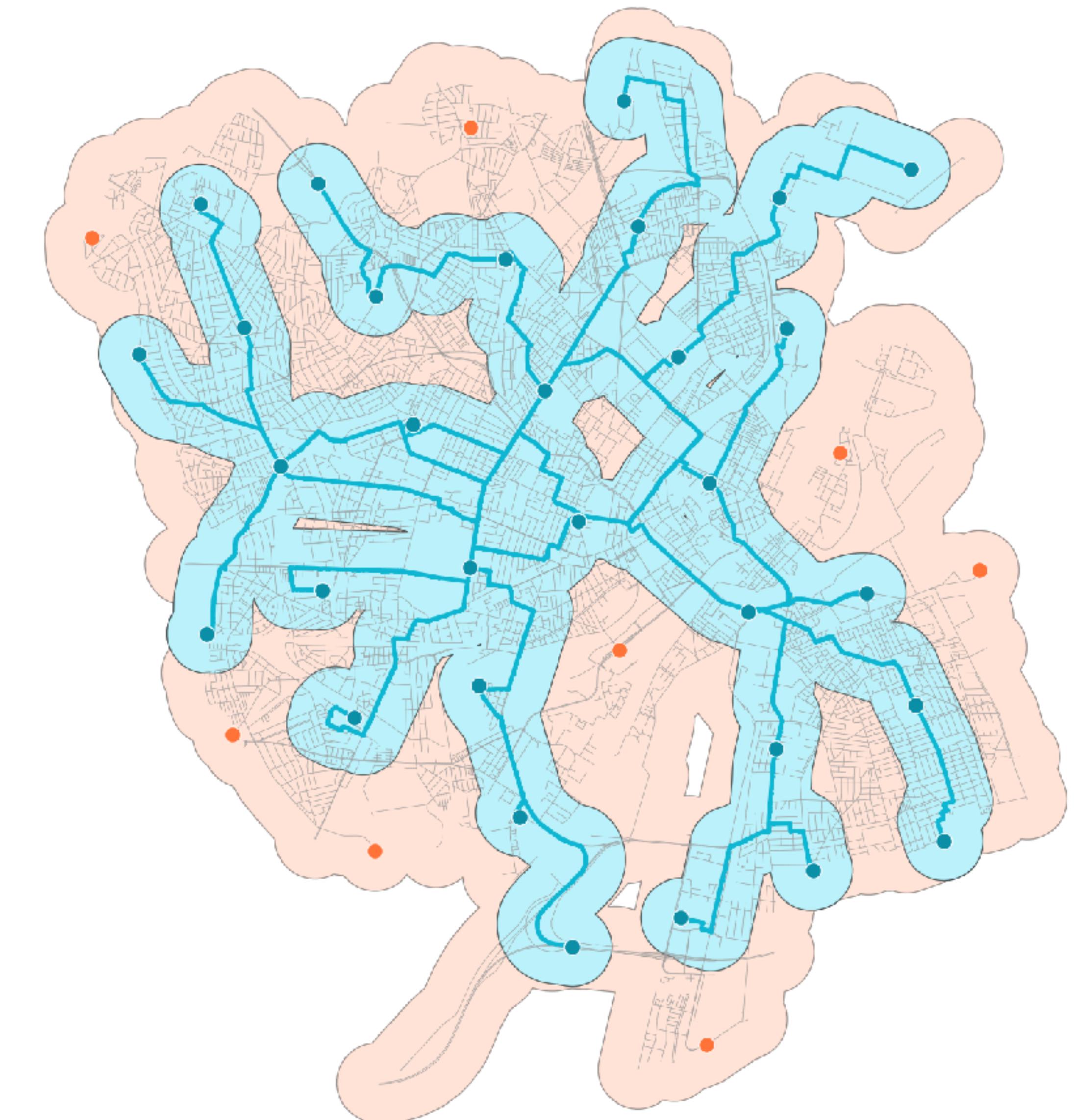


Vulnerable road users, and towards a science of bicycle networks

Michael Szell



NEtwoRks, Data, and Society (NERDS)

