



@peter_m_dahu

Exploring the Geospatial Relationship between COVID-19 Positivity and Income in Mixed Urban-Rural Population

Butros M. Dahu, MBA, MS

PhD Student

University of Missouri, USA



Agenda

- Introduction & Background
- Research Methods
- Study Results
- Discussion
- Study Limitations
- Conclusion
- Future Work



Introduction & Background

- Pandemic **worsens** the existing **average income** inequalities in American society
- Wealthier areas significantly **decreased mobility** compared to the **poorer** areas
- Lower-income communities have **lower access** to healthcare and **higher levels** of preexisting health conditions



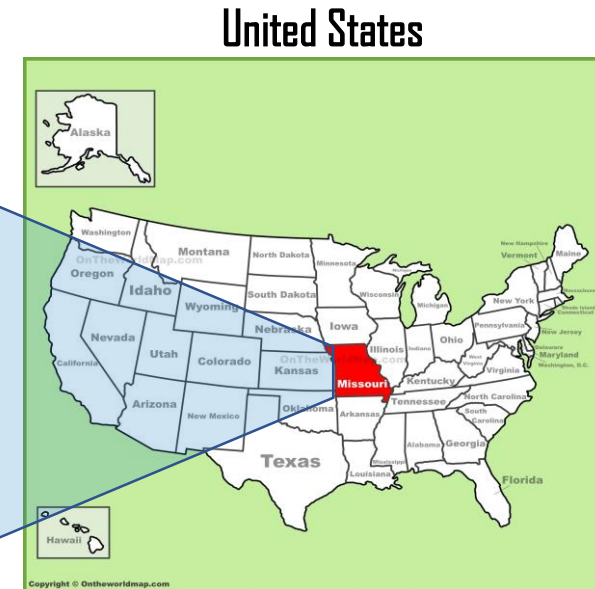
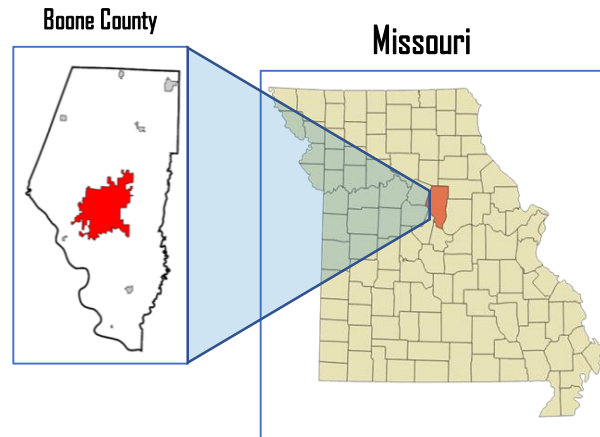
Introduction & Background

- Previous research studies have shown that there are large **spatial inequities** in COVID-19 testing, confirmed cases, mortality, and positivity rates among U.S. cities
- Showed a **strong relation** between COVID-19 testing, confirmed cases, mortality, and positivity rates with **higher** neighborhood **social vulnerability**
- Reinforced and generated due to the **residential discrimination** that is linked to structural racism & **income inequality**



