

Strategies for the Use of Real-World Data to Conduct COVID-19-Related Pharmacoepidemiology Studies

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Introduction

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RWD and COVID-19

The pandemic has demanded the rapid conduct of assessments of COVID-19 natural history and treatment utilization, safety, and effectiveness

There are important considerations for studying COVID-19 in general, and with RWD:

- > Near real-time data challenges and opportunities
- Study-specific fit-for-purpose data assessment must be done
- COVID-related laboratory tests, diagnoses, severity, complications
- > Collaboration, transparency, and replication of key studies

Objectives

Describe key considerations, challenges to implementing pharmacoepi studies of COVID-19 with observational data

Explain how use of a Master Protocol can facilitate harmonization and evaluation of RWD across data partners

Review approaches to defining key variables of interest for COVID-19 studies (infection status, severity, complications, treatments)

Discuss the importance of promoting collaborations to enhance the validity and generalizability of pharmacoepidemiologic results

Agenda

O1 Use of Master Protocols

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02 Studying COVID-19 using inpatient EHR data

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03 Studying COVID-19 using claims data

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Collaborations - researchers, data providers, regulatory agencies

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US FDA

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A Master Protocol to Identify COVID-19 and Relevant Data in the US FDA Sentinel System

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Pandemic Response – Infrastructure Development to Facilitate Drug Safety and Effectiveness Evaluation Using RWD

• FDA formed a multidisciplinary team in March 2020 to establish COVID-19 cohorts for understanding of natural history of disease, drug safety/effectiveness using RWD



- Forward looking given:
 - Limited data on COVID-19 disease and treatments
 - Unclear how pandemic would evolve
 - Uncertainty how the federal/local policies would impact transmission dynamics

Establishing COVID-19 Cohorts to Address Needs

- Describe course and outcomes of COVID-19 illness in various demographic groups and examine changes overtime
- Determine prognostic factors for COVID-19 based on data early in course of illness
- Determine incidence, determinants of COVID-19-related complications
- Study effectiveness, safety of intervention to treat COVID-19 and its complications
- Provide a benchmark, or serve as an external control, for single-arm trials of COVID-19 treatments in relevant patient populations

Inclusive Cohort to Provide Integrated View of COVID-19 Progression



Parameters impacted by the timing, duration, and strength of behavioral intervention and healthcare resources, and vary by time and region

- Not restricted by age, sex, medical setting, pregnancy status, or any other feature
- Capture patient transitions, allow for open-ended follow-up
- Create sub-cohorts to address specific questions

Identify Key Variables in Clinical Trials and Reported Real-World Data

- Identify variables to identify patients, inclusion/exclusion criteria, exposures, outcomes, risk factors, confounders, effect modifiers, colliders
- Align variables with clinical trials to facilitate comparison of findings and interpretation of RWE
 - Inclusion/exclusion criteria, endpoints
 - Develop definitions to reflect clinical concepts (baseline COVID-19 severity categories)
- Continue to update as new information becomes available from various sources

Considerations For Alignment Between RCT and RWD

#	Baseline COVID-19 severity categorization (FDA Guidance, May 2020) *	Suggested practical severity definition for RWD **
1	Asymptomatic [SARS-CoV-2 testing] Positive testing by standard RT-PCR assay or equivalent test AND [Symptoms] No symptoms in Row 2	Asymptomatic or very mild Positive laboratory test for SARS-CoV-2 (consistent with inclusion criteria of specific study) AND No symptoms from the Conceptual Definition, Row 2 list and no pneumonia AND No initiation of any oxygen therapy or hospitalization
2	Mild illness [SARS-CoV-2 testing] Positive testing by standard RT-PCR assay or equivalent test AND [Symptoms] Could include fever, cough, sore throat, malaise, headache, muscle pain, gastrointestinal symptoms, without shortness of breath or dyspnea AND [No clinical signs indicative of Moderate, Severe, or Critical Severity]	Mild illness Positive laboratory test for SARS-CoV-2 (consistent with inclusion criteria of specific study) AND Any symptom from the Conceptual Definition, Row 2 list (<i>excluding</i> new-onset dyspnea) but no pneumonia AND ND ND ND ND ND No initiation of any oxygen therapy or hospitalization
3	Moderate illness [SARS-CoV-2 testing] Positive testing by standard RT-PCR assay or equivalent test AND [Symptoms] Could include any symptom of Mild illness or shortness of breath with exertion AND [Clinical signs] Such as respiratory rate ≥ 20 breaths per minute, saturation of oxygen (SpO2) > 93% on room air at sea level, heart rate ≥ 90 beats per minute AND [No clinical signs indicative of Severe or Critical Severity]	Moderate illness [In contrast with Mild, must have dyspnea or pneumonia or hospitalization (without ICU)] Positive laboratory test for SARS-CoV-2 (consistent with inclusion criteria of specific study) AND Any symptom from the Conceptual Definition, Row 2 list (including new-onset dyspnea) or pneumonia AND ND NO No initiation of any oxygen therapy or ICU admission or organ failure
4	Severe illness [SARS-CoV-2 testing] Positive testing by standard RT-PCR assay or equivalent test AND [Symptoms] Could include any symptom of Moderate illness or shortness of breath at rest, or respiratory distress AND [Clinical signs] Such as respiratory rate ≥ 30 per minute, heart rate ≥ 125 per minute, SpO2 ≤ 93% on room air at sea level or PaO2/FiO2 <300	Severe illness [In contrast with Moderate, must have initiation of any oxygen therapy (without intubation/IMV or ECMO) or admission to ICU] Positive laboratory test for SARS-CoV-2 (consistent with inclusion criteria of specific study) AND Any symptom from the Conceptual Definition, Row 2 list (including new-onset dyspnea) or pneumonia AND Hospitalization or admission to ICU but no intubation/IMV or ECMO and no organ failure
5	Critical illness [SARS-CoV-2 testing] Positive testing by standard RT-PCR assay or equivalent test AND Evidence of critical illness, at least one of the following: [1. Respiratory failure] At least one: endotracheal intubation and mechanical ventilation, oxygen delivered by high-flow nasal cannula (heated, humidified, oxygen delivered via reinforced nasal cannula at flow rates > 20 L/min with fraction of delivered oxygen ≥ 0.5), noninvasive positive pressure ventilation, ECMO, or clinical diagnosis of respiratory failure (i.e., clinical need for one of the preceding therapies, but preceding therapies not able to be administered in setting of resource limitation) OR [2. Shock] Systolic blood pressure < 90 mmHg, or diastolic blood pressure < 60 mmHg or requiring vasopressors	Critical illness Positive laboratory test for SARS-CoV-2 (consistent with inclusion criteria of specific study) AND Organ failure recorded during a hospitalization or evidence of intubation/IMV or ECMO

