

# Planes, Trains, and Afflictions

Agent-based modeling for the spread of disease through transportation networks

NS Group 3

Faculty of Computer Science  
Higher School of Economics (БШЭ)  
Moscow

27 JUN 2020

# Table of Contents

- Motivation
- Prior Research
- ABM Framework
- Examples
- Deep Dive: New York City (NYC) Subway
- Discussion
- Conclusion
- Credits

# Motivation

Why were certain areas of NYC more affected by COVID-19?

How were the subways involved?

**image here of NYC afflictions**

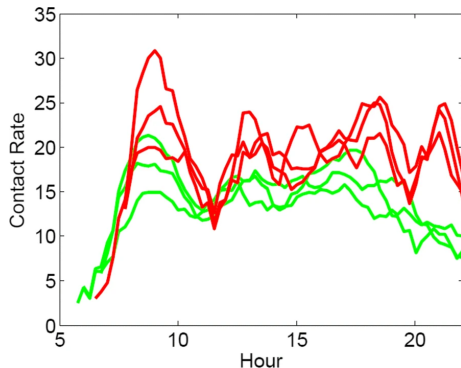
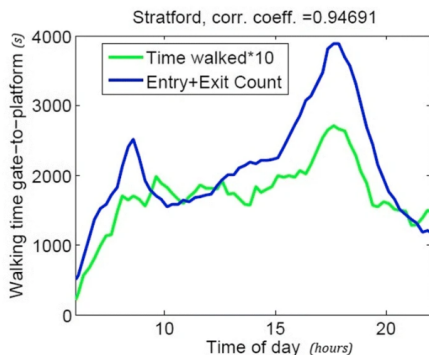
**credit: NYC DoH image here of line analysis**

credit: Jeffrey whoever mabob *Speaker's note:*

- *What is a transportation network? What is a subway? - How infections spread on transportation networks*
- *Learn*

# Prior Research (London Underground)

Data: Oyster (Card), CASA (Timetable), PHE Data (Demographics)

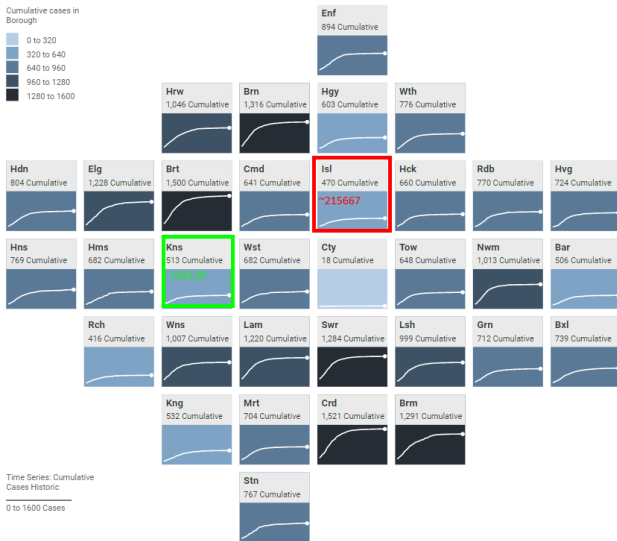


*Results show a correlation between the use of the underground and ILI cases in London, specifically they show that higher numbers of ILI cases arise in those boroughs where the population spend more time in the Underground and/or incur in a higher number of contacts when travelling. [?]*

# COVID in London

## Covid-19 Cases by London Borough (2020-03-23 to 2020-06-21)

Displaying cumulative count (all historic) at: 2020-06-21



Source: <https://coronavirus.data.gov.uk/> - Note: Data for most recent 5 days may be incomplete.

