

The background of the slide is a photograph of a subway train at a station platform. The train is silver and has multiple windows. A person is standing on the platform, looking towards the train. The image is blurred, suggesting motion. A semi-transparent blue rectangle is overlaid on the image, containing the title text.

# Does public transportation decrease social isolation?

Naomi Buell & Richie Rivera  
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<b>Intro and Research Question</b>	01
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<b>Methodology and Data Sources</b>	02
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<b>Analysis</b>	03
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<b>Conclusion</b>	04
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<b>Q&amp;A</b>	05
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# Introduction

Research question: **Does access to public transportation decrease social isolation?**

## Why Social Isolation Matters

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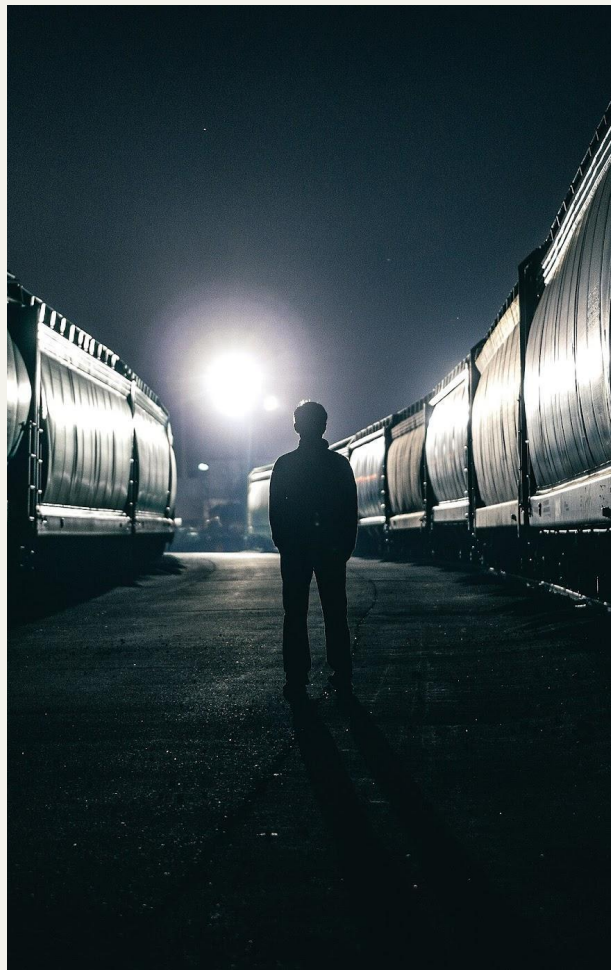
Social isolation is not having relationships, contact with, or support from others. It is a critical public health issue that **has been linked to higher rates of overall mortality** and the development of chronic disease such as **depression, cardiovascular disease, hypertension, and cancer**.

## Potential Barrier: Transportation Access

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Public transportation has been identified as a significant barrier to social engagement — particularly for **older adults**, people living in **rural areas**, or those with **mobility challenges**.

This research examines whether the availability of public transportation influences social isolation levels. Understanding this relationship can inform policies that enhance transportation infrastructure to improve social connectivity and overall well-being.



# Methodology

We performed the following:



## Data Collection

- CDC PLACES
- National Neighborhood Data Archive (NaNDA)
- Rural-Urban Commuting Area (RUCA) codes
- 2020 U.S. Census



## EDA and Cleaning

- Explored distributions and correlations of key variables
- Removed incomplete observations
- Centered and scaled predictors to normalize distributions



## Modeling

- Stratified data by rurality level
- Built separate linear models for each rurality group



## Analysis

- Observed  $R^2$  values for captured variance
- Used coefficients of scaled models to see comparative strength
- Unscaled and centered coefficients for nominal strength

# Data Sources (Census Tract-Level)

## CDC PLACES

What is the rate of social isolation?

- Model-based estimates of health outcomes, behaviors, and social needs from the CDC to support public health initiatives (2022 data)

## National Neighborhood Data Archive (NaNDA)

How many public transit stops are there?

- Public transit stop counts per capita and square mile from 270 transit agencies (2016–2018, 2024 data)

## USDA RUCA Classification Codes

How rural is the area?

- Rural, suburban, and urban classifications based on commuting patterns (2010 data)

## Census Data

What is the age distribution?