* US Food and Drug Administration. COVID-19: Developing Drugs and Biological Products for Treatment or Prevention Guidance for Industry, May 2020

** COVID-19 Natural History Master Protocol, October 2020 https://www.sentinelinitiative.org/methods-data-tools/methods/master-protocol-development-covid-19-natural-history

Considerations For Specific Populations

		Priority for Specific Population			
Data Elements Wishlist (Source: clinical trials, individual case reports, observational studies, professional society/group recommendations, federal partners, other stakeholders)	Adults	Pediatrics	Pregnant Women	Patients Receiving COVID-19 Meds	
Demographics					
- Age, sex, race, ethnicity, Smoking, alcohol, height, weight, etc.					
Pre-existing conditions					
- Allergy, asthma, COPD, hypertension, diabetes, cardiovascular, cerebrovascular, neurological disease, chronic kidney disease, chronic liver disease, malignancy, HIV, organ transplantation, stem cell transplantation, rheumatic disease, sickle cell disease, G6PD deficiency, congenital malformation, etc.					
Concomitant medications for comorbidities					
- Immunosuppressive therapy, immunostimulant therapy, ACEi/ARB, NSAIDS, antiviral therapy, antibiotic therapy, etc.					
Covid-19 signs and symptoms (Date, Time)					
- List of symptoms, respiratory rate, heart rate, blood pressure, SaO2, other variables required for defining severity, etc.					
COVID-19 lab and imaging findings (Date, Time, Results)	-				
 PCR or other clinically utilized test, SARS-CoV-2 viral load, WBC differential, hemoglobulin, anemia, platelet count, albumin, ALS, AST, creatinine, lactate dehydrogenase, creatine kinase, cardiac troponin, BNP, NT-proBNP, prothrombin, serum ferritin, CRP, IL-6, procalcitonin, chest XR, CT scan, EKG, echocardiography, etc. 					
COVID-19 Specific treatments and supportive Medications (Date, Time)					
- COVID-19 specific meds (e.g., remdesivir), non-med therapies (e.g., convalescent plasma), vasopressors, etc.					
COVID-19 progression, complications, and outcomes (Date, Time, Duration)	-				
 Respiratory failure, ARDS, shock, MODS, acute cardiac injury, arrythmia, AKI, hepatic injury, thrombotic events, neurological disorders (e.g., GBS, meningitis, encephalitis), bacterial superinfections, Kawasaki disease, multi-system hyperinflammatory syndrome, hospitalization, ICU, oxygen therapy, death, etc. 					
Pregnancy outcomes					
- Live birth term, live birth pre-term, SAB, stillbirth, termination, C-section, maternal death, pre-eclampsia, pregnancy- related thrombosis, small for gestational age, major malformations, vertical transmission, etc.					