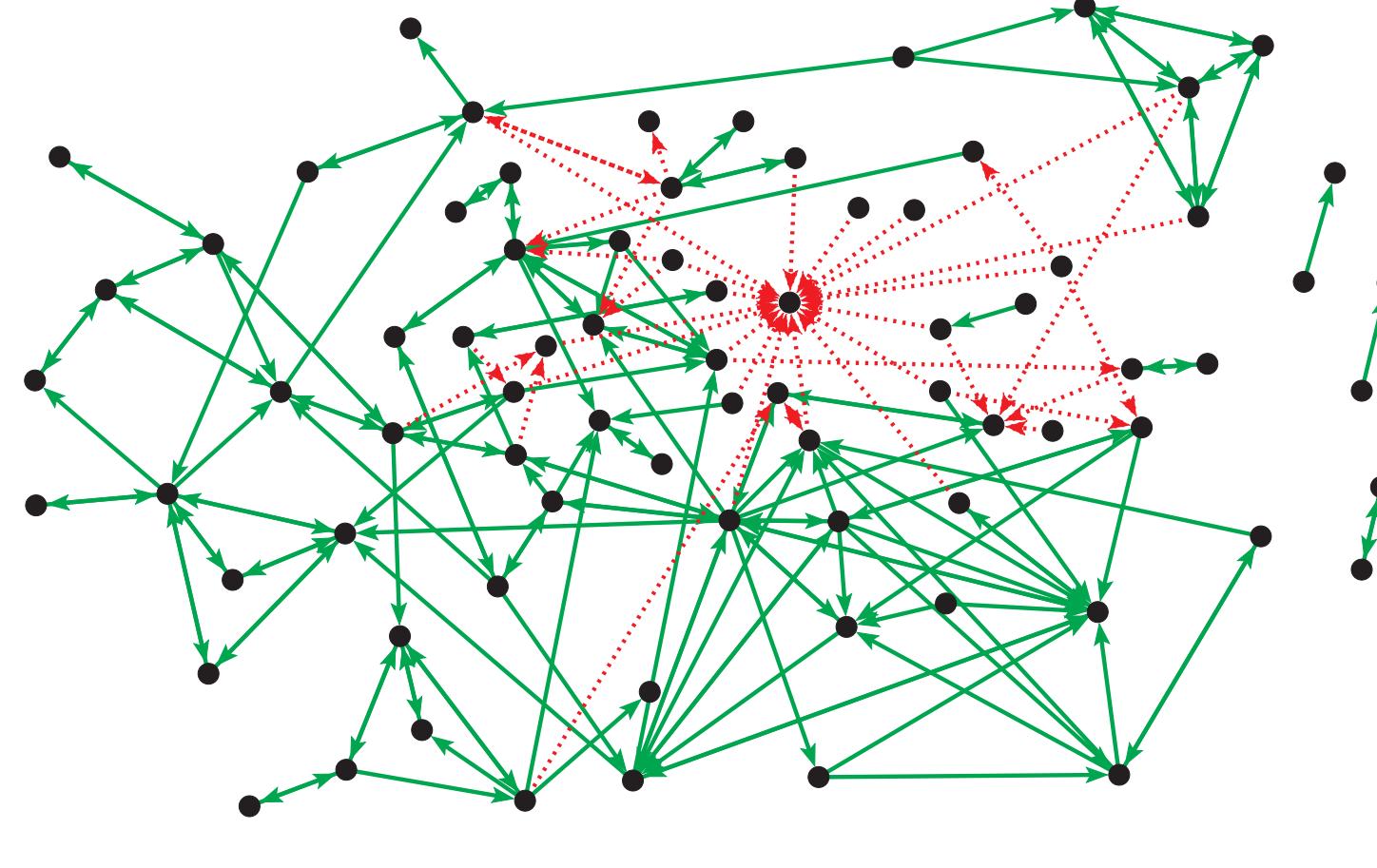


IT UNIVERSITY OF COPENHAGEN

City Interaction Lab, May 6, 2021

Interdisciplinarity is key for solving complex issues

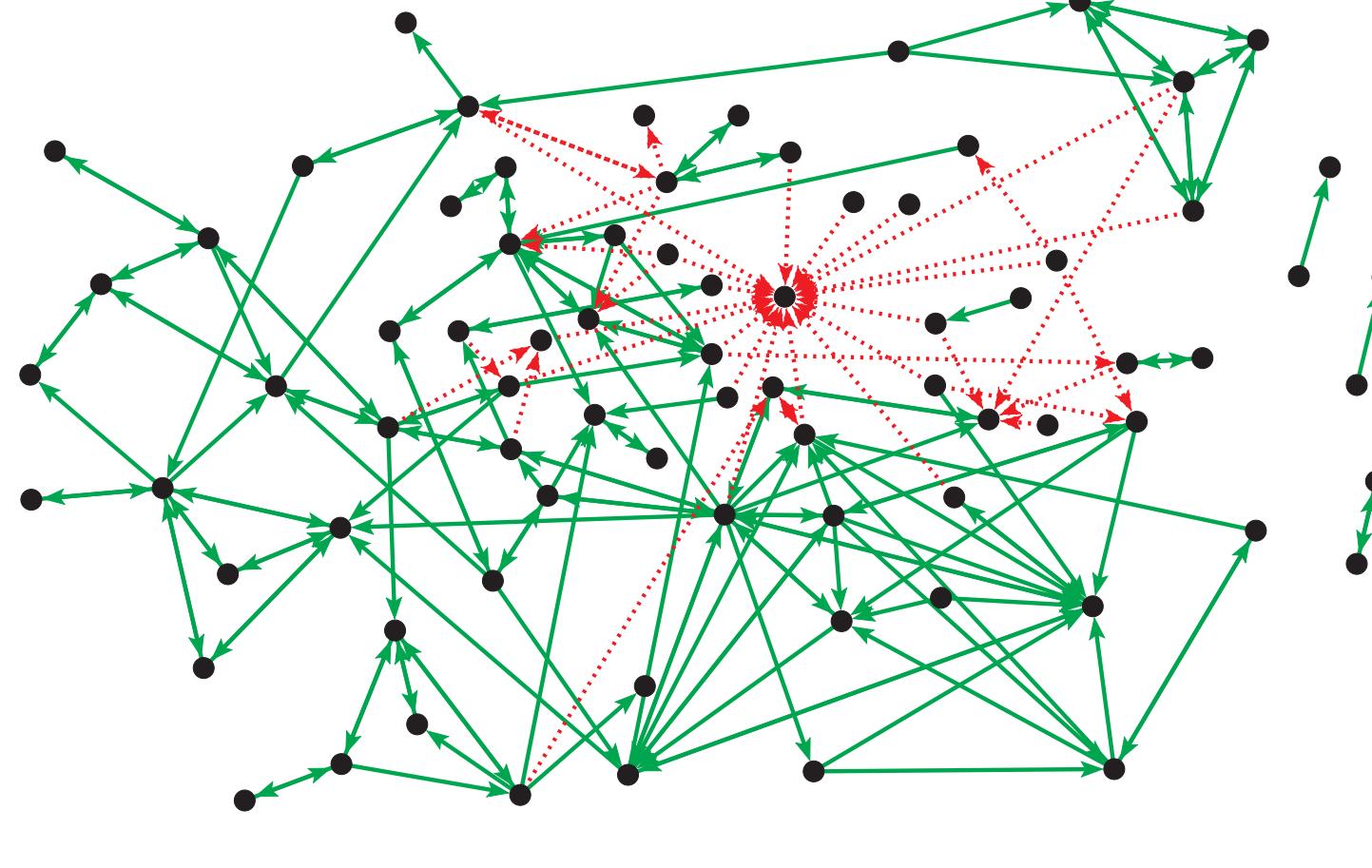
Network Science



Interdisciplinarity is key for solving complex issues



Network Science



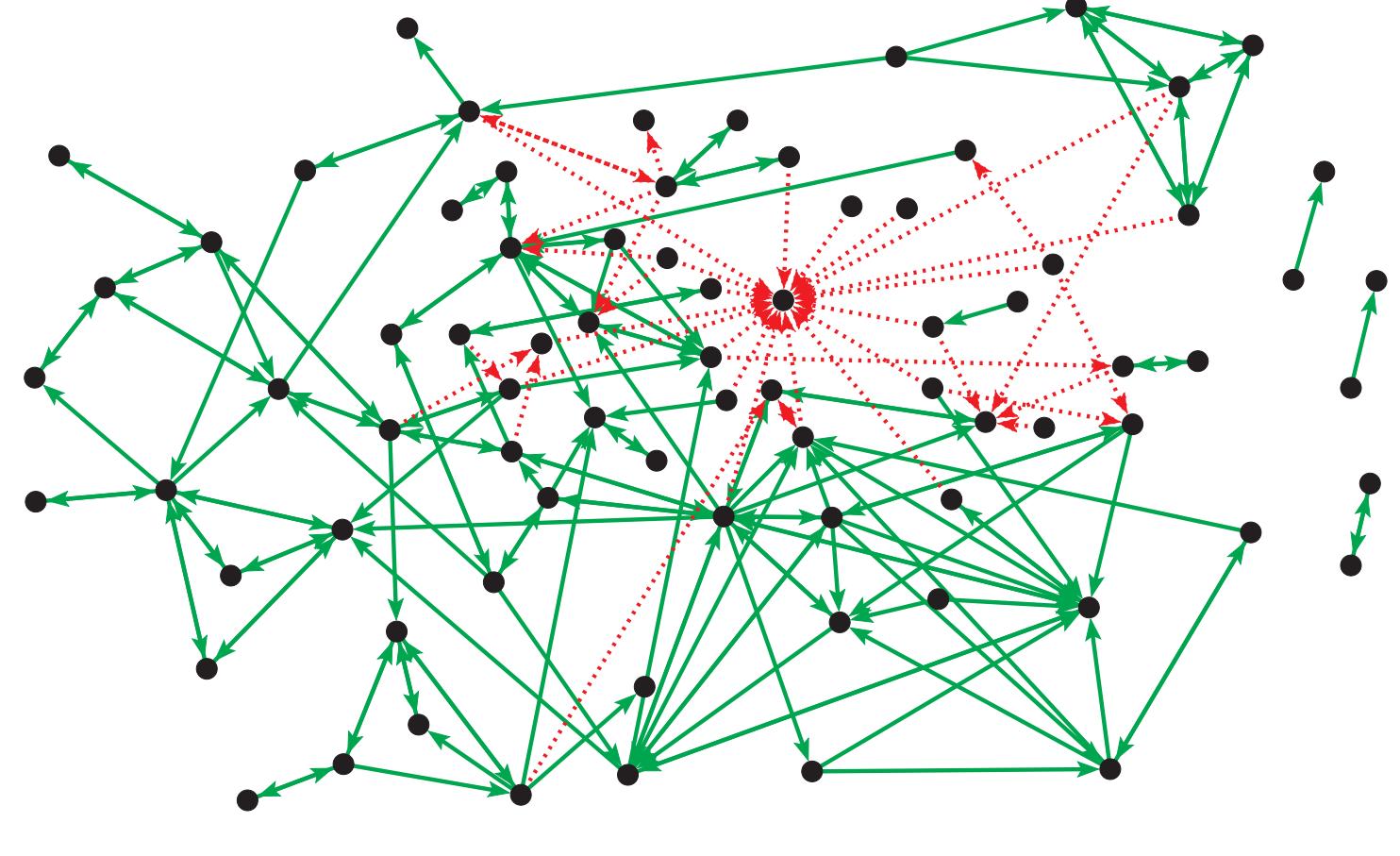
Tech Approach