Research Methods

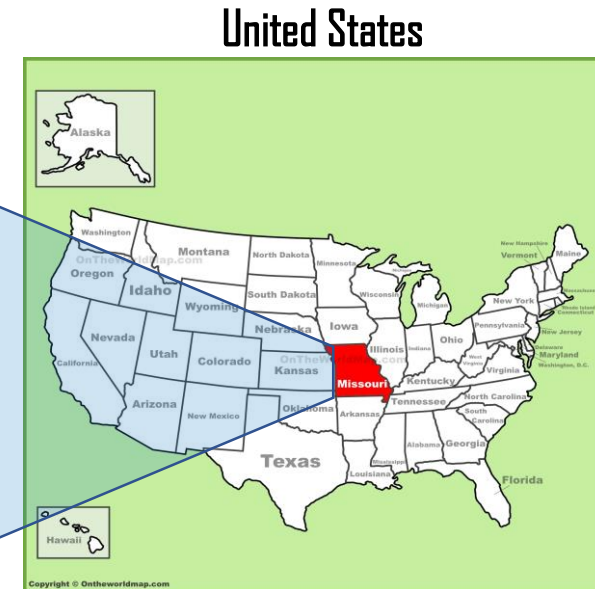
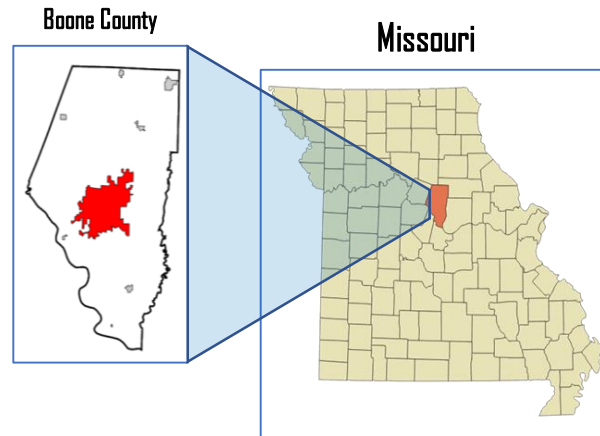
- Boone County is part of the **Mid-Missouri** geographic region within the Midwestern U.S.
- Home to **180,463** residents
- Boone County, Missouri consists of **11** primary cities and towns: **Columbia**, Ashland, Centralia, Hallsville, Harrisburg, Sturgeon, Hartsburg, Rocheport, McBaine, Huntsdale, and Pierpont; including **40 Census tracts**





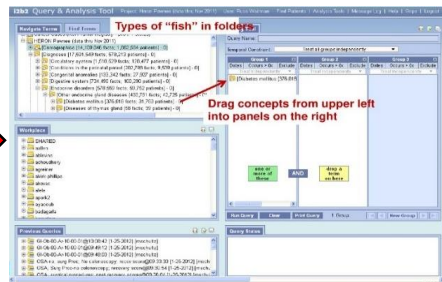
Research Methods

- Columbia is the **largest** city with a population of **126,853** residents
- Only **Urban area** in Boone County
- **Hypothesis:** individuals with **lower median income** will have **lower testing rates** and **higher positivity rates** in a mixed urban-rural population in Boone County, Missouri





Research Methods



- Data from the **Cerner Electronic Health Record (EHR)** from the University of Missouri Hospital and Clinics
 - Individuals who were **tested for COVID-19**
 - Time Period: **March 2020 and December 2021**
- More than **60 primary and specialty-care clinics** (including the Mizzou Quick Care Clinics) and the University Physicians medical group



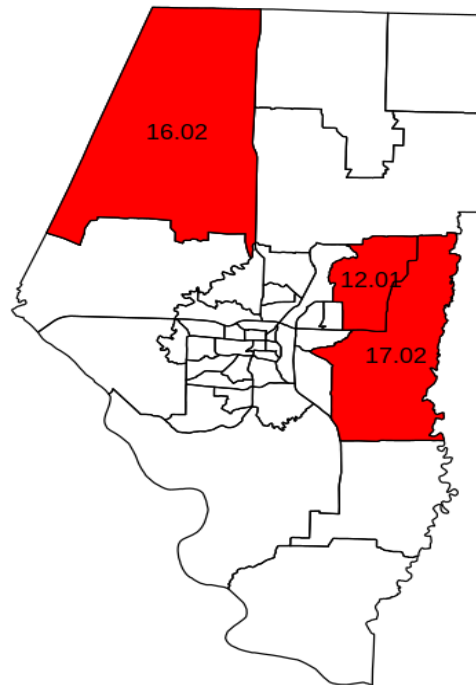
Research Methods

- Data includes the **demographic** information for **126,900** distinct patients
- **236,809** COVID tests, **15,903** which were **positive**, and **81,809** **unique addresses**
- Includes the patients' **detailed addresses**, the testing dates along with the testing locations
- Boone County, Missouri has a **median** household **income** of **\$58,740 (USD)** and income **per capita** (individual income) of **\$30,340 (USD)**