Master Protocol Considerations in Identifying Persons with SARS-CoV-2 Infection in Sentinel



Requires Consideration of Type of Data Available: Administrative vs. Electronic Health Records

Considerations in Identifying Persons with SARS-CoV-2 Infection: <u>Diagnosis Codes</u>

ICD-10	Code Description	Crossifie
U07.1	COVID-19 identified	Specific Widely used
B34.2	Coronavirus infection, unspecified site	which y used
B97.21	SARS-associated coronavirus	Non coocific
B97.29	Other coronavirus as cause of disease	- Non-specific
J12.81	Pneumonia due to SARS-associated coronavirus	

- Validity of U07.1 unknown in Sentinel (established 1 April, 2020)
- Conducted study to assess **accuracy** of U07.1 diagnosis code

Master Protocol Considerations in Identifying Persons with SARS-CoV-2 Infection in Sentinel



Requires Consideration of Type of Data Available: Administrative vs. Electronic Health Records

Considerations in Identifying Persons with SARS-CoV-2 Infection: <u>Laboratory Tests</u>

Considerations:

- Availability of laboratory test during study period of interest
- How test is used by clinicians caring for persons with COVID-19
- Accuracy of test \rightarrow potential for misclassification

Considerations in Identifying Persons with SARS-CoV-2 Infection: <u>Laboratory Tests</u>

SARS-CoV-2 Laboratory Test	Test Considerations
Nucleic acid test	 Most widely used to detect SARS-CoV-2 High sensitivity, specificity Genetic variants may lead to false-negative results
Antigen test	 High false-negative rate vs. nucleic acid tests False-positive rate may be high, esp. if asymptomatic
Antibody test	 Determines previous viral exposure or immune status Not appropriate to identify newly diagnosed COVID-19

Dinnes J. Cochrane Database of Systematic Reviews 2021; Issue 3. Art. No.: CD013705.

Approaches to Identifying Persons with SARS-CoV-2 Infection in Sentinel Master Protocol

Classify health plan members with COVID-19 if they had:

- Ambulatory or hospital discharge ICD-10 (any position) or Positive SARS-CoV-2 nucleic acid test (any location)
- 2. Positive SARS-CoV-2 nucleic acid test (any location)
- 3. Index diagnosis in hospital
- 4. Index diagnosis in ambulatory setting

Index Date (April 2020→)

- 1st COVID-19 ICD-10 date
- Specimen collection date for 1st SARS-CoV-2 lab test

Master Protocol Assessment of Severity of COVID-19 at Diagnosis: Scheme #1

COVID-19 Severity	Criteria
Asymptomatic or very mild	No symptoms or pneumonia AND No initiation of oxygen therapy or hospitalization
Mild	Any symptom (<i>excluding</i> new-onset dyspnea) but no pneumonia AND No initiation of oxygen therapy or hospitalization
Moderate	Any symptom or pneumonia AND No initiation of oxygen therapy, ICU admission, or organ failure
Severe	Any symptom or pneumonia AND ICU admission, but no mechanical ventilation or organ failure
Critical	Organ failure or mechanical ventilation

Master Protocol Assessment of Severity of COVID-19 at Diagnosis: Scheme #1

COVID-19 Severity		Fever, cough, sore throat, malaise, headache, muscle pain, GI symptoms, dyspnea
Asymptomatic or very mild	No symptoms or pneumonia AND No initiation of oxygen therapy or hospitalization	
Mild	Any symptom (<i>excluding</i> new-onset dyspnea) but no pneumonia AND No initiation of oxygen therapy or hospitalization	
ModerateAny symptom or pneumonia AND No initiation of oxygen therapy, ICU admission, or organSevereAny symptom or pneumonia AND ICU admission, but no mechanical ventilation or organ		
Critical	Organ failure or mechanical	ventilation

Master Protocol Assessment of Severity of COVID-19 at Diagnosis: Scheme #2

COVID-19 Severity	Criteria
Mild	Not hospitalized
Moderate	Hospitalized, but not admitted to ICU or mechanically ventilated
Severe	Hospitalized plus either admitted to ICU or mechanically ventilated

Master Protocol <u>Baseline</u> Data to Collect for Pharmacoepidemiologic Analyses of COVID-19

Data Element(s)	Potential Variables to Collect (Examples)
Demographics	Age at diagnosis, sex, race/ethnicity, geographic location
Pre-Existing Conditions	Pregnancy, cardiovascular disease, diabetes, hypertension, liver disease, kidney disease, COPD, current smoking, alcohol abuse
Pre-Existing Medications	Statins, ACE/ARBs, anticoagulants, anti-platelet drugs
Laboratory Results	Hemoglobin, platelets, serum creatinine, liver function
Vital Signs	Blood pressure, respiratory rate, heart rate, O ₂ saturation
Radiographic Reports	Chest X-ray, chest CT, chest MRI

Master Protocol <u>Longitudinal</u> Data to Collect for Pharmacoepidemiologic Analyses of COVID-19

Data Element(s)	Potential Variables to Collect (Examples)
Medications	Statins, ACE/ARBs, anticoagulants, anti-platelet drugs
Laboratory Results	Hemoglobin, platelets, serum creatinine, liver function, D-dimer
Vital Signs	Blood pressure, respiratory rate, heart rate, O ₂ saturation
Radiographic Reports	Chest X-ray, chest CT, chest MRI
SARS-CoV-2 Treatments	Remdesivir, dexamethasone, plasma, monoclonal antibodies, baricitinib
COVID-19 Supportive Therapies	Supplemental O ₂ , high flow nasal cannula, mechanical ventilation, extracorporeal membrane oxygenation
COVID-19 Complications	Acute DVT, acute PE, pneumonia, bacterial infections, fetal demise, death

