

In-Depth Visualization of the COVID-19 Cases Analysis in Colorado by County and Open Research Dataset Reference

Domain Description

COVID-19 is an infectious disease that causes respiratory illness. As it is becoming more widespread around the world in the past months in 2020, we need to understand and treat it from a more holistic perspective than ever before, where collected numbers of tests are merged with current research so that we could explore and discover more in common using a good visualization.

Dataset Overview

World COVID-19 Positive Cases (also Tested/Death Cases) in Time Series:

Novel Corona Virus (COVID-19) epidemiological data since 22 January 2020. The data, a CSV file in 1.2 MB, is compiled by the Johns Hopkins University Center for Systems Science and Engineering (JHU CCSE) from various sources including the World Health Organization (WHO), DXY.cn. Pneumonia. 2020, BNO News, National Health Commission of the People's Republic of China (NHC), China CDC (CCDC), Hong Kong Department of Health, Macau Government, Taiwan CDC, US CDC, Government of Canada, Australia Government Department of Health, European Centre for Disease Prevention and Control (ECDC), Ministry of Health Singapore (MOH).

Colorado Smoking Data by county:

The data, a CSV file 8KB in size, is from The State of Colorado and the Colorado Department of Public Health and Environment (CDPHE) and represents the predicted (modeled) prevalence of adults (age 18+) who currently Smoke Cigarettes for each census tract in Colorado. Currently, smoking is defined as having smoked at least 100 cigarettes (5 packs) in your lifetime and now smoke cigarettes on some days or every day. The estimates represent the average that was derived from multiple years of Colorado Behavioral Risk Factor Surveillance System data (2014-2017) that are based on statistical models and are not direct survey estimates. Using the best available data, CDPHE was able to model census tract estimates based on demographic data and background knowledge about the distribution of specific health conditions and risk behaviors. 9 census tracts are displayed in the map as "No Estimate" because of either with a known population of less than 50 (7) or exclusively containing a federal correctional institution as 100% of their population (2).

Colorado Asthma Data by county:

The data, a CSV file 286KB in size, is from The State of Colorado and the Colorado Department of Public Health and Environment and represents the predicted (modeled) prevalence of Asthma among adults (age 18+) for each census tract in Colorado. Asthma is defined as ever being diagnosed with Asthma by a doctor, nurse, or other health professionals, and still having the condition. The estimates represent the average that was derived from multiple years of Colorado Behavioral Risk Factor Surveillance System data (2014-2017). 9 census tracts are displayed in the map as "No Estimate" because of either with a known population of less than 50 (7) or exclusively containing a federal correctional institution as 100% of their population (2).

Colorado COVID-19 Positive Cases and Rates of Infection by County Data:

This dataset contains the number of COVID-19 Positive Cases by County of Identification and County Rate of Infection Per 100,000 Persons.

COVID-19 Open Research Data:

The metadata provided for papers, a 50MB CSV file, is combined from sources of CZI, PMC, BioRxiv/MedRxiv with 29500 records and 14 columns in total, where 1236 records are coming from CZI, 27337 from PMC, 566 from bioRxiv, and 361 from medRxiv. In response to the COVID-19 pandemic, the White House and a coalition of leading research groups have prepared the COVID-19 Open Research Dataset (CORD-19). CORD-19 is a resource of over 29,000 scholarly articles, including over 13,000 with full text, about COVID-19, SARS-CoV-2, and related coronaviruses. This freely available dataset is provided to the global research community to apply recent advances in natural language processing and other AI techniques to generate new insights in support of the ongoing fight against this infectious disease. There is a growing urgency for these approaches because of the rapid acceleration in new coronavirus literature, making it difficult for the medical research community to keep up.

Coming with the open research data is a collection of JSON files in 2GB that contain detailed contents of each paper included in the metadata, especially text_body, and has shared part of other columns in the open research data, including 'title', 'authors', and 'abstract'. The JSON structure stays the same for any type of source paper.

