Ther*. 2007; 29: 504-518.
- Revicki DA, Brown RE, Keller MB, Gonzales J, Culpepper L, Hales RE. Cost-effectiveness of newer antidepressants compared with tricyclic antidepressants in managed care settings. *J Clin Psychiatry*. 1997; 58: 47-58.
- Richardson LK, Egede LE, Mueller M, Echols CL, Gebregziabher M. Longitudinal effects of depression on glycemic control in veterans with type 2 diabetes. *Gen Hosp Psychiatry*. 2008; 30: 509-514.
- Richardson LP, DiGiuseppe D, Garrison M, Christakis DA. Depression in Medicaid-covered youth: Differences by race and ethnicity. *Arch Pediatr Adolesc Med*. 2003; 157: 984-989.
- Richardson LP, Russo JE, Lozano P, McCauley E, Katon W. Factors associated with detection and receipt of treatment for youth with depression and anxiety disorders. *Acad Pediatr*. 2010; 10: 36-40.
- Rojas-Fernandez C, Thomas VS, Carver D, Tonks R. Suboptimal use of antidepressants in the elderly: A population-based study in Nova Scotia. *Clin Ther*. 1999; 21: 1937-1950.
- Rost K, Dickinson LM, Fortney J, Westfall J, Hermann RC. Clinical improvement associated with conformance to HEDIS-based depression care. *Ment Health Serv Res.* 2005; 7: 103-112.



- Russell JM, Hawkins K, Ozminkowski RJ, et al. The cost consequences of treatment-resistant depression. *J Clin Psychiatry*. 2004; 65: 341-347.
- Sambamoorthi U, Olfson M, Walkup JT, Crystal S. Diffusion of new generation antidepressant treatment among elderly diagnosed with depression. *Med Care*. 2003; 41: 180-194.
- Sambamoorthi U, Walkup J, Olfson M, Crystal S. Antidepressant treatment and health services utilization among HIV-infected Medicaid patients diagnosed with depression. *J Gen Intern Med*. 2000; 15: 311-320.
- Seftel AD, Sun P, Swindle R. The prevalence of hypertension, hyperlipidemia, diabetes mellitus and depression in men with erectile dysfunction. *J Urol*. 2004; 171: 2341-2345.
- Sernyak MJ, Rosenheck RA. Generic fluoxetine and choice of antidepressant medication. *Psychiatr* Serv. 2007; 58: 128-130.
- Shahinian VB, Kuo YF, Freeman JL, Goodwin JS. Risk of the "androgen deprivation syndrome" in men receiving androgen deprivation for prostate cancer. *Arch Intern Med.* 2006; 166: 465-471.
- Sharafkhaneh A, Giray N, Richardson P, Young T, Hirshkowitz M. Association of psychiatric disorders and sleep apnea in a large cohort. *Sleep*. 2005; 28: 1405-1411.
- Shatin D, Drinkard CR. Ambulatory use of psychotropics by employer-insured children and adolescents in a national managed care organization. *Ambul Pediatr.* 2002; 2: 111-119.
- Sheehan DV, Eaddy MT, Shah MB, Mauch RP. Differences in total medical costs across the SSRIs for the treatment of depression and anxiety. *Am J Manag Care*. 2005; 11: S354-61.
- Sheffield RE, Lo Sasso AT, Young CH, Way K. Selective serotonin reuptake inhibitor usage patterns as risk factors for hospitalization. *Adm Policy Ment Health*. 2002; 30: 121-139.
- Shen JJ, Lin F, Jackson T. Risk of prenatal depression: Differences by race. *Ethn Dis*. 2010; 20: 35-39.
- Shulman K I, Sykora K, Gill S, Mamdani M, et al. Incidence of delirium in older adults newly prescribed lithium or valproate: A population-based cohort study. *J Clin Psychiatry*. 2005; 66: 424-427.
- Shulman KI, Fischer HD, Herrmann N, Huo CY, Anderson GM, Rochon PA. Current prescription patterns and safety profile of irreversible monoamine oxidase inhibitors: A population-based cohort study of older adults. *J Clin Psychiatry*. 2009; 70: 1681-1686.
- Simon G E, Manning W G, Katzelnick D J, Pearson S D, Et A. Cost-effectiveness of systematic depression treatment for high utilizers of general medical care. Arch Gen Psychiatry. 2001; 58: 181-187.
- Simon GE, Savarino J. Suicide attempts among patients starting depression treatment with medications or psychotherapy. *Am J Psychiatry*. 2007; 164: 1029-1034.