Sentinel Master Protocol Includes Important Data Considerations for COVID-19 Analyses

- Duration of baseline period \rightarrow may vary by data source
- Need to explore ascertainment, completeness of variables → SARS-CoV-2 tests, D-dimer, O₂ saturation, inpatient meds
- Missing data \rightarrow race, symptom onset, over-the-counter meds
- Uncertain validity of variables \rightarrow supplemental O₂, COVID-19 severity
- Need to review medical records \rightarrow validations, extract radiographic reports

Sentinel Master Protocol Considers Important Potential Limitations for COVID-19 Analyses

Misclassification bias

- SARS-CoV-2 diagnosis, COVID-19 severity, supplemental O₂
- Validation studies

Selection bias

- Variability in SARS-CoV-2 testing over time, by disease severity and geographic location
- Sensitivity analyses: by time periods, COVID-19 severity, setting of diagnosis, location

Protopathic bias

- Medications may be prescribed for early symptoms of disease not yet diagnosed
- Sensitivity analyses: examine different exposure windows prior to COVID-19 diagnosis

Collider bias

- Likelihood of being sampled relates to risk factor and outcome of interest
- Sensitivity analyses: probability weighting of sample, negative control analyses

<u>Summary</u>: Utility of Master Protocol^{*} for Pharmacoepidemiologic Analyses of COVID-19

- Global need for rapid acquisition of data across different settings, subgroups
- Facilitate harmonization of study designs, methods across data sources
- Assess homogeneity of findings across data sources, regions, countries
- Promote collaboration, communication across regulatory agencies

* Access at: https://www.sentinelinitiative.org/methods-data-tools/methods/master-protocol-development-covid-19-natural-history

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Studying COVID-19 Using Inpatient EHR Data

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Inpatient EHR Data During the COVID-19 Pandemic

- Pharmacoepidemiologists need to understand the clinical course of COVID-19 to support assessments of the safety and effectiveness of drugs
- Requires detailed inpatient data
 - In the US claims data can be inadequate for this purpose, and EHRs are often not linked to other data sources
- Detailed real-time information on hospitalized patients on a large scale can only come from inpatient EHR
 - Capturing / analyzing data during a public health emergency is a challenge
 - Need for near real-time surveillance for large and diverse patient populations is only growing
- Ongoing monitoring helps respond to on-demand questions regarding clinical characteristics of COVID-19 patients, treatments, and outcomes

Leveraged Sentinel's Pandemic Preparation Activities* at HCA Health Care: Hospitalizations with Influenza, March 2017 - March 2020



- Routine reports on patterns of care and clinical outcomes
- Direct engagement
 with system experts
 <u>very</u> helpful

*Assessing Sentinel System Capability to Collect and Analyze Medical Countermeasure Data for the FDA Office of Counterterrorism and Emerging Threats (OCET): <u>https://www.sentinelinitiative.org/methods-data-tools/methods/assessing-sentinel-system-capability-collect-and-analyze-medical</u>



REVIEW 🔂 Free Access

A COVID-19-ready public health surveillance system: The Food and Drug Administration's Sentinel System

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Currently Available Data Sources for Sentinel

Multi-Modal System



Inpatient EHR Data in the Time of COVID-19

Inpatient EHRs provide

- Near real-time data for surveillance
- Detailed clinical information about care received in hospital

Important Challenges and Considerations

Data completeness -real-time data

Identifying persons with COVID-19 – inpatient tests

Patient characteristics – during stay only, self-reported race/ethnicity

High risk conditions- coded during stay

Inpatient treatments, supportive therapies - care received in hospital

Complications and death – inpatient only

Deep understanding of source data – engage with clinicians



Inpatient EHR Data Analyzed for COVID-19 Studies

When working with "fresh data" – must balance freshness with completeness

- How frequently to update, and what data streams are needed?
- Interoperability- (e.g., Meditech, Epic)
- What variables need standardization?
 - Coded data (e.g., ICD-10-CM) may not be sufficient
- To ensure complete: restricting data pulls to discharged patients "completely coded"
- Direct engagement with system experts <u>very</u> helpful



COVID-19 Hospitalizations by Admission Week, Data Pulled Late January 2020 (n=140 hospitals)


How to Identify Persons with COVID-19?

- COVID-19 diagnosis or laboratory confirmed cases?
 - PPV of inpatient COVID-19 diagnosis compared to SARS-CoV-2 tests during pandemic is expected \uparrow
 - If **incidence** \downarrow may change
 - Inpatient EHR data may only contain detail about laboratory tests conducted **in same** hospital
 - Recent analyses across 140 hospitals- 79% hospitalized adults with record of SARS-CoV-2 test during hospitalization- 97% of these had + result (majority PCR)

ICD Code	Date Established	Description
B34.2	10/1/2015	Coronavirus infection, unspecified
B97.2	10/1/2015	Coronavirus as the cause of diseases classified elsewhere
B97.21	10/1/2015	SARS-associated coronavirus causing diseases classified elsewhere
B97.29	10/1/2015	Other coronavirus as the cause of diseases classified elsewhere
J12.81	10/1/2015	Pneumonia due to SARS-associated coronavirus
U07.1	4/1/2020	COVID-19
J12.82	1/1/2021	Pneumonia due to coronavirus disease 2019