Research Methods

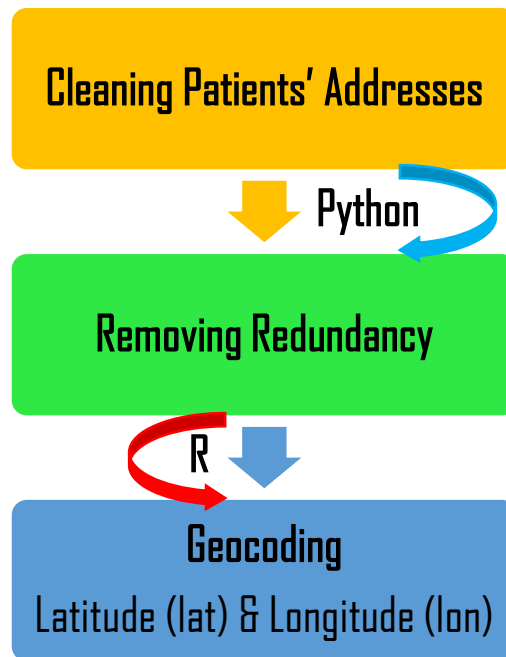
- In 2020, Census Tract **16.02** had the **highest** median household income of **\$104,632 (USD)** followed by Census Tract **12.01, \$101,529 (USD)** and Census Tract **17.02, \$95,389 (USD)**
- Geocoding can be defined as the process of **transforming** a description of a **location** such as an **address** or a **name** of a place to a location on the Earth's surface, e.g., a pair of coordinates (**latitude and longitude**)
- Geocoding allows us to take patients' information and create a **map** of their **locations**





Research Methods

- Data Cleansing:
 - **First** step focused on cleaning the **patients' addresses**
 - **Second** step focused on **removing** the **redundancy**
- Finally, we **geocoded** the data to get the latitude (**lat**) and longitude (**lon**)





Study Results

- Scatter plot of the **median income** and **positivity rate** for Boone County, Missouri tracks

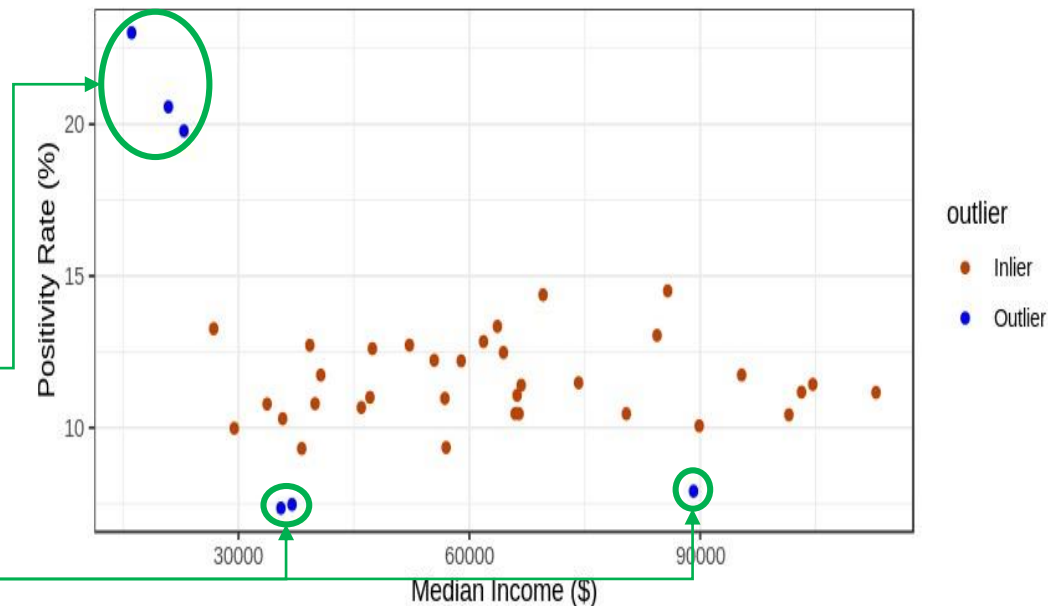
- Six outlier tracks (**blue dots**)

- Three outlier tracks shown on the **top** of the plot

- Exceptionally **high positivity rates** (higher than **19.5%**) associated with **lower median income**