Data Quality and Cleaning

There is no obvious missing data in all 5 datasets (or compiled datasets) after exploratory data analysis, however, there is something special about one dataset, the COVID-19 Open Research Data. In the dataset, the column of 'sha' with hash is filled for 17K papers that have PDF records. One thing to notice is that one paper's metadata can be associated with more than one PDFs/shas under the paper for PMC sourced papers. The column 'has_full_text' is used to indicate whether PDF papers that were processed with full text or not, and there are 13K out of the total records. The column 'pmcid' is populated for PMC sourced papers only, while the column 'doi' is populated for those from BioRxiv/MedRxiv and others, and 'WHO #Covidence' is populated for all CZI records. 'pubmed_id' and 'Microsoft Academic Paper ID' are the columns for some of the records only.

Deriving Attributes and/or Integrating Multiple Datasets

Positive cases from World COVID-19 Positive Cases (also Tested/Death Cases) in Time Series could derive basic statistics like mean, quartiles, standard deviation, daily increase, and accumulation by country and the generated attributes could compare with each other by using either line charts or box plots, when users are interested in finding trends and fitted models for positive cases, e.g., Task 1. The datasets of Colorado Smoking Data by county, Colorado Asthma Data by county, and Colorado COVID-19 Positive Cases and Rates of Infection by County could be combined through the shared attribute 'county' so that smoking, asthma, and COVID-19 positive cases figure are easier to be shown at the same time, if users especially have some preference over checking causality between them for each county in Colorado, e.g., Task 2&3. The COVID-19 Open Research Data could work as a complementary section using NLP techniques to generate new attributes like keywords and topics, which enables the users to explore existing research papers for topics and questions of their interests related to COVID-19, e.g., for Task 4&5.

Data Abstraction

World COVID-19 Positive Cases (also Tested/Death Cases) in Time Series:

| Province/State | Country/Region | Lat | Long | 1/22/20 | 1/23/20 | 1/24/20 | 1/25/20 | 1/26/20 | 1/27/20 |
|----------------|-------------------|----------------|----------|-------------------------------|---------|---------|---------|---------|---------|
| | Thailand | 15 | 101 | 0 | 0 | 0 | 0 | 0 | 0 |
| | Japan | 36 | 138 | 0 | 0 | 0 | 0 | 0 | 0 |
| | Singapore | 1.2833 | 103.8333 | 0 | 0 | 0 | 0 | 0 | 0 |
| | Data/Dataset Type | Attribute Type | | Semantic Meaning | | | | | |
| Province/State | Position/Geometry | Categorical | | PROVINCE | | | | | |
| Country/Region | Position/Geometry | Categorical | | COUNTRY | | | | | |
| Lat | Position/Geometry | Quantitative | | LATITUDE | | | | | |
| Long | Position/Geometry | Quantitative | | LONGITUDE | | | | | |
| Date | Attribute/Table | Ordinal | | DATE SEQUENCE | | | | | |
| Value | Attribute/Table | Quantitative | | POSITIVE CASES IN TIME SERIES | | | | | |

Colorado Smoking Data by county:

| OBJECTID | COUNTY | LABEL | Per_Adults_Currently_Smoking_Cigarettes | Cigarette_Smoking_Confidence_Interval | Cigarette_Smoking_Colorado_Estimate |
|---|-------------------|------------|---|--|--|
| 1 | LARIMER | Larimer | 12.93 | County/Regional Estimate 12.9% (95% C.I.: 11.2 - 14.7) | State Estimate 15.4% (95% C.I.: 14.9 - 15.9) |
| 2 | LAS ANIMAS | Las Animas | 20.32 | County/Regional Estimate 20.3% (95% C.I.: 14.1 - 26.5) | State Estimate 15.4% (95% C.I.: 14.9 - 15.9) |
| 3 | FREMONT | Fremont | 22.26 | County/Regional Estimate 22.3% (95% C.I.: 17.3 - 27.2) | State Estimate 15.4% (95% C.I.: 14.9 - 15.9) |
| | Data/Dataset Type | | Attribute Type | | Semantic Meaning |
| OBJECTID | Attribute/Table | | Ordinal | | OBJECTID |
| COUNTY | Position/Geometry | | Categorical | | COUNTY |
| LABEL | Position/Geometry | | Categorical | | COUNTY |
| Per_Adults_Currently_Smoking_Cigarettes | Attribute/Table | | Quantitative | | CIGARETTES PER ADULT |
| Cigarette_Smoking_Confidence_Interval | Attribute/Table | | Quantitative | | COUNTY CIGARETTE ESTIMATE CI |
| Cigarette_Smoking_Colorado_Estimate | Item/Table | | | | STATE CIGARETTE ESTIMATE |