Considerations for Inpatient SARS-CoV-2 Tests

		mple SARS-COV-2 PCR lest				
Proc_Mnem	Proc_Name	Clinical_Proc_EMR_ID	Code			
COVID19CALL	STATE CALL TEST	N/A				
COV19M	SARS-CoV-2 IgM Antibody	SARS-CoV-2 IgM Antibody				
COV19G	SARS-CoV-2 IgG Antibody	SARS-CoV-2 IgG Antibody				
COVIDEVAL	Coronavirus 2019 Evaluation	Miscellaneous Test				
COVID19IH	Novel Coronavirus (2019 nCoV)	Coronavirus (COVID-19)(PCR)				
COVID19	Novel Coronavirus 2019 nCo∨	Coronavirus (COVID-19)(PCR)				
COVID19	Novel Coronavirus 2019 nCo∨	Coronavirus (PCR)				
COVID19Transfer	COVID19Transfer	Coronavirus (COVID-19)(PCR)				
COVID19CONF	Coronavirus 2019 Confirmation	Coronavirus (PCR)				
	NOVEL CORONAVIRUS 2019					
COVID19LCA	nCov	Coronavirus 2019 (NAA)				
COVID19IH	NOVEL CORONAVIRUS 2019 nCoV	Coronavirus (COVID-19)(PCR)	94532-9			
COVID19IHWH	NOVEL CORONAVIRUS 2019 nCoV	Coronavirus (COVID-19)(PCR)	94532-9			
			5			

Example SARS-CoV-2 PCR test

- Requires identifying tests- practices may vary by hospital, LOINCs* may not be available
- Can be challenging to classify test type (PCR, antibody, or antigen)
- May require consultation with individual hospitals

*Logical Observation Identifiers Names and Codes, https://loinc.org/sars-coronavirus-2/

Example results:

Considerations for Inpatient SARS-CoV-2 Tests

Example results
Presum Positive
Presumptive Pos
Negative
Confrimed Positive
Verbal Positive
Antigen POS
Positive retest IP
Negative
Not Detected
Neg
Pos
Negativ
Undet
Undetected
Detected Abnormal
Confirmed Detection
Not DetA
NegativeA
INPATIENT POS
IP NEGATIVE
Comment: Patient Neg
NEGATIVEO

0% 10% 20% 30% 40% 50% 60% 70% Asthma 7.3% Diabetes 42.7% Obesity (diagnosis and procedure codes) 29.8% Hypertension 62.1% Ischemic heart diseases 23.7% Heart failure 16.4% Myocarditis 0.3% Pericarditis 0.8% Liver and renal disorders 38.0% Hematological disorders 41.3% Smoking 8.0% Malignant cancer (diagnosis and procedure codes) 4.2% Adult hospitalizations with COVID-19 diagnosis

What Covariates to Collect? Example High-Risk Conditions Coded During Hospitalization

(N=146,814)

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What Covariates to Collect? Inpatient EHR - Race Often Well Captured



What Covariates to Collect? Inpatient EHR-Ethnicity Often Well Captured



How to Define Exposure? Inpatient Medications





- Administrations often include:
 - Date, Time
 - Dose, Route
- Many systems also have **orders**







What is most useful to your study?



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FIGURE 1 Proportion of COVID-19 hospitalizations with administration of select medications, by week, February 20, 2020-January 10, 2021, HCA Healthcare Sentinel System data. The gray bars represent COVID-19 hospitalizations independent of medication administrations. The US Food and Drug Administration issued an emergency use authorization (EUA) for remdesivir on May 1, 2020.²⁶ Preliminary results from the RECOVERY trial on dexamethasone were released June 16, 2020²⁷ [Colour figure can be viewed at wileyonlinelibrary.com]

Considerations for Identifying Inpatient Medication Administrations

- Determine which variables are standardized, and if capture differs across hospitals
 - NDC or RxNorm may not be available may need brand and generic names
 - Dose and route may not be standardized
 - Work with clinical experts, to ensure complete capture
- Consult with data partner about limitations, examples
 - Intra-operatively administered medications may not be captured
 - Pre- and post-op captured
 - Multiple-medication IV-administered preparations, may not be represented
 - Total parenteral nutrition not always be captured
 - NDCs captured may not always represent the product manufacturer

Considerations for Identifying Oxygen-related Therapy

- Important for COVID-19, previously not usually included in pharmacoepidemiology studies
- Initially observed just 28% of patients with COVID-19 had evidence of oxygen-related therapy in coded data under capture
- Solution- worked with clinical experts to determine where this information resides
 - Oxygen-related nursing documentation, devices and other notes
- Supplemented analyses with information derived from oxygen-related nursing documentation and leveraged mappings completed by clinical experts
- Significantly improved granularity and capture of oxygen-related therapy, compared to procedure codes for mechanical ventilation and supplemental oxygen

Oxygen-Related Therapy in Hospitalized <u>Adult</u> Patients with COVID-19 Diagnosis, Feb 2020 – Mar 2021