- Three outlier tracks shown at the **bottom** of the plot

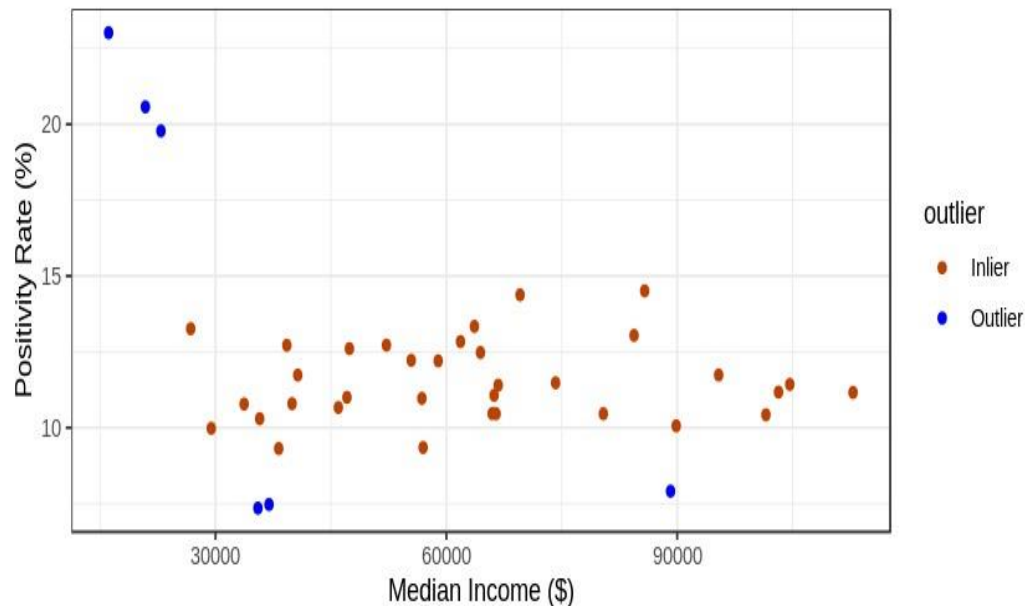
- Exceptionally **low positivity rates** (lower than **8%**)





Study Results

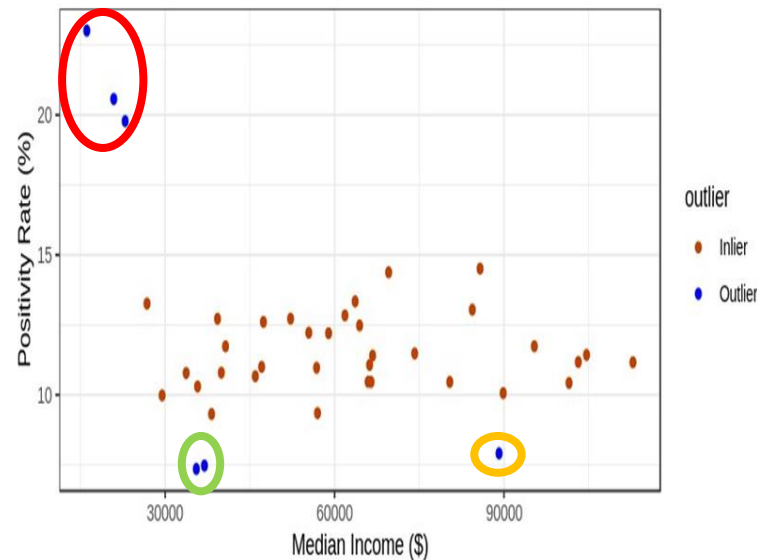
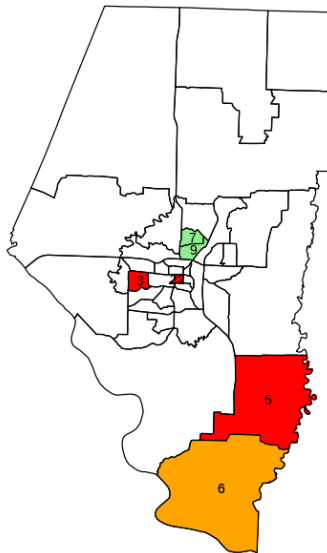
- Two tracks within the **\$37K/yr** areas
- One track within the **\$90K/yr** area
- Pearson Correlation Coefficient between the **positivity rate** and **median income** is **-0.324**
 - Indicates an **inverse relationship** between the **positivity rate** and the **median income**