- Simon GE, Savarino J, Operskalski B, Wang PS. Suicide risk during antidepressant treatment. *Am J Psychiatry*. 2006; 163: 41-47.
- Simon GE, Von Korff M, Rutter CM, Peterson DA. Treatment process and outcomes for managed care patients receiving new antidepressant prescriptions from psychiatrists and primary care physicians. *Arch Gen Psychiatry*. 2001; 58: 395-401.
- Simon GE, VonKorff M. Recognition, management, and outcomes of depression in primary care. *Arch Fam Med.* 1995; 4: 99-105.
- Simon GE, VonKorff M, Barlow W. Health care costs of primary care patients with recognized depression. *Arch Gen Psychiatry*. 1995; 52: 850-856.
- Simon GE, VonKorff M, Wagner EH, Barlow W. Patterns of antidepressant use in community practice. *Gen Hosp Psychiatry*. 1993; 15: 399-408.
- Singh JA. Accuracy of veterans affairs databases for diagnoses of chronic diseases. *Prev Chronic Dis.* 2009; 6: A126.
- Skaer T L, Sclar D A, Robison L M, Galin R S, Et A. Economic valuation of amitriptyline, desipramine, nortriptyline, and sertraline in the management of patients with depression. *Curr Ther Res*. 1995; 56: 556-567.
- Solberg LI, Crain AL, Sperl-Hillen JM, Hroscikoski MC, Engebretson KI, O'Connor PJ. Effect of improved primary care access on quality of depression care. *Ann Fam Med*. 2006; 4: 69-74.
- Song D, Sands RG, Wong YL. Utilization of mental health services by low-income pregnant and postpartum women on medical assistance. *Women Health*. 2004; 39: 1-24.
- Stang P, Young S, Hogue S. Better patient persistence with once-daily bupropion compared with twice-daily bupropion. *Am J Ther*. 2007; 14: 20-24.
- Stensland MD, Jacobson JG, Nyhuis A. Service utilization and associated direct costs for bipolar disorder in 2004: An analysis in managed care. *J Affect Disord*. 2007; 101: 187-193.
- Streja DA, Hui RL, Streja E, McCombs JS. Selective contracting and patient outcomes: A case study of formulary restrictions for selective serotonin reuptake inhibitor antidepressants. Am J Manag Care. 1999; 5: 1133-1142.
- Sullivan EM, Griffiths RI, Frank RG, et al. One-year costs of second-line therapies for depression. J Clin Psychiatry. 2000; 61: 290-298.
- Sullivan M, Simon G, Spertus J, Russo J. Depression-related costs in heart failure care. Arch Intern Med. 2002; 162: 1860-1866.
- Taylor JK, Schoenbaum M, Katon WJ, Pincus HA, Hogan DM, Unutzer J. Strategies for identifying and channeling patients for depression care management. *Am J Manag Care*. 2008; 14: 497-504.



- Thompson D, Hylan TR, McMullen W, Romeis ME, Buesching D, Oster G. Predictors of a medicaloffset effect among patients receiving antidepressant therapy. *Am J Psychiatry*. 1998; 155: 824-827.
- Tu K, Mamdani M M, Hux J E, Tu JB. Progressive trends in the prevalence of benzodiazepine prescribing in older people in Ontario, Canada. *J Am Geriatr Soc*. 2001; 49: 1341-1345.
- Turner BJ, Laine C, Cosler L, Hauck WW. Relationship of gender, depression, and health care delivery with antiretroviral adherence in HIV-infected drug users. *J Gen Intern Med*. 2003; 18: 248-257.
- Unutzer J, Simon G, Belin T R, Datt M, et al. Care for depression in HMO patients aged 65 and older (ref art 451303). *J Am Geriatr Soc.* 2000; 48: 871-878.
- Valenstein M, Eisenberg D, McCarthy JF, et al. Service implications of providing intensive monitoring during high-risk periods for suicide among VA patients with depression. *Psychiatr Serv*. 2009; 60: 439-444.
- Valenstein M, Kim HM, Ganoczy D, et al. Higher-risk periods for suicide among VA patients receiving depression treatment: Prioritizing suicide prevention efforts. *J Affect Disord*. 2009; 112: 50-58.
- Valenstein M, McCarthy JF, Austin KL, Greden JF, Young EA, Blow FC. What happened to lithium? Antidepressant augmentation in clinical settings. *Am J Psychiatry*. 2006; 163: 1219-1225.
- Valenstein M, Taylor KK, Austin K, Kales HC, McCarthy JF, Blow FC. Benzodiazepine use among depressed patients treated in mental health settings. *Am J Psychiatry*. 2004; 161: 654-661.
- Valenstein M, Vijan S, Zeber JE, Boehm K, Buttar A. The cost-utility of screening for depression in primary care. *Ann Intern Med*. 2001; 134: 345-360.
- Valuck RJ, Perlman JI, Anderson C, Wortman GI. Co-prescribing of medications used to treat obstructive lung disease, congestive heart failure and depression among users of topical beta blockers: Estimates from three US veterans affairs medical centers. *Pharmacoepidemiol Drug Saf*. 2001; 10: 511-516.
- Vuchetich PJ, Garis RI, Jorgensen AM. Evaluation of cost savings to a state Medicaid program following a sertraline tablet-splitting program. *J Am Pharm Assoc*. 2003; 43: 497-502.
- Wan GJ, Crown WH, Berndt ER, Finkelstein SN, Ling D. Healthcare expenditure in patients treated with venlafaxine or selective serotonin reuptake inhibitors for depression and anxiety. *Int J Clin Pract*. 2002; 56: 434-439.
- Wang PS, Schneeweiss S, Brookhart MA, et al. Suboptimal antidepressant use in the elderly. *J Clin Psychopharmacol.* 2005; 25: 118-126.