	Hospitalizations with
	COVID-19 diagnosis (N=137,565)
Oxygen-related care, nursing documentation ¹	%
Bilevel Positive Airway Pressure (BiPAP)	15%
High flow nasal cannula	24%
Nasal cannula (routine)	74%
Non-rebreather	20%
Oxygen conserving device	4%
Simple mask	13%
Ventilator*	14%
Any oxygen	78%
Any oxygen or ventilator	79%

- Nursing documentation improved both granularity and capture of oxygen-related therapy
- 79% were ventilated or on supplemental oxygen (compared to 28% in code-based definitions)
- Capture of invasive mechanical ventilation did not significantly change when using nursing documentation

Complications: Ordinal Endpoints (Using Coded Data)



(N=146,814)

Severity of COVID-19 at Diagnosis: Scheme #2

COVID-19 Severity	Criteria	Example estimate of ordinal endpoints
Mild	Not hospitalized	N/A as all patients were hospitalized
Moderate	Hospitalized, but not admitted to ICU or mechanically ventilated	50%
Severe	Hospitalized <i>plus</i> either admitted to ICU or mechanically ventilated	39%
Death	Discharged expired	11%

Summary

- Inpatient EHR data provide important clinical information, but requires deep understanding of underlying source data, workflows, and documentation
 - Comprehensive identification of medications or laboratory results requires careful mapping, and frequent updates to comprehensively identify in heterogenous systems
 - Consult with clinical experts, and with system creating data
- Challenges of real-time epidemiology- data lags, completeness*
 - Carefully consider data lags, completeness and how to address in your study
 - Often unable to examine patient characteristics, medication use, or care delivered before or after hospitalization without linking to another data source
 - No substitute for careful planning, investigating how to define exposures outcomes, and which covariates are captured will within EHR
 - Coded data have limitations, may need to use other clinical data streams to capture important variables (e.g., oxygen related therapy)

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Studying COVID-19 Using Claims Data

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Study Synopsis: Natural History of Coagulopathy in COVID-19

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US Claims Data in the Time of COVID-19

Claims data provide

- Longitudinality and information on medically attended, billed care
- Patient history not available in EHR-only data sources

Important Challenges and Considerations

Data completeness and timeliness (lags)

Cohort identification

Laboratory test results

Inpatient care – completeness, timing of 'events'/care

Certain complications of interest, severity

Death data completeness and timeliness

Generalizability



How Fresh and Complete Can the Data Be?

- The Sentinel Rapid Distributed Database was created for COVID-19
 - Two national health plans, four integrated delivery systems
- When working with "fresh data" must balance freshness with completeness
- Time to complete data varies by care setting and specific partner/source
 - Qualitative assessment: We asked the data partners how long to complete data
 - Quantitative assessment: We look at the data and calculate an 80% completeness threshold
 - Adjust study detail as needed e.g., max follow up time

Currently Available Data Sources for Sentinel

Multi-Modal System



Rapid COVID-19 Sentinel Distributed Database

- Over 55 million patient IDs
- All patients with records in 2020 contribute data, regardless of COVID-19 status

Humana Healthcare Research

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Institute for Health Research



Washington

Rapid COVID-19 Sentinel Distributed Database as of June

Data Partner	Patients with at least 1 COVID lab	COVID PCR labs	COVID diagnoses (U07.1)	80% Completeness Target	Freshest Data
DP01*	2,380,405	3,452,518	2,255,409	03/31/21	04/15/21
DP02*	746,578	1,198,117	2,076,788	03/31/21	04/30/21
DP03	224,927	358,918	32,732	04/30/21	05/11/21
DP04	396,916	625,973	89,915	03/31/21	05/14/21
DP05	180,251	371,821	39,491	04/30/21	05/07/21
TOTAL	3.9 M	5.9 M	4.2 M		

Data Completeness by Encounter Type: National Insurer



Partners are providing the *freshest feasible data* each time they refresh - data on the right tail are incomplete

- **Overall max** latest year-month with a record count within an 80% threshold of the prior month; the last day of the month is the "maximum" date
- Absolute max latest date for which any records are included; data between the overall and imputed max dates may be sparse

Data Lags for Inpatient Claims, National Insurer



How Fresh and Complete Can the Data Be?

- When working with "fresh data" must balance freshness with completeness
- Time to complete data varies by care setting and specific partner/source
- To estimate accurate incidence rates: building in up to 4-month lag for inpatient claims for the Natural History of Coagulopathy project
- Use closed/adjudicated claims only to avoid flux

Cohort Identification – Major Considerations of Laboratory Tests

Availability of labs by care setting varies by partner e.g., national claims partner have little inpatient lab results

Some partners have LOINCS*, some do not Curate and update LOINC list routinely Currently NAAT tests are limited to qualitative diagnostic tests

Data quality must be reviewed

Examine mapping from source data to CDM Clinical labs relevant for *Coagulopathy* also being reviewed