Study Results

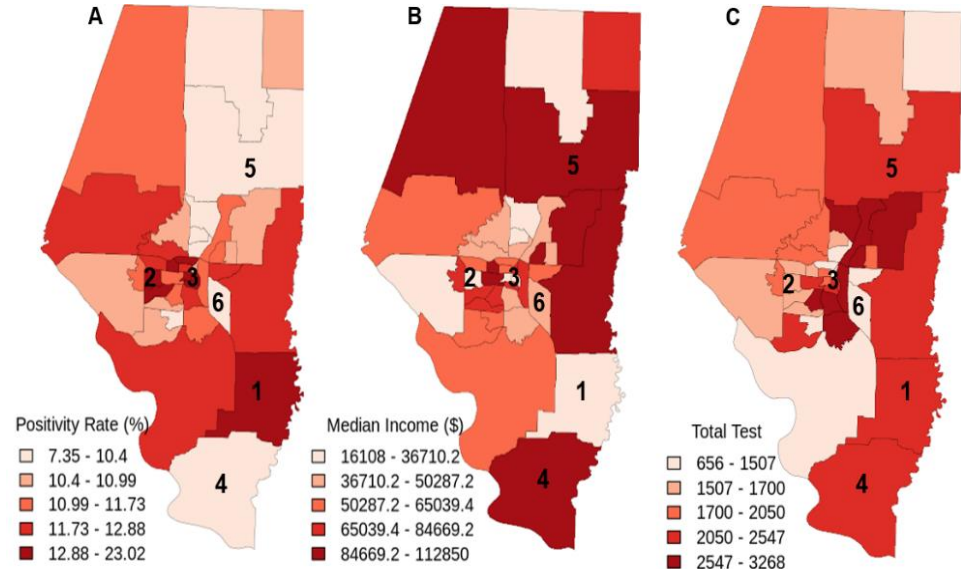
Tract Number	Positivity Rate	Median Income
3.00	19.78	22,907
5.00	23.01	16,108
6.00	7.90	89,138
7.00	7.35	35,512
9.00	7.47	36,953
22.00	20.57	20,885





Study Results

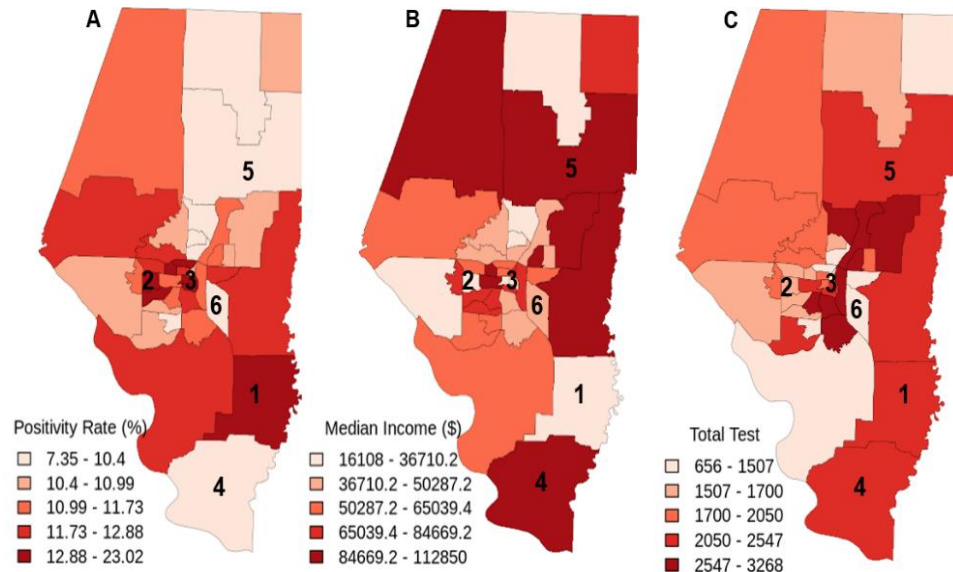
- Three **maps** of Boone County Missouri, USA
- Fig. A shows the Census tract-wise COVID-19 **positivity rate**
- Fig. B shows the Census tract-wise **median income**
- Fig. C shows the Census tract-wise **total number** of COVID-19 **tests** in 2020