Graphic by GLA City Intelligence | London Squared Format by After The Flood

Speaker's Remark: 🔍 🔍 🔍

# Prior Research (Singapore Buses)

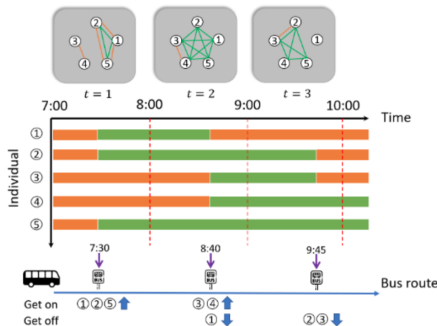
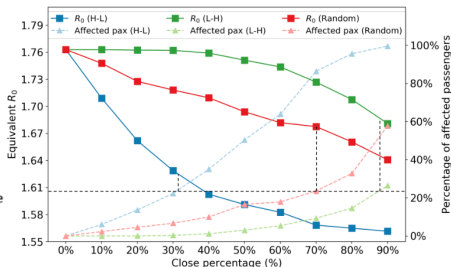


Figure 1: Network representation of a five-passenger system

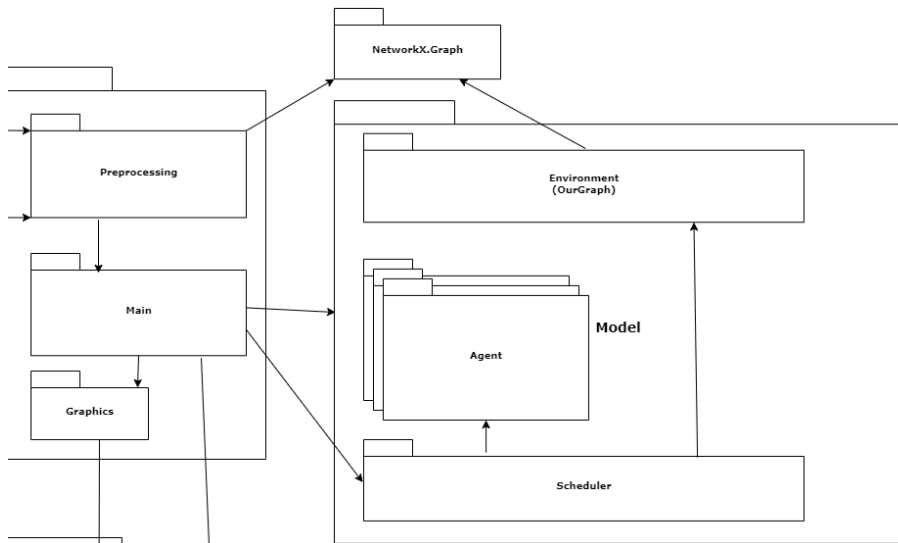


*The direct contact in trains is, however, difficult to obtain from smart card data because the transactions are recorded at the station level [?]*

*Speaker's note:*

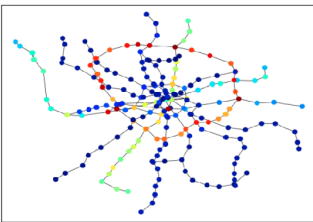
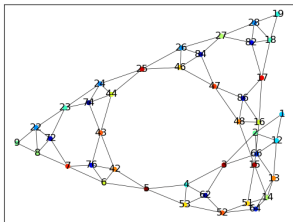
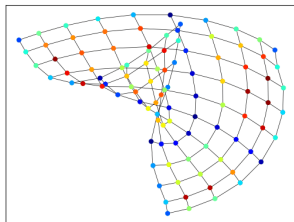
- We show these things not to embarrass ourselves, but the depth of research available even just looking at one system.
- List some other research

# ABM Framework



Components: Python, MESA, Networkx  
Transportation Model

# Simple Geometries



- Grid
- Sierpinski's Triangle
- Moscow



# World Airline Network (Passenger Flow)

Data Source (openflights, articles) Methods (ABM)

# World Airline Network (Passenger Flow)

# Madrid Commuter Trains (Central Hubs)

Data Source (madrid renfe gtfs) Methods (ABM)

# Results (Madrid)

# NYC COVID Demographics

# Subway Systems

# NYC Subway Data

*90% loss.*

# NYC Subway Modeling



# NYC Model Hyper-parameters

# Compartmental Modeling Results (NYC)

# Results by MODZCTA (NYC)

# Discussion

All models are wrong!

- Passenger Flow - Outer suburbs phenomenon exists - Simple GDP/capita data

# Conclusions

# Credits, Links, References

Frank Acquaye - WAN, Passenger Flow

Ho Lum Cheung - NYC, Organization, Research, Testing

Dimas Muñoz-Montesinos - Madrid, Hotspots

Elie Wanko - Theory, Consulting

github link references used in slides