Interdisciplinarity is key for solving complex issues



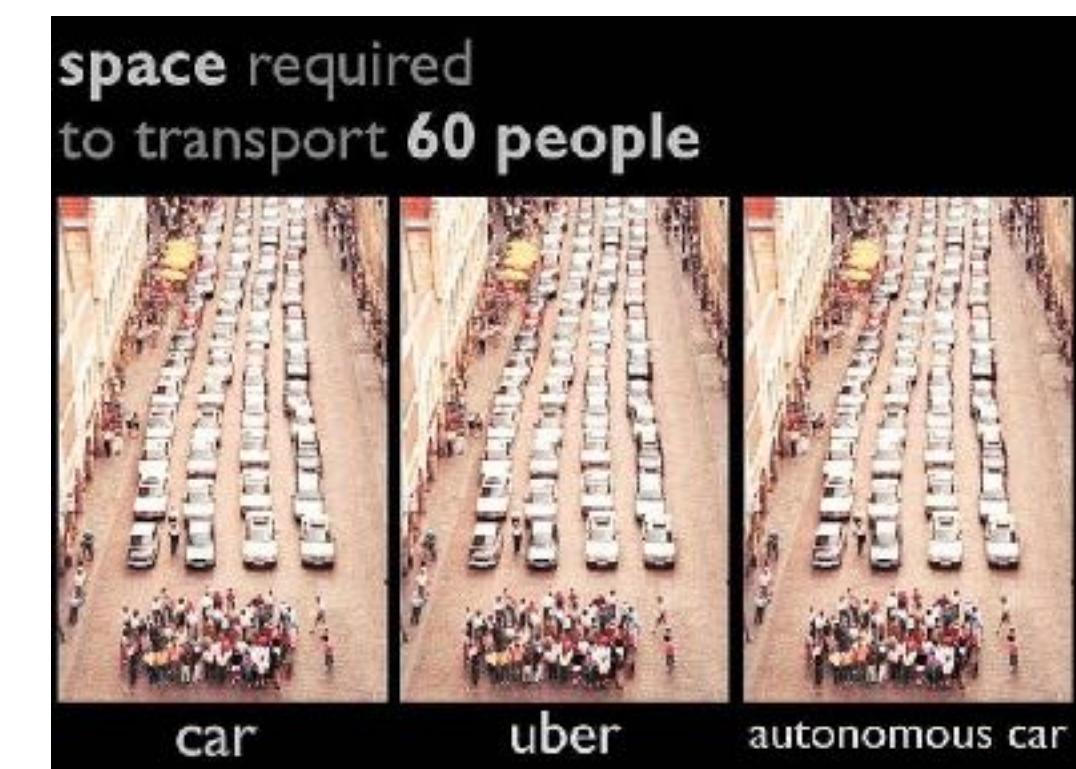
Network Science



Tech Approach



Human Approach



- 1) Vulnerable road user safety in Europe
- 2) Towards a science of bicycle network design

Identifying urban features for vulnerable road user safety in Europe

Marina Klanjčić^a, Laetitia Gauvin^a, Michele Tizzoni^a, and Michael Szell^{*a,b}