- Way K, Young C H, Opland E, Whitehouse D, Hughes T. Incidence of anxiolytic/hypnotic therapy and its relationship to duration of antidepressant therapy in a national managed care organization. *J Manag Care Pharm*. 2000; 6: 138-142.
- Weilburg JB, O'Leary KM, Meigs JB, Hennen J, Stafford RS. Evaluation of the adequacy of outpatient antidepressant treatment. *Psychiatr Serv*. 2003; 54: 1233-1239.
- Weilburg JB, Stafford RS, O'Leary KM, Meigs JB, Finkelstein SN. Costs of antidepressant medications associated with inadequate treatment. *Am J Manag Care*. 2004; 10: 357-365.
- Wells KB, Norquist G, Benjamin B, Rogers W, Kahn K, Brook R. Quality of antidepressant medications prescribed at discharge to depressed elderly patients in general medical hospitals before and after prospective payment system. *Gen Hosp Psychiatry*. 1994; 16: 4-15.
- West SL, Richter A, Melfi CA, McNutt M, Nennstiel ME, Mauskopf JA. Assessing the Saskatchewan database for outcomes research studies of depression and its treatment. *J Clin Epidemiol*. 2000; 53: 823-831.
- Williams LS, Ghose SS, Swindle RW. Depression and other mental health diagnoses increase mortality risk after ischemic stroke. *Am J Psychiatry*. 2004; 161: 1090-1095.
- Wysong A, Lee PP, Sloan FA. Longitudinal incidence of adverse outcomes of age-related macular degeneration. *Arch Ophthalmol*. 2009; 127: 320-327.
- Ye X, Gross CR, Schommer J, Cline R, St Peter WL. Association between copayment and adherence to statin treatment initiated after coronary heart disease hospitalization: A longitudinal, retrospective, cohort study. *Clin Ther*. 2007; 29: 2748-2757.
- Yu-Isenberg KS, Fontes CL, Wan GJ, Geissler EC, Harada AS. Acute and continuation treatment adequacy with venlafaxine extended release compared with fluoxetine. *Pharmacotherapy*. 2004; 24: 33-40.
- Yun LW, Maravi M, Kobayashi JS, Barton PL, Davidson AJ. Antidepressant treatment improves adherence to antiretroviral therapy among depressed HIV-infected patients. *J Acquir Immune Defic Syndr*. 2005; 38: 432-438.
- Zito JM, Safer DJ. Services and prevention: Pharmacoepidemiology of antidepressant use. *Biol Psychiatry*. 2001; 49: 1121-1127.
- Zito JM, Safer DJ, DosReis S, et al. Rising prevalence of antidepressants among US youths. *Pediatrics*. 2002; 109: 721-727.
- Zito JM, Safer DJ, Sai D, et al. Psychotropic medication patterns among youth in foster care. *Pediatrics*. 2008; 121: e157-63.
- Zito JM, Tobi H, de Jong-van den Berg LT, et al. Antidepressant prevalence for youths: A multinational comparison. *Pharmacoepidemiol Drug Saf*. 2006; 15: 793-798.



Zivin K, Ganoczy D, Pfeiffer PN, Miller EM, Valenstein M. Antidepressant adherence after psychiatric hospitalization among VA patients with depression. *Adm Policy Ment Health*. 2009; 36: 406-415.

2. Studies Excluded Due to Lack of Validation or Reporting of Validation Statistics

- Ackerman DL, Unutzer J, Greenland S, Gitlin M. Inpatient treatment of depression and associated hospital charges. *Pharmacoepidemiol Drug Saf.* 2002; 11: 219-227.
- Adams AS, Zhang F, LeCates RF, et al. Prior authorization for antidepressants in Medicaid: Effects among disabled dual enrollees. *Arch Intern Med*. 2009; 169: 750-756.
- Akincigil A, Bowblis JR, Levin C, Walkup JT, Jan S, Crystal S. Adherence to antidepressant treatment among privately insured patients diagnosed with depression. *Med Care*. 2007; 45: 363-369.
- Akincigil A, Hoover DR, Walkup JT, Prince JD, Kalay E, Crystal S. Hospitalization for psychiatric illness among community-dwelling elderly persons in 1992 and 2002. *Psychiatr Serv*. 2008; 59: 1046-1048.
- Azocar F, McCarter LM, Cuffel BJ, Croghan TW. Patterns of medical resource and psychotropic medicine use among adult depressed managed behavioral health patients. *J Behav Health Serv Res*. 2004; 31: 26-37.
- Bambauer KZ, Safran DG, Ross-Degnan D, et al. Depression and cost-related medication nonadherence in Medicare beneficiaries. *Arch Gen Psychiatry*. 2007; 64: 602-608.
- Banerjea R, Findley PA, Smith B, Findley T, Sambamoorthi U. Co-occurring medical and mental illness and substance use disorders among veteran clinic users with spinal cord injury patients with complexities. *Spinal Cord*. 2009; 47: 789-795.
- Bayliss EA, Ellis JL, Steiner JF. Barriers to self-management and quality-of-life outcomes in seniors with multimorbidities. *Ann Fam Med*. 2007; 5: 395-402.
- Birnbaum HG, Shi L, Dial E, Oster EF, Greenberg PE, Mallett DA. Economic consequences of not recognizing bipolar disorder patients: A cross-sectional descriptive analysis. J Clin Psychiatry. 2003; 64: 1201-1209.
- Blanchette CM, Simoni-Wastila L, Shaya F, Orwig D, Noel J, Stuart B. Health care use in depressed, elderly, cardiac patients and the effect of antidepressant use. *Am J Health Syst Pharm*. 2009; 66: 366-372.
- Boulanger L, Zhao Y, Foster TS, Fraser K, Bledsoe SL, Russell MW. Impact of comorbid depression or anxiety on patterns of treatment and economic outcomes among patients with diabetic peripheral neuropathic pain. *Curr Med Res Opin*. 2009; 25: 1763-1773.
- Breslau N, Davis GC, Andreski P. Migraine, psychiatric disorders, and suicide attempts: An epidemiologic study of young adults. *Psychiatry Res.* 1991; 37: 11-23.