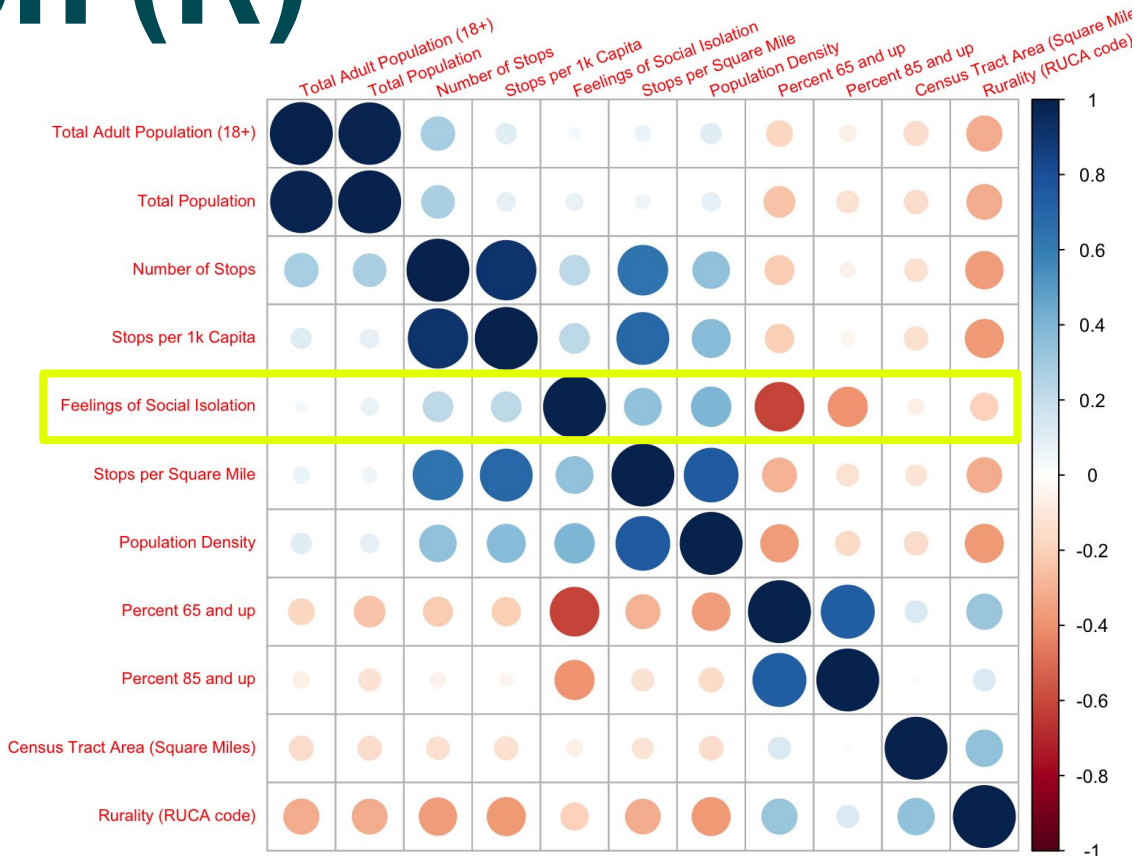
- Percentage of 65+, 85+, and 100+ year olds out of the total population (2020 data)



# Correlation (R)

Exploratory data analysis revealed counterintuitive relationships:

- More 65+ year olds = less isolation
- More population density = more isolation
- More stops = more isolation



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# Results

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# Key Findings: Urban Areas

R<sup>2</sup> of the model

44%

n = 10,000

Stops Per 1K Capita

+20%

↑ Transit stops per 1,000 people  
↑ Social Isolation

Proportion of the population 65+

-29%

↑ Percent of the population 65+  
↓ Social Isolation

Density per Square Mile

+.02%

↑ Population Density  
↑ Social Isolation



# Key Findings: Suburban Areas

R<sup>2</sup> of the model

31%

n = 3,007

Stops Per 1K Capita

+57%

↑ Transit stops per 1,000 people  
↑ Social Isolation

Proportion of the population 65+

-28%

↑ Percent of the population 65+  
↓ Social Isolation

Density per Square Mile

+.03%

↑ Population Density  
↑ Social Isolation

# Key Findings: Rural Areas

R<sup>2</sup> of the model

28%

n = 4,438

Stops Per 1K Capita

+52%

↑ Transit stops per 1,000 people  
↑ Social Isolation

Proportion of the population 65+

-27%

↑ Percent of the population 65+  
↓ Social Isolation

Density per Square Mile

+.02%

↑ Population Density  
↑ Social Isolation

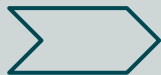
# Limitations

## Limitations

## Response

01

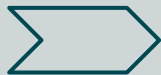
Feelings of social isolation (i.e., loneliness) as proxy for social isolation



We use loneliness as a proxy, but this is subjective; may explain unexpected trends in dense areas

02

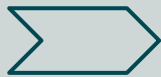
Missingness



Modeled complete cases to minimize bias

03

Temporal mismatch between transit and isolation data



Used most recent data available

04

Transit data may understate true availability



Data is voluntarily submitted, could underestimate the true impact of transit availability on isolation

# Conclusions

**Unexpected Relationship**  
More transit access linked to *higher* social isolation.

## Urban Transit Impact

This effect is biggest in the suburbs (+57% isolation).

Urban Areas are much less affected by availability of public transportation (20% vs 52/57%)

## Data Gaps

Analysis limited by missing data (esp. rurality, older adults)

Of the 6,800 supported Federal Transportation Administration agencies, only 270 provided data to the NTM

## Next Steps

Need better data (imputation, etc.) for clearer understanding

Adding more transit agencies and expanding the lists of predictors

**Q&A**

# References

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For access to the data and code used in this analysis, visit our GitHub repository: [Data 646 Final Project](#).