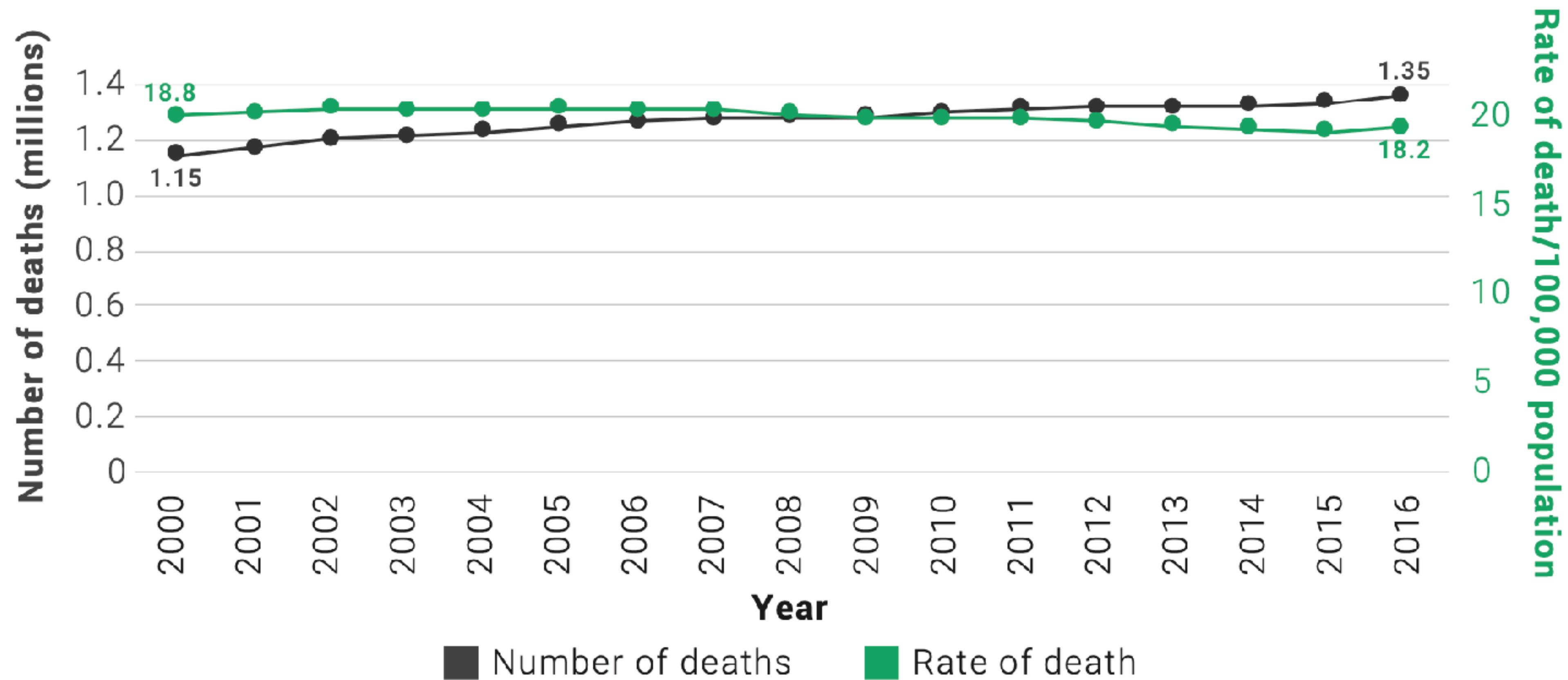
^a*ISI Foundation, Via Chisola 5, 10126 Torino, Italy*

^b*Computer Science Department, IT University of Copenhagen, Rued Langgaards Vej 7, 2300 København, Denmark*

April 14, 2021



The problem: 1.35 Mio people die on the road every year



The solution: Set a goal



UNITED NATIONS

3 GOOD HEALTH AND WELL-BEING



3.6 By 2020, halve the number of global deaths and injuries from road traffic accidents

The solution: Set a goal



UNITED NATIONS

3 GOOD HEALTH AND WELL-BEING



3.6 By 2020, halve the number of global deaths and injuries from road traffic accidents

Unfortunately, global levels stayed the same

Who is dying and why?

Vulnerable road users
disproportionately impacted



Who is dying and why?



Thalia VERKADE + Marco TE BRÖMMELSTROET

The OECD recommends:

- 1) Analyze such casualty matrices
- 2) Collect data from many cities
- 3) Investigate relation between urban shape, modal share, and road risk

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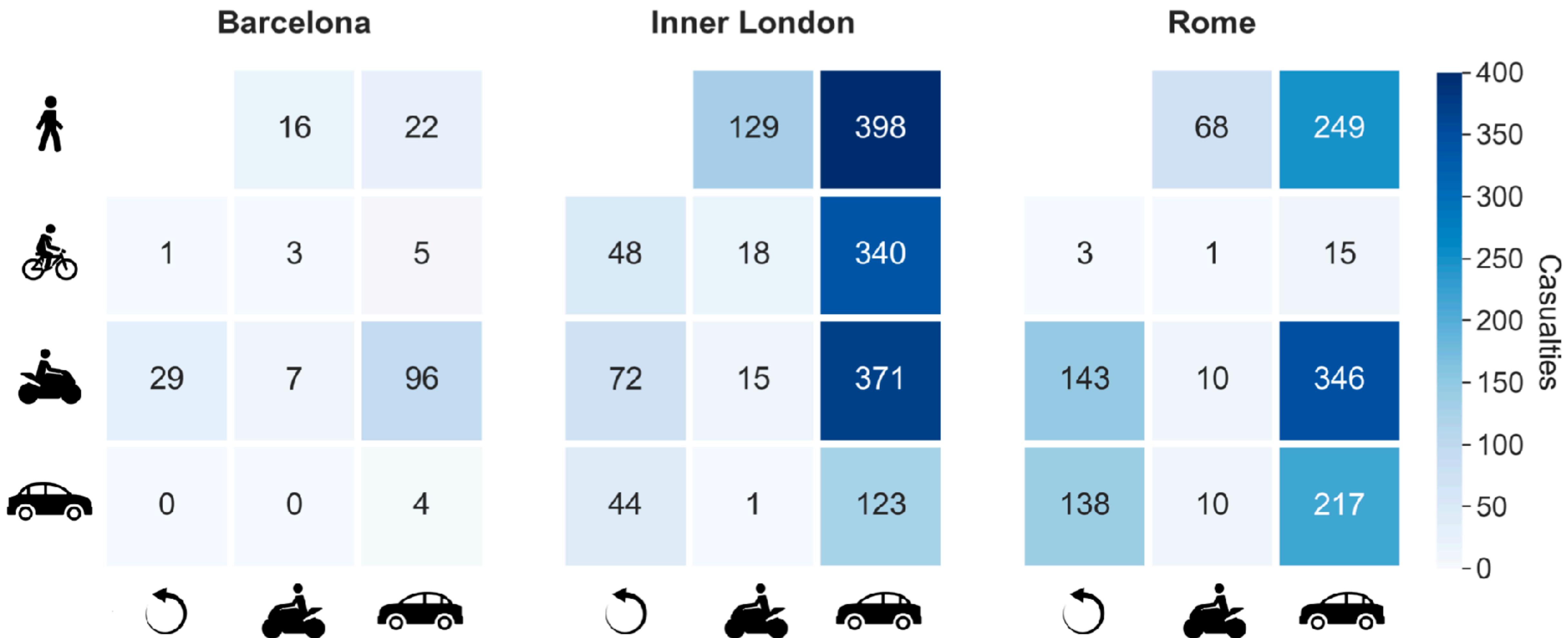