			DP 1		DP 2		
				count	% total	count	% total
	COVID-19 TEST TYPE	\rightarrow	NAAT	406,240	100	599,789	99.9
			blank			99	0.02
	TEST ORDER DATE		0	•		220,743	9 99.9 0.02 3 36.8 5 63.2 9 36.8 9 63.2 8 100 1.62 5 33.5 0.06 4 3.4 0.6 5 44.9 0.5 9 14.1 0.2 93.2 0 6.6 0.02
			1	406,240	100	379,145	63.2
→	SPECIMEN DATE		0	410	0.10	220,919	36.8 63.2 100 1.62 33.5 0.06
			1	405,830	99.9	378,969	63.2
	RESULT DATE		1	406,240	100	599,888	100
	LOINC		94309-2	406,227	100	9,728	1.62
			94500-6			201,025	33.5
			94531-1			389	0.06
			20,434	3.4			
			94534-5			4,037	0.6
			94559-2			269,305	44.9
			94565-9			2,933	0.5
			blank	•		84,759	14.1
	RESULT		BORDERLINE	•		1,250	0.2
			NEGATIVE	374,961	92.3	559,158	93.2
			POSITIVE	31,107	7.7	39,360	6.6
			UNDETERMINED	172	0.04	119	119 0.02
	PATIENT LOCATION	Γ	INPATIENT	29,144	7.17	220,743	36.8
			92.8	363,132	60.5		
			UKNOWN			16,013	2.7

Cohort Identification – Diagnosis Codes

Validation of claims-based algorithms to identify hospitalized COVID-19 events within the FDA Sentinel System – S. Kluberg et al., ICPE 2020

Overall PPV of 81% for U07.1 (Algorithm 1)

Algorithm 1: U07.1 Algorithm 2: U07.1 or B97.29 Algorithm 3: U07.1 or B97.29 or B34.2 Algorithm 4: U07.1 or B97.29 or B34.2 or J12.81 or B97.21 Algorithm 5: [U07.1 or B97.29] and [pneumonia or ARDS]

Time C, by Data Source		Positive Pred	ictive Value (95%	CI)	
Algorithm 1					
Claims	69.3% (67.5-71.0)				
Integrated Delivery Systems	93.2% (92.1-94.1)				
Algorithm 2					
Claims	69.1% (67.3-70.8)				
Integrated Delivery Systems	93.1% (92.1-94.0)				
Algorithm 3					
Claims	68.7% (66.9-70.4)				
Integrated Delivery Systems	93.0% (92.0-94.0)				
Algorithm 4					
Claims	68.6% (66.9-70.3)	_ ●			
Integrated Delivery Systems	93.0% (92.0-94.0)				
Algorithm 5	- •				
Claims	73.8% (71.8-75.7)				
Integrated Delivery Systems	94.8% (93.7-95.7)			-•-	
		70	80	90	100

Challenges with Inpatient Care in Claims Data

Clinical laboratory tests / results – incomplete

Timing of diagnoses, procedures, medications – difficult to identify

Treatment vs prophylaxis of certain medications – e.g., anticoagulants

Certain indicators of severity, endpoints, and care – difficult to identify

• Non-invasive mechanical ventilation, O2 use under captured; ICU; # days organ free support

Mortality Data

In-hospital death

Expected to be well captured – take into account lagged data Discharge disposition – alive, expired, unknown

Out of hospital death

Timing / availability varies by data source, partner type, specific partner

Cause of death

Sources: national death index, state registries, local sources, tumor registries; Timeliness is a limitation

Generalizability and Other Data 'Fitness' Considerations

- How generalizable do you need your findings to be?
 - Special populations e.g., nursing home residents
- Validated ICD-10 algorithms lacking for many outcomes (including thrombotic events)
 - Always do mapping and careful review of codes
 - Use Master Protocol where applicable
- Changes in care seeking and medical utilization during COVID will impact patient history in COVID and future non-COVID studies
- Race and Hispanic ethnicity data completeness, provenance

Summary - Claims Data for COVID-19

Strike a balance data completeness and freshness

Cohort identification – diagnoses and/or lab-confirmed

Laboratory test results – care setting, quality

Inpatient care – completeness, timing of 'events'/care

Certain complications of interest, severity

Death data completeness and timeliness

Generalizability – what matters most?



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Natural History of Coagulopathy project workgroup members

US Food and Drug Administration

Sarah Dutcher, Catherine Corey





FDA Collaborations with Researchers, Data Providers, and Regulatory Agencies

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FDA COLLABORATIONS WITH RESEARCHERS, DATA PROVIDERS, AND REGULATORY AGENCIES



OUTLINE

The Agency

Office of Surveillance and Epidemiology FDA's Sentinel

Office of the Commissioner

02

01

Other Federal Agencies

Centers for Medicare & Medicaid Services Veterans Affairs

03

Researchers and Data Providers

Reagan Udall Foundation Research Collaboration Agreements

04

International Agencies

EMA, Health Canada International Coalition of Medicines Regulatory Authorities (ICMRA)




FDA U.S. FOOD & DRUG

Use of RWD to advance the understanding of the natural history of COVID-19 in specific patient populations, as well as treatment and diagnostic patterns