Colorado Asthma Data by county:

| OBJECTID | Census_Tract_FIPS | Census_Tract_Name | County_Name | Adult_Population_Age18_and_over | Health_Statistics_Region | Asthma_Census_Tract_Estimate | Asthma_Estimate_Confidence_Interval | Asthma_Map_Symbol_withinHSR | Asthma_Map_State | Asthma_State_Estimate |
|-------------------------------------|-------------------|--|----------------|---------------------------------|--------------------------|------------------------------|-------------------------------------|-----------------------------|--|--|
| 1 | 8043979000 | Census Tract 9790, Fremont County, Colorado | Fremont | 2994 | 13 | 9.1 | 95% C.I.: 7.9 - 10.5 | Fourth Quintile | County/Regional Estimate 9.9% (95% C.I.: 7.1 - 12.8) | Fourth Quintile State Estimate 8.9% (95% C.I.: 8.5 - 9.2) |
| 2 | 8045951600 | Census Tract 9516, Garfield County, Colorado | Garfield | 2800 | 12 | 7.9 | 95% C.I.: 6.8 - 9.2 | Middle Quintile | County/Regional Estimate 5.1% (95% C.I.: 3.1 - 7.1) | Lowest Quintile State Estimate 8.9% (95% C.I.: 8.5 - 9.2) |
| 3 | 8069002803 | Census Tract 28.03, Larimer County, Colorado | Larimer | 97 | 2 | 9.8 | 95% C.I.: 8.8 - 10.8 | Highest Quintile | County/Regional Estimate 8.4% (95% C.I.: 7 - 9.7) | Highest Quintile State Estimate 8.9% (95% C.I.: 8.5 - 9.2) |
| | Data/Dataset Type | | Attribute Type | | Semantic Meaning | | | | | |
| OBJECTID | Attribute/Table | | Ordinal | | OBJECTID | | | | | |
| Census_Tract_FIPS | Attribute/Table | | Categorical | | TRACT FIPS | | | | | |
| Census_Tract_Name | Attribute/Table | | Categorical | | TRACT NAME | | | | | |
| County_Name | Position/Geometry | | Categorical | | COUNTY | | | | | |
| Adult_Population_Age18_and_over | Attribute/Table | | Quantitative | | ADULT POPULATION | | | | | |
| Health_Statistics_Region | Attribute/Table | | Categorical | | HEALTH STAT REGION | | | | | |
| Asthma_Census_Tract_Estimate | Attribute/Table | | Quantitative | | ASTHMA ESTIMATE | | | | | |
| Asthma_Estimate_Confidence_Interval | Attribute/Table | | Quantitative | | ASTHMA ESTIMATE CI | | | | | |
| Asthma_Map_Symbol_withinHSR | Attribute/Table | | Categorical | | ASTHMA MAP SYMBOL | | | | | |
| Asthma_Map_Symbol_State | Attribute/Table | | Categorical | | ASTHMA STATE SYMBOL | | | | | |
| Asthma_State_Estimate | Item/Table | | | | ASTHMA STATE ESTIMATE | | | | | |

Colorado COVID-19 Positive Cases and Rates of Infection by County:

| OBJECTID | STATEFP | COUNTYFP | GEOID | COUNTY | LABEL | FULL_ | Number_of_COVID_positive_cases_ | County_Population | Rate_per_100_000 | State_Population | State_Number_Positive_Cases_wit | State_Number_Positive_Cases_Tot | Data_Source | Date | State_Number_Test | State_Number_Hospitalizations | State_Deaths | Shape_Area | Shape_Length |
|----------|---------|----------|-------|----------|----------|-----------------|---------------------------------|-------------------|------------------|------------------|---------------------------------|---------------------------------|--------------|-----------|-------------------|-------------------------------|--------------|------------|--------------|
| 1 | 8 | 109 | 8109 | SAGUACHE | Saguache | Saguache County | 0 | 6829 | 0 | 5695430 | 13 | 277 | Colorado Dep | 19-Mar-20 | 2952 | 38 | 2 | 1.3274E+10 | 529491.079 |
| 2 | 8 | 115 | 8115 | SEDGWICK | Sedgwick | Sedgwick County | 0 | 2275 | 0 | 5695430 | 13 | 277 | Colorado Dep | 19-Mar-20 | 2952 | 38 | 2 | 2491281577 | 208249.5687 |
| 3 | 8 | 17 | 8017 | CHEYENNE | Cheyenne | Cheyenne County | 0 | 1867 | 0 | 5695430 | 13 | 277 | Colorado Dep | 19-Mar-20 | 2952 | 38 | 2 | 7613550870 | 373455.8318 |