**MANU
MONTHS LATER**

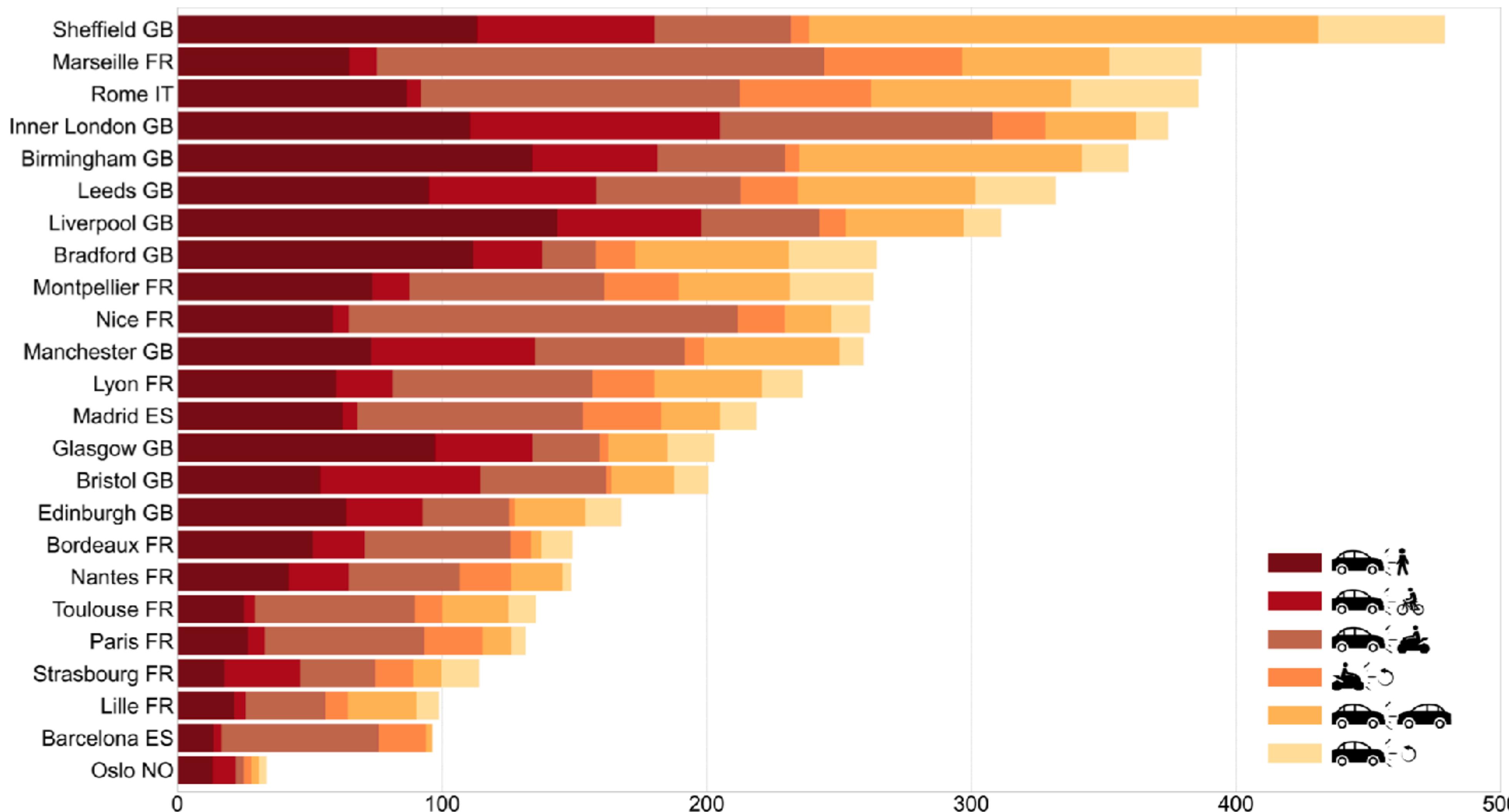
We collected data from 24 European cities / 5 countries



Casualty matrices are heterogeneous



Normalized casualties are also heterogeneous



Killed or seriously injured (KSI) per 1 Mio. inhabitants

We also collected urban indicators



OpenStreetMap + OSMnx

Cycling share: How long are the protected cycle tracks compared to streets

Speed limited streets: Share of streets with $\leq 30\text{km/h}$



Modal shares of different transport modes

Our analysis can be at most as good as the data quality

Crash underreportings, esp. for cycling

OpenStreetMap data issues, esp. for cycling infrastructure

Different national data collection or injury standards



ROAD ACCIDENT DATA COLLECTION	Belgium	Denmark	Germany	Netherlands	Poland	Spain	Sweden
Applicability of CARE definition to:							
• Road accident/injury accident	Yes	Yes	Yes	No	Yes	Yes	No
• Killed/fatally injured	Yes	Yes	Yes	Yes	Yes	Yes	No
• Injured	Yes	No	Yes	No	No	Yes	No
• Seriously injured	Yes	No	Yes	No	No	Yes	No
• Slightly injured	Yes	No	Yes	No	No	Yes	No
• Not injured	Yes	Yes	Yes	Yes	Yes	No	Yes
Data collection procedure							
From paper form to computer database	Yes	Yes	Yes	Yes	Yes	Yes	Yes
Source of information about victim's injuries							
• ambulance	X	X	X			X	
• emergency room/admissions		X	X		X		X
• other hospital departments			X				X
• road users involved in accidents			X	X		X	
• other sources	X	X					
Verification of information on injuries							
Verification of information about victim's injuries	Yes	Yes	Yes	Yes	Yes	No	Yes
Classification of injury severity							
Classification of injury severity by the police	Yes	Yes	Yes	Yes	Yes	Yes	No
• based on doctor's opinion		X			X	X	
• using MAIS3+ classification							
• using AIS 2005 classification					X		
• other	X	X	X		X		

We built a statistical model using LASSO regression

$$\hat{\beta}_{\text{lasso}}(\alpha) = \operatorname{argmin}_{\beta} \|\mathbf{y} - X\beta\|_2^2 + \alpha \|\beta\|_1$$

Predictors:



area share



area share



mode share

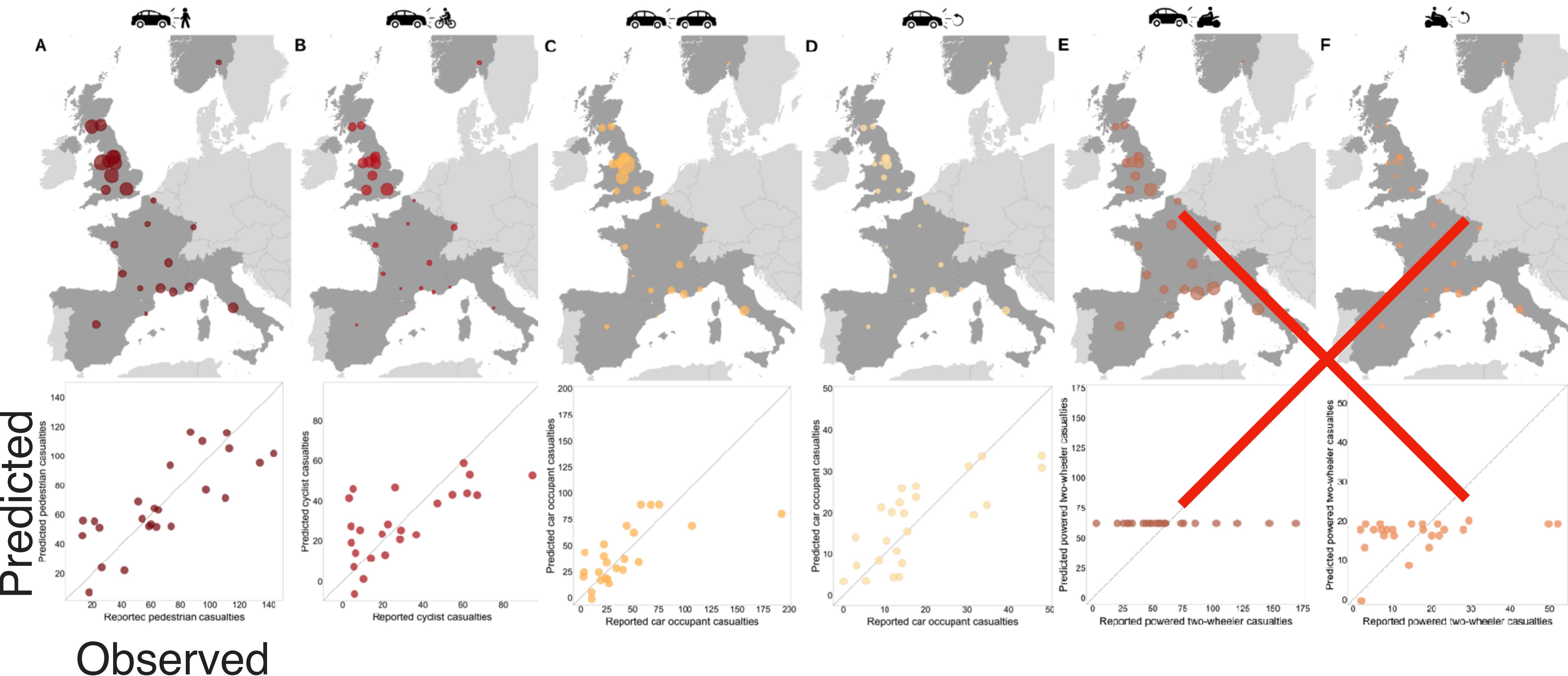


mode share

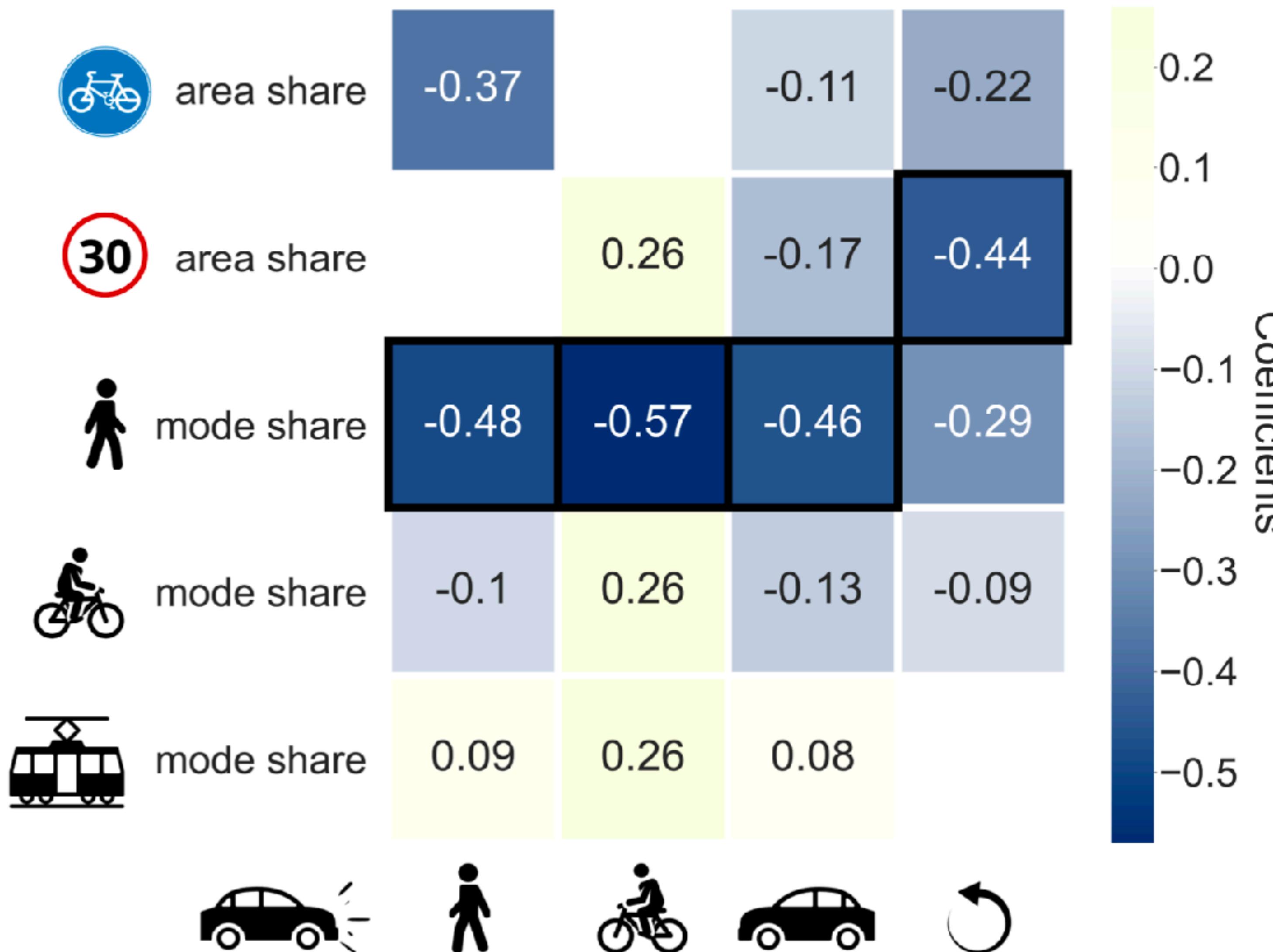


mode share

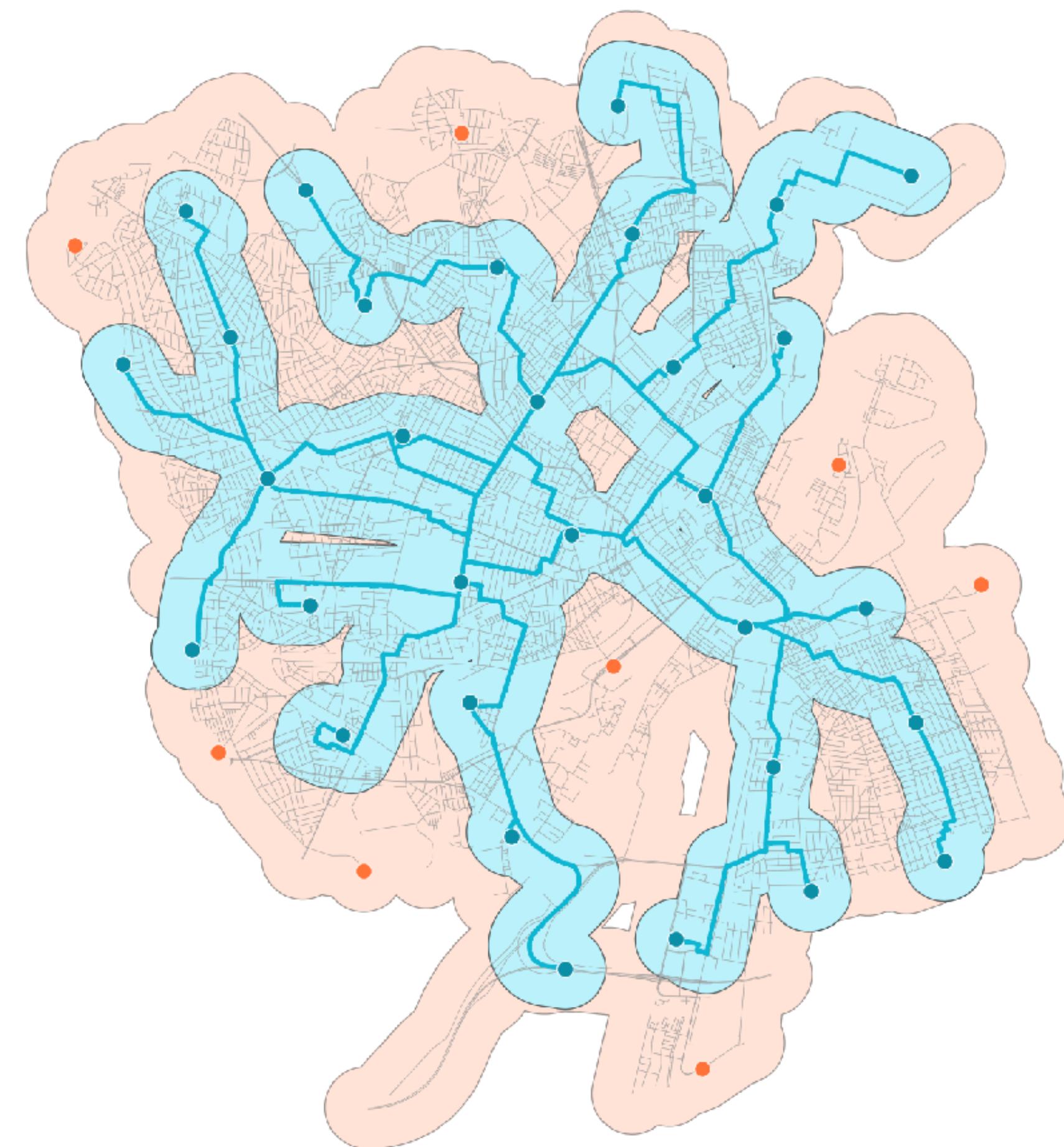
Our model predicts reasonably (except for motorbikes)



In conclusion: More walking = Safer cities for all!



2) Towards a science of bicycle network design



Research



Cite this article: Natera Orozco LG, Battiston F, Iñiguez G, Szell M. 2020 Data-driven strategies for optimal bicycle network growth. *R. Soc. Open Sci.* 7: 201130.

<https://doi.org/10.1098/rsos.201130>