- Bright RA, Everitt DE. Beta-blockers and depression. evidence against an association. *JAMA*. 1992; 267: 1783-1787.
- Brown LC, Majumdar SR, Johnson JA. Type of antidepressant therapy and risk of type 2 diabetes in people with depression. *Diabetes Res Clin Pract*. 2008; 79: 61-67.
- Brown LC, Majumdar SR, Newman SC, Johnson JA. History of depression increases risk of type 2 diabetes in younger adults. *Diabetes Care*. 2005; 28: 1063-1067.
- Burton WN, Chen CY, Conti DJ, Schultz AB, Edington DW. The association of antidepressant medication adherence with employee disability absences. *Am J Manag Care*. 2007; 13: 105-112.
- Busch AB, Huskamp HA, Normand SL, Young AS, Goldman H, Frank RG. The impact of parity on major depression treatment quality in the federal employees' health benefits program after parity implementation. *Med Care*. 2006; 44: 506-512.
- Busch SH. Specialty health care, treatment patterns, and quality: The impact of a mental health carve-out on care for depression. *Health Serv Res.* 2002; 37: 1583-1601.
- Busch SH, Leslie D, Rosenheck R. Measuring quality of pharmacotherapy for depression in a national health care system. *Med Care*. 2004; 42: 532-542.
- Busch SH, Leslie DL, Rosenheck RA. Comparing the quality of antidepressant pharmacotherapy in the Department of Veterans Affairs and the private sector. *Psychiatr Serv*. 2004; 55: 1386-1391.
- Canavan JB, Bennett K, Feely J, O'Morain CA, O'Connor HJ. Significant psychological morbidity occurs in irritable bowel syndrome: A case-control study using a pharmacy reimbursement database. *Aliment Pharmacol Ther*. 2009; 29: 440-449.
- Cantrell CR, Eaddy MT, Shah MB, Regan TS, Sokol MC. Methods for evaluating patient adherence to antidepressant therapy: A real-world comparison of adherence and economic outcomes. *Med Care*. 2006; 44: 300-303.
- Castilla-Puentes RC, Habeych ME. Subtypes of depression among patients with Alzheimer's disease and other dementias. *Alzheimers Dement*. 2010; 6: 63-69.
- Charbonneau A, Rosen AK, Ash AS, et al. Measuring the quality of depression care in a large integrated health system. *Med Care*. 2003; 41: 669-680.
- Charbonneau A, Rosen AK, Owen RR, et al. Monitoring depression care: In search of an accurate quality indicator. *Med Care*. 2004; 42: 522-531.
- Chen H, Deshpande A D, Jiang R, Martin BC. An epidemiological investigation of off-label anticonvulsant drug use in the Georgia Medicaid population. *Pharmacoepidemiol Drug Saf*. 2005; 14: 629-638.



- Chen P, Kales HC, Weintraub D, et al. Depression in veterans with Parkinson's disease: Frequency, co-morbidity, and healthcare utilization. *Int J Geriatr Psychiatry*. 2007; 22: 543-548.
- Chen P, Kales HC, Weintraub D, Blow FC, Jiang L, Mellow AM. Antidepressant treatment of veterans with Parkinson's disease and depression: Analysis of a national sample. *J Geriatr Psychiatry Neurol*. 2007; 20: 161-165.
- Chen RS, Rosenheck R. Using a computerized patient database to evaluate guideline adherence and measure patterns of care for major depression. *J Behav Health Serv Res*. 2001; 28: 466-474.
- Chen Y, Guo JJ, Li H, Wulsin L, Patel NC. Risk of cerebrovascular events associated with antidepressant use in patients with depression: A population-based, nested case-control study. *Ann Pharmacother*. 2008; 42: 177-184.
- Chen Y, Guo JJ, Patel NC. Hemorrhagic stroke associated with antidepressant use in patients with depression: Does degree of serotonin reuptake inhibition matter? *Pharmacoepidemiol Drug Saf.* 2009; 18: 196-202.
- Chermack ST, Zivin K, Valenstein M, et al. The prevalence and predictors of mental health treatment services in a national sample of depressed veterans. *Med Care*. 2008; 46: 813-820.
- Clark RE, Xie H, Brunette MF. Benzodiazepine prescription practices and substance abuse in persons with severe mental illness. *J Clin Psychiatry*. 2004; 65: 151-155.
- Claxton AJ, Chawla AJ, Kennedy S. Absenteeism among employees treated for depression. J Occup Environ Med. 1999; 41: 605-611.
- Corey-Lisle PK, Birnbaum HG, Greenberg PE, Marynchenko MB, Claxton AJ. Identification of a claims data "signature" and economic consequences for treatment-resistant depression. *J Clin Psychiatry*. 2002; 63: 717-726.
- Croghan TW, Lair TJ, Engelhart L, et al. Effect of antidepressant therapy on health care utilization and costs in primary care. *Psychiatr Serv.* 1997; 48: 1420-1426.
- Croghan TW, Obenchain RL, Crown WE. What does treatment of depression really cost? *Health Aff* (*Millwood*). 1998; 17: 198-208.
- Crown WH, Finkelstein S, Berndt ER, et al. The impact of treatment-resistant depression on health care utilization and costs. *J Clin Psychiatry*. 2002; 63: 963-971.
- Crown WH, Obenchain RL, Englehart L, Lair T, Buesching DP, Croghan T. The application of sample selection models to outcomes research: The case of evaluating the effects of antidepressant therapy on resource utilization. *Stat Med.* 1998; 17: 1943-1958.
- Crystal S, Sambamoorthi U, Walkup JT, Akincigil A. Diagnosis and treatment of depression in the elderly Medicare population: Predictors, disparities, and trends. *J Am Geriatr Soc.* 2003; 51: 1718-1728.