| | Data/Dataset Type | Attribute Type | Semantic Meaning |
|---------------------------------|-------------------|----------------|------------------------------|
| OBJECTID | Attribute/Table | Ordinal | OBJECTID |
| STATEFP | Attribute/Table | Categorical | STATEFP |
| COUNTYFP | Attribute /Table | Categorical | COUNTYFP |
| GEOID | Attribute/Table | Categorical | GEOID |
| COUNTY | Position/Geometry | Categorical | COUNTY |
| LABEL | Position/Geometry | Categorical | COUNTY |
| FULL_ | Position/Geometry | Categorical | COUNTY (FULL TEXT) |
| Number_of_COVID_positive_cases_ | Attribute/Table | Quantitative | POSITIVE CASES |
| County_Population | Attribute/Table | Quantitative | COUNTY POPULATION |
| Rate_per_100_000 | Attribute/Table | Quantitative | POSITIVE CASES RATE |
| State_Population | Item /Table | | STATE POPULATION |
| State_Number_Positive_Cases_wit | Item /Table | | STATE POSITIVE CASES |
| State_Number_Positive_Cases_Tot | Item /Table | | STATE POSITIVE CASES |
| Data_Source | Attribute/Table | Categorical | DATA SOURCE (CDPHE) |
| Date | Item /Table | | LATEST DATE |
| State_Number_Test | Item/Table | | STATE TESTED CASES |
| State_Number_Hospitalizations | Item /Table | | STATED HOSPITALIZATION CASES |
| State_Deaths | Item /Table | | STATE DEATHS |
| Shape_Area | Attribute/Table | Quantitative | COUNTY SHAPE AREA |
| Shape_Length | Attribute/Table | Quantitative | COUNTY SHAPE LENGTH |

COVID-19 Open Research Data:

| sha | source_x | title | doi | pmcid | pubmed_id | license | abstract | publish_time | authors | journal | Microsoft Academic Paper ID | WHO #Covidence | has_full_text |
|-------------|----------|--------------|---------------------------|----------|-----------|---------|---------------------|--------------|---------------|----------------|-----------------------------|----------------|---------------|
| c630ebcd30 | CZI | Angiotensin- | 10.1007/s00134-020-05985- | 32125455 | cc-by-nc | | | 2020 | Zhang, Haibc | Intensive Car | 2002765492 | #3252 | TRUE |
| 53eccda7977 | CZI | Comparative | 10.1038/s41421-020-0147-1 | | cc-by | | | 2020 | Cao, Yanan; l | Cell Discover | 3003430844 | #1861 | TRUE |
| 210a892deb | CZI | Incubation P | 10.3390/jcm9020538 | | cc-by | | The geographic spre | 2020 | Linton, M. N; | Journal of Cli | 3006065484 | #1043 | TRUE |

| | Data/Dataset Type | Attribute Type | Semantic Meaning |
|-----------------------------|-------------------|-------------------|--------------------|
| sha | Attribute/Table | Categorical | PDF |
| source_x | Attribute/Table | Categorical | 4 SOURCES |
| title | Attribute/Table | Categorical | TITLE |
| doi | Attribute/Table | Categorical | ID |
| pmcid | Attribute/Table | Categorical | PMC ID |
| pubmed_id | Attribute/Table | Categorical | PUBMED ID |
| license | Attribute/Table | Categorical | LICENSE |
| abstract | Attribute/Table | Categorical | PAPER ABSTRACT |
| publish_time | Attribute/Table | Ordinal | PAPER PUBLISH TIME |
| authors | Attribute/Table | Categorical | AUTHORS |
| journal | Attribute/Table | Categorical | JOURNAL |
| Microsoft Academic Paper ID | Attribute/Table | Categorical | MICROSOFT ID |
| WHO #Covidence | Attribute/Table | Categorical | COVIDENCE |
| has_full_text | Attribute/Table | Categorical (T/F) | FULL TEXT OR NOT |