Data-driven strategies for optimal bicycle network growth

Luis Guillermo Natera Orozco¹, Federico Battiston¹,
Gerardo Iñiguez^{1,2,3} and Michael Szell^{4,5,6}

¹Department of Network and Data Science, Central European University, 1100 Vienna, Austria

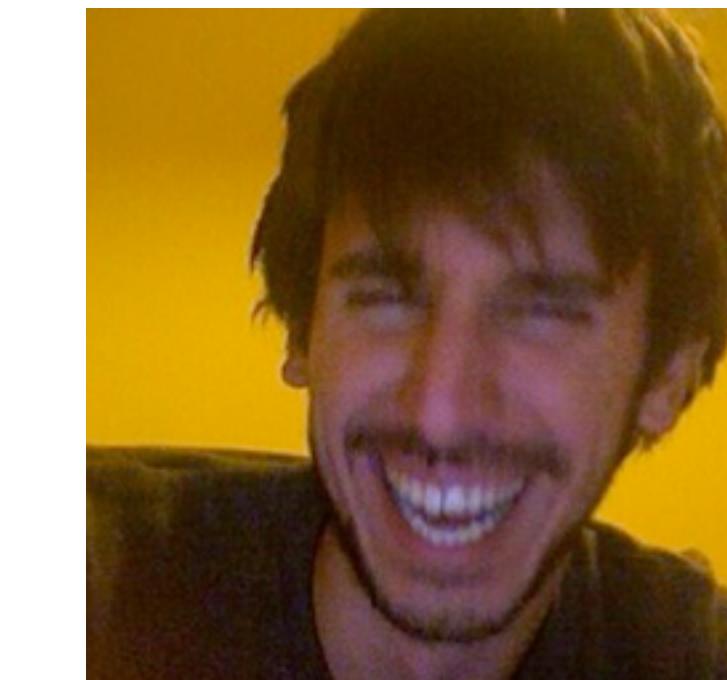
²Department of Computer Science, Aalto University School of Science, 00076 Aalto, Finland

³Centro de Ciencias de la Complejidad, Universidad Nacional Autónoma de México, 04510 CDMX, Mexico

⁴NEtworks, Data, and Society (NERDS), IT University of Copenhagen, 2300 Copenhagen, Denmark