- Crystal-Peters J, Neslusan CA, Smith MW, Togias A. Health care costs of allergic rhinitis-associated conditions vary with allergy season. *Ann Allergy Asthma Immunol*. 2002; 89: 457-462.
- Cuffel BJ, Azocar F, Tomlin M, Greenfield SF, Busch AB, Croghan TW. Remission, residual symptoms, and nonresponse in the usual treatment of major depression in managed clinical practice. *J Clin Psychiatry*. 2003; 64: 397-402.
- Cully JA, Johnson M, Moffett ML, Khan M, Deswal A. Depression and anxiety in ambulatory patients with heart failure. *Psychosomatics*. 2009; 50: 592-598.
- Cully JA, Molinari VA, Snow AL, Burruss J, Kotrla KJ, Kunik ME. Utilization of emergency center services by older adults with a psychiatric diagnosis. *Aging Ment Health*. 2005; 9: 172-176.
- Derby LE, Jick H, Dean AD. Antidepressant drugs and suicide. *J Clin Psychopharmacol*. 1992; 12: 235-240.
- Dietz PM, Williams SB, Callaghan WM, Bachman DJ, Whitlock EP, Hornbrook MC. Clinically identified maternal depression before, during, and after pregnancies ending in live births. *Am J Psychiatry*. 2007; 164: 1515-1520.
- Dillard DA, Christopher D. The Southcentral Foundation depression collaborative. *Int J Circumpolar Health*. 2007; 66 Suppl 1: 45-53.
- Domino ME, Salkever DS. Price elasticity and pharmaceutical selection: The influence of managed care. *Health Econ.* 2003; 12: 565-586.
- Donohue JM, Berndt ER, Rosenthal M, Epstein AM, Frank RG. Effects of pharmaceutical promotion on adherence to the treatment guidelines for depression. *Med Care*. 2004; 42: 1176-1185.
- Eaddy MT, Druss BG, Sarnes MW, Regan TS, Frankum LE. Relationship of total health care charges to selective serotonin reuptake inhibitor utilization patterns including the length of antidepressant therapy--results from a managed care administrative claims database. *J Manag Care Pharm.* 2005; 11: 145-150.
- Edgell ET, Hylan TR, Draugalis JR, Coons SJ. Initial treatment choice in depression: Impact on medical expenditures. *Pharmacoeconomics*. 2000; 17: 371-382.
- Esposito D, Wahl P, Daniel G, Stoto MA, Erder MH, Croghan TW. Results of a retrospective claims database analysis of differences in antidepressant treatment persistence associated with escitalopram and other selective serotonin reuptake inhibitors in the United States. *Clin Ther.* 2009; 31: 644-656.
- Folsom DP, Lindamer L, Montross LP, et al. Diagnostic variability for schizophrenia and major depression in a large public mental health care system dataset. *Psychiatry Res*. 2006; 144: 167-175.



- Fosbol EL, Gislason GH, Poulsen HE, et al. Prognosis in heart failure and the value of {beta}-blockers are altered by the use of antidepressants and depend on the type of antidepressants used. *Circ Heart Fail*. 2009; 2: 582-590.
- Gibbons RD, Brown CH, Hur K, Marcus SM, Bhaumik DK, Mann JJ. Relationship between antidepressants and suicide attempts: An analysis of the Veterans Health Administration data sets. *Am J Psychiatry*. 2007; 164: 1044-1049.
- Gill JM, Chen YX, Lieberman MI. Management of depression in ambulatory care for patients with medical co-morbidities: A study from a national electronic health record (EHR) network. *Int J Psychiatry Med*. 2008; 38: 203-215.
- Goldman W, McCulloch J, Cuffel B, Zarin DA, Suarez A, Burns BJ. Outpatient utilization patterns of integrated and split psychotherapy and pharmacotherapy for depression. *Psychiatr Serv*. 1998; 49: 477-482.
- Grunau GL, Ratner PA, Goldner EM, Sheps S. Is early- and late-onset depression after acute myocardial infarction associated with long-term survival in older adults? A population-based study. *Can J Cardiol*. 2006; 22: 473-478.
- Hamed A, Lee A, Ren XS, et al. Use of antidepressant medications: Are there differences in psychiatric visits among patient treatments in the veterans administration? *Med Care*. 2004; 42: 551-559.
- Hansen RA, Dusetzina SB, Dominik RC, Gaynes BN. Prescription refill records as a screening tool to identify antidepressant non-adherence. *Pharmacoepidemiol Drug Saf*. 2010; 19: 33-37.
- Harman JS, Hall AG, Zhang J. Changes in health care use and costs after a break in Medicaid coverage among persons with depression. *Psychiatr Serv*. 2007; 58: 49-54.
- Hedayati SS, Grambow SC, Szczech LA, Stechuchak KM, Allen AS, Bosworth HB. Physician-diagnosed depression as a correlate of hospitalizations in patients receiving long-term hemodialysis. *Am J Kidney Dis*. 2005; 46: 642-649.
- Higgins TS,Jr, Ritchie CS, Stetson BA, Burke JD, Looney SW. An examination of the moderating effect of treatment with anti-depressants on the association of heart disease with depression in males with type 2 diabetes attending a Veterans Affairs Medical Center. *Diabetes Res Clin Pract.* 2007; 75: 220-228.
- Himelhoch S, Weller WE, Wu AW, Anderson GF, Cooper LA. Chronic medical illness, depression, and use of acute medical services among Medicare beneficiaries. *Med Care*. 2004; 42: 512-521.
- Horvitz-Lennon M, Normand SL, Frank RG, Goldman HH. "Usual care" for major depression in the 1990s: Characteristics and expert-estimated outcomes. *Am J Psychiatry*. 2003; 160: 720-726.
- Huang SH, Wulsin LR, Li H, Guo J. Dimensionality reduction for knowledge discovery in medical claims database: Application to antidepressant medication utilization study. *Comput Methods Programs Biomed*. 2009; 93: 115-123.