Development of methods and tools to improve and streamline clinical and post-marketing evaluation of FDA-regulated products in the context of the COVID-19 pandemic



Selected Vendors	Data Asset
IQVIA	IQVIA/CARE
MITRE	Health Catalyst & Cerner
Aetion	HealthVerity & Optum EHR
UC Health*	University of California Health System

* Within the Center of Excellence in Regulatory Science and Innovation (CERSI)

Agile mode, with weekly cadence mtgs & dedicated teams (FDA & vendor)



COVID-19 Evidence Accelerator (EA)





International Coalition of Medicines Regulatory Authorities

Voluntary, executive-level, strategic coordinating, advocacy and leadership entity of regulatory authorities that during the ongoing COVID-19 pandemic is acting as a **forum to support strategic coordination and international cooperation among global medicine regulatory authorities**

International regulators agreed to cooperate in building international clinical cohorts of COVID-19 patients to conduct research using RWE, share expertise, and increase study power and data quality in order to meet regulatory requirements and address existing knowledge gaps



Surveillance of monoclonal antibodies authorized under EUA among COVID-19 patients





IMPORTANCE: Given the circumstances of emergency during the COVID-19 pandemic, Emergency Use Authorization (EUA) is granted to a number of COVID-19 drugs that meet legal criteria for issuance. Per section 564(e)(1)(A)(iii) of Federal Food, Drug, and Cosmetic Act, safety monitoring for such drugs is required to the extent practicable in the EUA conditions.

OBJECTIVE:

1. To conduct monitoring of the uptake of EUA monoclonal antibodies

2. Depending upon drug uptake, if deemed feasible, to conduct monitoring of prespecified safety signal(s)

3. If a signal is detected, to conduct signal refinement and evaluation analyses





Agency

Help inform regulatory decisionmaking Application to other EUAs Researchers and data providers

FDA's severity definition and master protocol Other Federal Agencies

Help inform decision-making



Outpatient corticosteroid use in patients with COVID-19





IMPORTANCE: The National Institutes of Health (NIH) coronavirus disease 2019 (COVID-19) treatment guidelines advise against corticosteroid use in non-hospitalized patients with mild to moderate COVID-19, in the absence of another indication

OBJECTIVE: To examine utilization patterns, characteristics, and outcomes among COVID-19 patients who have evidence of corticosteroid initiation in U.S. outpatient settings







Study Synopsis: Natural History of Coagulopathy in COVID-19

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IMPORTANCE: There are major knowledge gaps on the incidence, determinants, and consequences of arterial and venous thrombotic complications with COVID-19

AIMS:

- 1. Determine the 90-day incidence of arterial and venous thrombotic complications with COVID-19 and subsequent risk of death within 90 days of the event
- 2. Evaluate patient characteristics present prior to COVID-19 diagnosis as risk factors for arterial and venous thrombotic events
- Compare the 90-day risk of arterial and venous thrombotic events between health plan members diagnosed with COVID-19 and those diagnosed with influenza



https://www.sentinelinitiative.org/methods-data-tools/methods/assessment-natural-history-coagulopathy-covid-19 http://www.encepp.eu/encepp/viewResource.htm?id=40415





COVID-19 Pregnancy Study Protocol

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Sentinel

Alkhaiman, Longartanest of Fogalachen Molinan, Rosseel Neppin Heads Can Bartistes and Excerned Bedral School, Bordon, M. Y., Teo Meersen, Franzey Can Hatthirks, Histority of Manaschatter Medical Editods, Bildmanilery, Coler History, Borland, Barenski, Ci Yilo and Berg Admanitations, Shire Hatthianaberg, Coler History, Borlands, Barenski, Ci Yilo and Berg Admanitations, Shire Admanitations, Shire I perge, Statistan and Barenski, Ci Yilo and Berg Admanitations, Shire Admanitations, Shire Japang, Mico, Softer and View Dengs, Data Histor, Berg Admanitation, Shire Admanitation Science Japang, Nico, Softer and New Dengs, Data Histor, Berg Admanitation, Shire Robards, Shire Statistica, Shire Japang, Mico, Statist for Deng Exhauston and Bensels, UF Food and Ding Admanitoriton, Shire Tago, 2019 **IMPORTANCE:** Little information is available to support understanding the natural history of COVID-19 disease in pregnant women, or the impact of COVID-19 treatment upon pregnant women or the developing fetus

OBJECTIVES:

- (1) To estimate the prevalence of medicines used and compare this among pregnant women with COVID-19, pregnant women without COVID-19, and non-pregnant women with COVID-19
- (2) To describe severity and clinical outcomes of COVID-19 disease in pregnant women with COVID-19, according to treatments received during pregnancy, and compare these data with those of nonpregnant women of reproductive age with COVID-19



https://www.sentinelinitiative.org/methods-data-tools/methods/covid-19-pregnancy-study-implementation http://www.encepp.eu/encepp/viewResource.htm?id=39439



SUMMARY

Strengthening of existing systems/efforts already in place prior to the pandemic

Timely collaborations within and across agencies

Information sharing



Coordination leading to parallel and/or joint analyses

Validation of databases for future use

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Discussion