Study Results

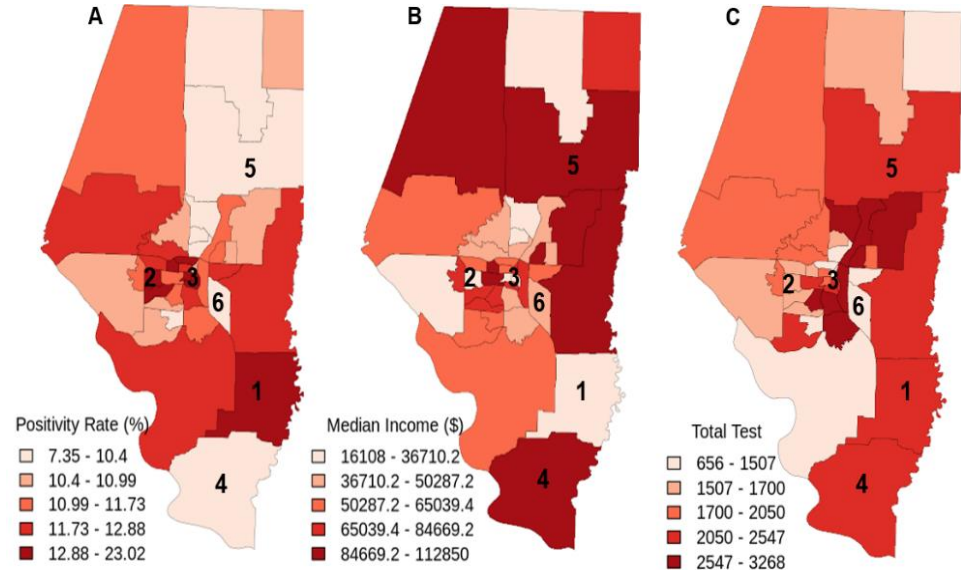
- Tracks labeled **1–3** represent the **highest positivity** rates Fig. A
- Those three tracks are associated with **lower median** income Fig. B
- Lower **total number** of COVID-19 **tests** Fig. C





Study Results

- Tracks labeled **4–6** represent the **lowest positivity** rates Fig. A
- Those three tracks are associated with **higher median** income Fig. B
- Higher **total number** of COVID-19 **tests** Fig. C





Discussion

- Upper **three outlier** tracks have an exceptionally **high positivity rates** (higher than **19.5%**) associated with **lower median income**
- The **bottom three outlier** tracks have exceptionally **low positivity rates** (lower than **8%**) with **two tracks** in the **\$37K/yr** and **one track** within the **\$90K/yr**
- From the analysis, we can conclude that tracks **1, 2, and 3** have **higher** positivity rates, **lower** median income, and a **lower** total number of tests
- On the other hand, tracks **4, 5, and 6** have **lower** positivity rates, **higher** median income, and a **higher** number of total tests



Study Limitations

- Despite the interesting findings, there are **several limitations** in our study
 - First, the **tests** have been known to have the possibility of **false positives** and **false negatives**
 - Second, we do not have **information** about the **individuals** who did not test in Boone County or tested at **some other** clinics and facilities other than the University of Missouri hospital and clinics
 - Taking into consideration that University of Missouri hospital is the **main healthcare provider** for Boone County along with **13 other surrounding counties**



Conclusion

- COVID-19 is an **ongoing** source of **threat**
- A continuous **need** for **research** studies and analyses to understand:
 - Its **behavior** and to **monitor**:
 - **Social determinants-of-health**, demographic, and **equitable distribution** of life-saving resources for fighting the virus
- From a **social-determinants-of-health** and **geospatial perspective**, our study findings
 - **Support** the **hypotheses** that **low-income** individuals have **lower** testing rates and **higher** positivity rates than **high-income** individuals in Boone County, Missouri



Future Work

- More **resources** should be allocated to the most vulnerable **income** to address the COVID pandemic in an **equitable** manner
- As such, our team is conducting **additional studies** that will include:
 - More **geospatial analysis** and **remote sensing** based on the zip code addresses and **census blocks/tracts** of the tested individuals in Boone County to:
 - Study and define the **associations** and **other features** that could be related to the testing, positivity, and death rates for COVID-19



Co-authors: High Performance Data Intensive Computing Systems Laboratory



Butros M. Dahu, MBA, MS

Doctoral Student

Health Informatics

Institute for Data Science and Informatics – High
Performance Data Intensive Computing Systems
Lab

University of Missouri



Solaiman Khan, MA

Doctoral Student

Geoinformatics

Institute for Data Science and Informatics – High
Performance Data Intensive Computing Systems Lab

University of Missouri



Lincoln R. Sheets, MD, PhD

Assistant Research Professor

Health Management & Informatics

Health Informatics

University of Missouri



Grant J. Scott, PhD

Assistant Professor

Electrical Engineering and Computer Science

Geoinformatics

Institute for Data Science and Informatics – High
Performance Data Intensive Computing Systems Lab

University of Missouri





Thank You!

Email me at: butrosdahu@mail.Missouri.edu

Twitter: [@peter_m_dahu](https://twitter.com/peter_m_dahu)