- Hylan TR, Crown WH, Meneades L, et al. SSRI antidepressant drug use patterns in the naturalistic setting: A multivariate analysis. *Med Care*. 1999; 37: AS36-44.
- Ilgen MA, Downing K, Zivin K, et al. Exploratory data mining analysis identifying subgroups of patients with depression who are at high risk for suicide. *J Clin Psychiatry*. 2009; 70: 1495-1500.
- Ishihara L, Webb D J, Irizarry M, Weil J. Exploring differential prescribing between anti-epileptic drugs in epilepsy patients with a history of mood disorders. *Pharmacoepidemiol Drug Saf*. 2010; 19: 289-295.
- Jia H, Damush TM, Qin H, et al. The impact of poststroke depression on healthcare use by veterans with acute stroke. *Stroke*. 2006; 37: 2796-2801.
- Jick SS, Kremers H M, V. Isotretinoin use and risk of depression, psychotic symptoms, suicide, and attempted suicide. *Arch Dermatol*. 2000; 136: 1231-1236.
- Johnson J A, Wallace SM. Investigating the relationship between beta-blocker and antidepressant use through linkage of the administrative databases of Saskatchewan health. *Pharmacoepidemiol Drug Saf*. 1997; 6: 1-11.
- Jones LE, Turvey C, Carney-Doebbeling C. Inadequate follow-up care for depression and its impact on antidepressant treatment duration among veterans with and without diabetes mellitus in the Veterans Health Administration. *Gen Hosp Psychiatry*. 2006; 28: 465-474.
- Jordan N, Lee TA, Valenstein M, Pirraglia PA, Weiss KB. Effect of depression care on outcomes in COPD patients with depression. *Chest*. 2009; 135: 626-632.
- Kales HC, Blow FC, Copeland LA, Bingham RC, Kammerer EE, Mellow AM. Health care utilization by older patients with coexisting dementia and depression. *Am J Psychiatry*. 1999; 156: 550-556.
- Kalsekar ID, Madhavan SS, Amonkar MM, et al. Impact of depression on utilization patterns of oral hypoglycemic agents in patients newly diagnosed with type 2 diabetes mellitus: A retrospective cohort analysis. *Clin Ther*. 2006; 28: 306-318.
- Kalsekar ID, Madhavan SS, Amonkar MM, et al. Depression in patients with type 2 diabetes: Impact on adherence to oral hypoglycemic agents. *Ann Pharmacother*. 2006; 40: 605-611.
- Katz LY, Kozyrskyj AL, Prior HJ, Enns MW, Cox BJ, Sareen J. Effect of regulatory warnings on antidepressant prescription rates, use of health services and outcomes among children, adolescents and young adults. *CMAJ*. 2008; 178: 1005-1011.
- Katzelnick D J, Kobak K A, Jefferson J W, Greist J H, Henk HJ. Prescribing patterns of antidepressant medications for depression in a HMO. *Formulary*. 1996; 31: 374-388.



- Keene MS, Eaddy MT, Mauch RP, Regan TS, Shah M, Chiao E. Differences in compliance patterns across the selective serotonin reuptake inhibitors (SSRIs). *Curr Med Res Opin*. 2005; 21: 1651-1658.
- Keene MS, Eaddy MT, Nelson WW, Sarnes MW. Adherence to paroxetine CR compared with paroxetine IR in a Medicare-eligible population with anxiety disorders. *Am J Manag Care*. 2005; 11: S362-9.
- Kerr EA, McGlynn EA, Van Vorst KA, Wickstrom SL. Measuring antidepressant prescribing practice in a health care system using administrative data: Implications for quality measurement and improvement. *Jt Comm J Qual Improv*. 2000; 26: 203-216.
- Khandker RK, Kruzikas DT, McLaughlin TP. Pharmacy and medical costs associated with switching between venlafaxine and SSRI antidepressant therapy for the treatment of major depressive disorder. *J Manag Care Pharm*. 2008; 14: 426-441.
- Kniesner TJ, Powers RH, Croghan TW. Provider type and depression treatment adequacy. *Health Policy*. 2005; 72: 321-332.
- Kobak KA, Taylor L, Katzelnick DJ, Olson N, Clagnaz P, Henk HJ. Antidepressant medication management and Health Plan Employer Data Information set (HEDIS) criteria: Reasons for nonadherence. J Clin Psychiatry. 2002; 63: 727-732.
- Kolanowski A, Fick D, Waller JL, Ahern F. Outcomes of antipsychotic drug use in community-dwelling elders with dementia. *Arch Psychiatr Nurs*. 2006; 20: 217-225.
- Kotzan J A, Maclean R, Wade W, Martin B C, Et A. Prevalence and patterns of concomitant use of selective serotonin reuptake inhibitors and other antidepressants in a high-cost polypharmacy cohort. *Clin Ther*. 2002; 24: 237-248.
- Kozhimannil KB, Pereira MA, Harlow BL. Association between diabetes and perinatal depression among low-income mothers. *JAMA*. 2009; 301: 842-847.
- Lee WC, Arcona S, Thomas SK, Wang Q, Hoffmann MS, Pashos CL. Effect of comorbidities on medical care use and cost among refractory patients with partial seizure disorder. *Epilepsy Behav*. 2005; 7: 123-126.
- Lennox RD, Scott-Lennox JA, Bohlig EM. The cost of depression-complicated alcoholism: Health-care utilization and treatment effectiveness. *J Ment Health Adm*. 1993; 20: 138-152.
- Liu B, Anderson G, Mittmann N, To T, Et A. Use of selective serotonin-reuptake inhibitors or tricyclic antidepressants and risk of hip fractures in elderly people. *Lancet*. 1998; 351: 1303-1307.
- Marcus SC, Hassan M, Olfson M. Antidepressant switching among adherent patients treated for depression. *Psychiatr Serv.* 2009; 60: 617-623.
- May HT, Horne BD, Carlquist JF, Sheng X, Joy E, Catinella AP. Depression after coronary artery disease is associated with heart failure. *J Am Coll Cardiol*. 2009; 53: 1440-1447.