JSON File:

```

{
  "paper_id": "0a3ef8eca5d6cd4d7a0fef83335cc02a2347492c",
  "metadata": {
    "title": "Rapid Isolation of Antibody from a Synthetic Human Antibody Library by Repeated Fluorescence-Activated Cell Sorting (FACS)",
    "authors": [
      {
        "first": "Sung",
        "middle": [
          "Sun"
        ],
        "last": "Yim",
        "suffix": "",
        "affiliation": {},
        "email": ""
      }
    ]
  }
}

```

```

"paper_id": <str>,          40-character sha1 of the PDF
"metadata":
  "title": <str>,
  "authors":                list of author dicts, in order
    "first": <str>,
    "middle": <list of str>,
    "last": <str>,
    "suffix": <str>,
    "affiliation": <dict>,
    "email": <str>,
  "abstract":              list of paragraphs in the abstract
    "text": <str>,
    "cite_spans":          list of character indices of inline citations
      "start": 151,
      "end": 154,
      "text": "[7]",
      "ref_id": "BIBREF3",
    "ref_spans":            list of dicts similar to cite_spans>,
    "section": "Abstract",
  "body_text":             list of paragraphs in full body paragraph dicts look the same as above
    "text": <str>,
    "cite_spans": [],
    "ref_spans": [],
    "eq_spans": [],
    "section": "Introduction",
  "bib_entries":
    "BIBREF0":
      "ref_id": <str>,
      "title": <str>,
      "authors": <list of dict> same structure as earlier but without `affiliation` or `email`
      "year": <int>,
      "venue": <str>,
      "volume": <str>,
      "issn": <str>,
      "pages": <str>,
      "other_ids":
        "DOI": <str>,
  "ref_entries":
    "FIGREF0":
      "text": <str>,          figure caption text
      "type": "figure"
    ...
    "TABREF13":
      "text": <str>,          table caption text
      "type": "table"
  "back_matter": <list of dict> same structure as body_text

```

Task Descriptions

1. What is the current situation of COVID-19 worldwide and how long does it take to double the positive cases in each country? What are the positive cases trajectories difference?
2. How to define COVID-19 test efficiency so far?
3. Is there a deep relationship between lung-related chronic diseases and positive cases of COVID-19?
4. What do we know about COVID-19 risk factors, according to existing research papers? Are people smoking or having chronic lung diseases are prone to get infected?
5. What are good suggestions for people with lung diseases or smoking to be less likely to get infected than they are supposed to be, if the answer for task 4 is yes, based on current research of COVID-19?

Initial Visualization Design Ideas & Usage Scenario

To manifest the analysis result for Task 1 efficiently, based on side-by-side views from 'Rules of Thumb', we need multiple views that have a main view place holder of a geographic map, one view for a pie chart with basic COVID-19 positive cases composition around the world, one view for multi-filtering countries (functioning at the same time with selection on the map), and the rest are juxtaposed views for showing cases trajectories and statistical figures based on users' selection of countries, one of which is a sparklines collection panel similar to the system of LiveRAC we've learned from the textbook. A data table download toolkit will be provided for analysis results, especially for selection over a dozen countries, while the result will be shown in the sparkline view as well. Hues will work for country categories and the point size on the map could be a potential indicator for a certain statistic. Users could get a feeling what is the current COVID-19 situation worldwide from the pie chart at first, then they could use the filtering tool to select multiple countries for which they would like to compare and make predictions from modeling.

It takes a little bit of creativity for Task 2, where we need to have another panel, beside the 1st one and won't show at the same time with it, that aims to utilize 3 datasets with model fittings and diagnostics, e.g., we could create a new index, 'panic index', that is basically dividing positive cases over total tested cases, whose result will be shown in dynamic line charts. For Task 4 and 5, we are supposed to apply NLP techniques such as topic segmentation and recognition to the text_body from the combined dataset of COVID-19 Open Research Data and those JSON files based on paper_id and doc_id, whose result will be shown either through interactive clusters or networks, since the generate attributes could be treated as nodes in a network. There will be a text input placeholder for users to type in keywords or topics of their interests, e.g., "asthma, pneumonia, coronavirus, covid-19" and the result will be provided through a data table instead of plots because users are more likely to use the paper id information from the table to search the entire content online instead of a simple glancing at the result.