- McCombs JS, Shi L, Stimmel GL, Croghan TW. A retrospective analysis of the revocation of prior authorization restrictions and the use of antidepressant medications for treating major depressive disorder. *Clin Ther*. 2002; 24: 1939-59, discussion 1938.
- McIntyre RS, Jerrell JM. Polypharmacy in children and adolescents treated for major depressive disorder: A claims database study. *J Clin Psychiatry*. 2009; 70: 240-246.
- McLaughlin T, Geissler EC, Wan GJ. Comorbidities and associated treatment charges in patients with anxiety disorders. *Pharmacotherapy*. 2003; 23: 1251-1256.
- McLaughlin T, Hogue SL, Stang PE. Once-daily bupropion associated with improved patient adherence compared with twice-daily bupropion in treatment of depression. *Am J Ther*. 2007; 14: 221-225.
- Mohamed S, Leslie D L, Rosenheck RA. Use of antipsychotics in the treatment of major depressive disorder in the U.S. Department of Veterans Affairs. *J Clin Psychiatry*. 2009; 70: 906-912.
- Nichols GA, Brown JB. Unadjusted and adjusted prevalence of diagnosed depression in type 2 diabetes. *Diabetes Care*. 2003; 26: 744-749.
- O'Connor PJ, Crain AL, Rush WA, Hanson AM, Fischer LR, Kluznik JC. Does diabetes double the risk of depression? *Ann Fam Med*. 2009; 7: 328-335.
- Olfson M, Marcus SC. A case-control study of antidepressants and attempted suicide during early phase treatment of major depressive episodes. *J Clin Psychiatry*. 2008; 69: 425-432.
- Olfson M, Marcus SC, Shaffer D. Antidepressant drug therapy and suicide in severely depressed children and adults: A case-control study. *Arch Gen Psychiatry*. 2006; 63: 865-872.
- Olfson M, Marcus SC, Corey-Lisle P, Tuomari AV, Hines P, L'Italien GJ. Hyperlipidemia following treatment with antipsychotic medications. *Am J Psychiatry*. 2006; 163: 1821-1825.
- Patten SB, Esposito E, Carter B. Reasons for antidepressant prescriptions in Canada. *Pharmacoepidemiol Drug Saf.* 2007; 16: 746-752.
- Petersen T, Andreotti CF, Chelminski I, Young D, Zimmerman M. Do comorbid anxiety disorders impact treatment planning for outpatients with major depressive disorder? *Psychiatry Res*. 2009; 169: 7-11.
- Powers RH, Kniesner TJ, Croghan TW. Psychotherapy and pharmacotherapy in depression. J Ment Health Policy Econ. 2002; 5: 153-161.
- Prince JD, Akincigil A, Kalay E, et al. Psychiatric rehospitalization among elderly persons in the United States. *Psychiatr Serv.* 2008; 59: 1038-1045.
- Richardson LP, DiGiuseppe D, Christakis DA, McCauley E, Katon W. Quality of care for Medicaidcovered youth treated with antidepressant therapy. *Arch Gen Psychiatry*. 2004; 61: 475-480.



- Robinson RL, Long SR, Chang S, et al. Higher costs and therapeutic factors associated with adherence to NCQA HEDIS antidepressant medication management measures: Analysis of administrative claims. *J Manag Care Pharm*. 2006; 12: 43-54. [
- Scherrer JF, Virgo KS, Zeringue A, et al. Depression increases risk of incident myocardial infarction among veterans administration patients with rheumatoid arthritis. *Gen Hosp Psychiatry*. 2009; 31: 353-359.
- Sclar D A, Skaer T L, Robison L M, Galin R S, Et A. Economic outcomes with antidepressant pharmacotherapy: A retrospective intent-to-treat analysis. *J Clin Psychiatry*. 1998; 59: 13-17.
- Sclar DA, Robison LM, Skaer TL, et al. Antidepressant pharmacotherapy: Economic evaluation of fluoxetine, paroxetine and sertraline in a health maintenance organization. J Int Med Res. 1995; 23: 395-412.
- Sclar DA, Robison LM, Skaer TL, et al. Antidepressant pharmacotherapy: Economic outcomes in a health maintenance organization. *Clin Ther*. 1994; 16: 715-30, discussion 74.
- Sclar DA, Skaer TL, Robison LM, Galin RS. Economic appraisal of citalopram in the management of single-episode depression. *J Clin Psychopharmacol*. 1999; 19: 47S-54S.
- Sewitch MJ, Blais R, Rahme E, Bexton B, Galarneau S. Receiving guideline-concordant pharmacotherapy for major depression: Impact on ambulatory and inpatient health service use. *Can J Psychiatry*. 2007; 52: 191-200.
- Sewitch MJ, Blais R, Rahme E, Galarneau S, Bexton B. Pharmacologic response to a diagnosis of latelife depression: A population study in Quebec. *Can J Psychiatry*. 2006; 51: 363-370.
- Sheehan DV, Keene MS, Eaddy M, Krulewicz S, Kraus JE, Carpenter DJ. Differences in medication adherence and healthcare resource utilization patterns: Older versus newer antidepressant agents in patients with depression and/or anxiety disorders. *CNS Drugs*. 2008; 22: 963-973.
- Shih YC, Bekele NB, Xu Y. Use of Bayesian net benefit regression model to examine the impact of generic drug entry on the cost effectiveness of selective serotonin reuptake inhibitors in elderly depressed patients. *Pharmacoeconomics*. 2007; 25: 843-862. [
- Silkey B, Preskorn SH, Golbeck A, et al. Complexity of medication use in the Veterans Affairs Healthcare System: Part II. Antidepressant use among younger and older outpatients. J Psychiatr Pract. 2005; 11: 16-26.
- Smith W, Sherrill A. A pharmacoeconomic study of the management of major depression: Patients in a TennCare HMO. *Med Interface*. 1996; 9: 88-92.
- Stein MB, Cantrell CR, Sokol MC, Eaddy MT, Shah MB. Antidepressant adherence and medical resource use among managed care patients with anxiety disorders. *Psychiatr Serv.* 2006; 57: 673-680.



- Strothers HS,3rd, Rust G, Minor P, Fresh E, Druss B, Satcher D. Disparities in antidepressant treatment in Medicaid elderly diagnosed with depression. *J Am Geriatr Soc.* 2005; 53: 456-461.
- Tai-Seale M, Croghan TW, Obenchain R. Determinants of antidepressant treatment compliance: Implications for policy. *Med Care Res Rev.* 2000; 57: 491-512.
- Tiwari A, Rajan M, Miller D, Pogach L, Olfson M, Sambamoorthi U. Guideline-consistent antidepressant treatment patterns among veterans with diabetes and major depressive disorder. *Psychiatr Serv.* 2008; 59: 1139-1147.
- Tournier M, Moride Y, Lesk M, Ducruet T, Rochon S. The depletion of susceptibles effect in the assessment of burden-of-illness: The example of age-related macular degeneration in the community-dwelling elderly population of Quebec. *Can J Clin Pharmacol.* 2008; 15: e22-35.
- Unutzer J, Klap R, Sturm R, et al. Mental disorders and the use of alternative medicine: Results from a national survey. *Am J Psychiatry*. 2000; 157: 1851-1857.
- Valuck RJ, Libby AM, Sills MR, Giese AA, Allen RR. Antidepressant treatment and risk of suicide attempt by adolescents with major depressive disorder: A propensity-adjusted retrospective cohort study. *CNS Drugs*. 2004; 18: 1119-1132.
- Valuck RJ, Orton HD, Libby AM. Antidepressant discontinuation and risk of suicide attempt: A retrospective, nested case-control study. *J Clin Psychiatry*. 2009; 70: 1069-1077.
- Walkup J, Wei W, Sambamoorthi U, Crystal S. Antidepressant treatment and adherence to combination antiretroviral therapy among patients with AIDS and diagnosed depression. *Psychiatr Q.* 2008; 79: 43-53.
- Wu E, Greenberg P, Yang E, Yu A, Ben-Hamadi R, Erder MH. Comparison of treatment persistence, hospital utilization and costs among major depressive disorder geriatric patients treated with escitalopram versus other SSRI/SNRI antidepressants. *Curr Med Res Opin*. 2008; 24: 2805-2813.
- Wu E, Greenberg PE, Yang E, Yu A, Erder MH. Comparison of escitalopram versus citalopram for the treatment of major depressive disorder in a geriatric population. *Curr Med Res Opin*. 2008; 24: 2587-2595.
- Wu EQ, Greenberg PE, Yang E, Yu AP, Ben-Hamadi R, Erder MH. Treatment persistence, healthcare utilization and costs in adult patients with major depressive disorder: A comparison between escitalopram and other SSRI/SNRIs. *J Med Econ*. 2009; 12: 124-135.
- Zivin K, Christakis NA. The emotional toll of spousal morbidity and mortality. *Am J Geriatr Psychiatry*. 2007; 15: 772-779.



C. APPENDIX C: LIST AND DEFINITIONS OF ICD OR PROCEDURAL CODES INCLUDED IN ALGORITHMS

Type of Code	Code	Description
ICD-9	296.2	Major depressive disorder, single episode
ICD-9	296.3	Major depressive disorder, recurrent episode
ICD-9	298.0	Depressive type psychosis
ICD-9	300.4	Neurotic Depression (Dysthymic Disorder)
ICD-9	309.0	Adjustment reaction with brief depressive reaction
ICD-9	309.1	Adjustment reaction with prolonged depressive reaction
ICD-9	309.28	Adjustment reaction with mixed emotional features
ICD-9	311	Depressive disorder, not elsewhere classified
Medication		Antidepressant prescription claim



D.	APPENDIX D: COMPLETE RESULTS FROM FRAYNE. ET AL. ((12))
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Algorithms A through H (ICD-9 Codes)	Percentage	PPV	NPV
A. 291.89, 292.84, 296.20–296.25, 296.30–296.35, 296.50–296.55, 296.60–29665, 296.89, 300.4x, 309.0x, 309.28, 311.xx. One or more code, during year of patient survey and preceding year in VHA data.	16.4	0.82	0.74
B. 291.89, 292.84, 296.20–296.25, 296.30–296.35, 296.50–296.55, 296.60–29665, 296.89, 300.4x, 309.0x, 309.28, 311.xx. One or more code, during year of patient survey in VHA data.	12.3	0.85	0.71
C. 291.89, 292.84, 296.20–296.25, 296.30–296.35, 296.50–296.55, 296.60–29665, 296.89, 300.4x, 309.0x, 309.28, 311.xx. Two or more codes, during year of patient survey and preceding year in VHA data.	11.3	0.88	0.71
D. 291.89, 292.84, 296.20–296.25, 296.30–296.35, 296.50–296.55, 296.60–29665, 296.89, 300.4x, 309.0x, 309.28, 311.xx. One or more code from a primary care visit only, during year of patient survey and preceding year in VHA data.	7.0	0.82	0.68
E. 291.89, 292.84, 296.20–296.25, 296.30–296.35, 296.50–296.55, 296.60–29665, 296.89, 300.4x, 309.0x, 309.28, 311.xx. One or more code from a mental health visit only, during year of patient survey and preceding year in VHA data.	11.4	0.87	0.71
F. 291.89, 292.84, 296.20–296.25, 296.30–296.35, 296.50–296.55, 296.60–29665, 296.89, 300.4x, 309.0x, 309.28, 311.xx. One or more code, during year of patient survey and preceding year in VHA or Medicare data	18.5	0.80	0.75
G. 296.20–296.25, 296.30–296.35, 296.50–296.55, 300.4x, 309.0x, 309.28, 311.xx. One or more code, during year of patient survey and preceding year in VHA data.	4.5	0.90	0.67
H. 296.2x, 296.3x, 311. One or more code, during year of patient survey and preceding year in VHA data.	14.0	0.84	0.72

After: Frayne SM, Sharkansky EJ, Wang D, Berlowitz DR, Rosen CS: Using administrative data to identify mental illness: What approach is best? *Am J Med Quality* 2010;25(1) 42–50. Criterion standard is a survey item in which patients are asked: "Has a doctor ever told you that you have [depression]?"