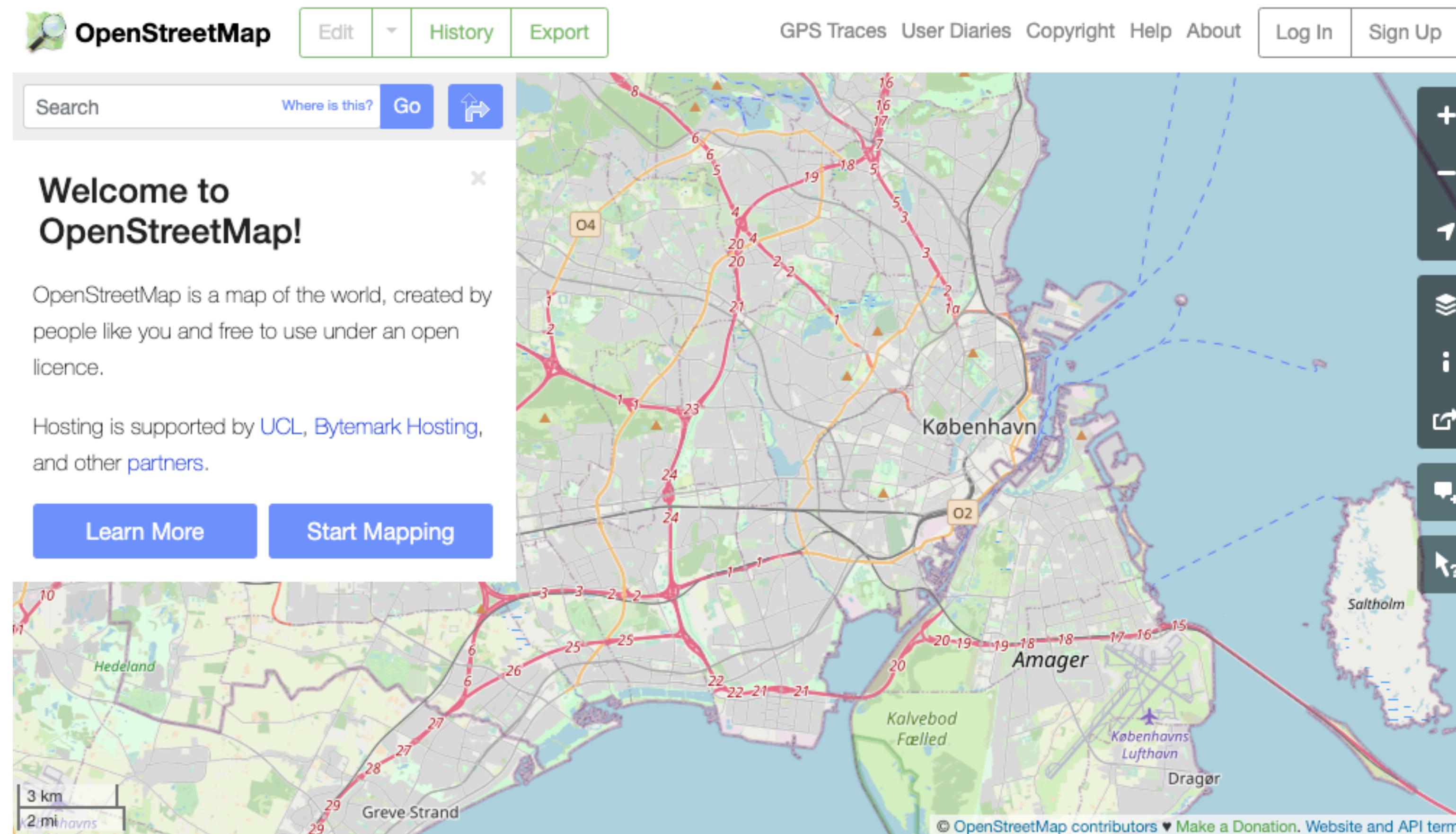
⁵ISI Foundation, 10126 Turin, Italy

⁶Complexity Science Hub Vienna, 1080 Vienna, Austria



<https://royalsocietypublishing.org/doi/10.1098/rsos.201130>

We downloaded data from OpenStreetMap (OSM)

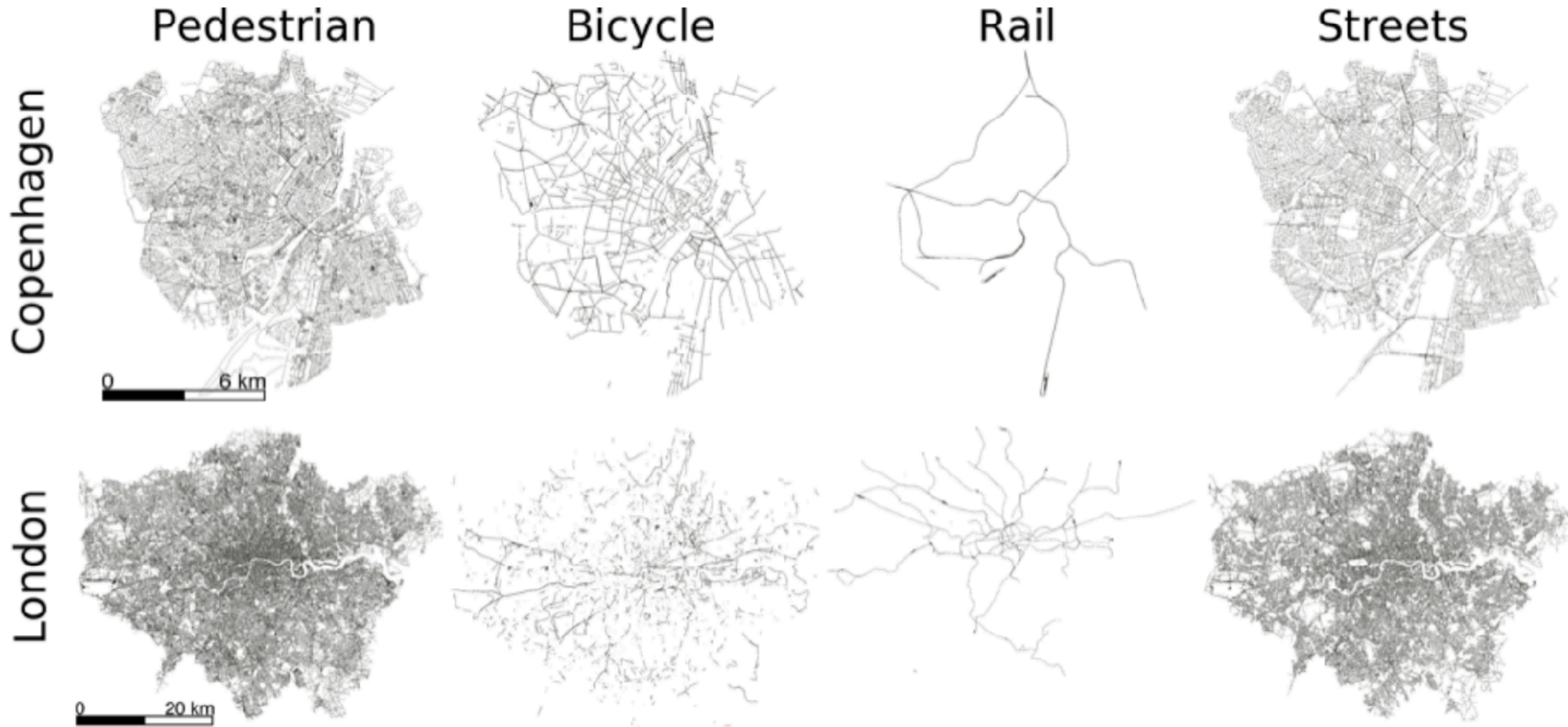


OSM data are quite reliable in western countries

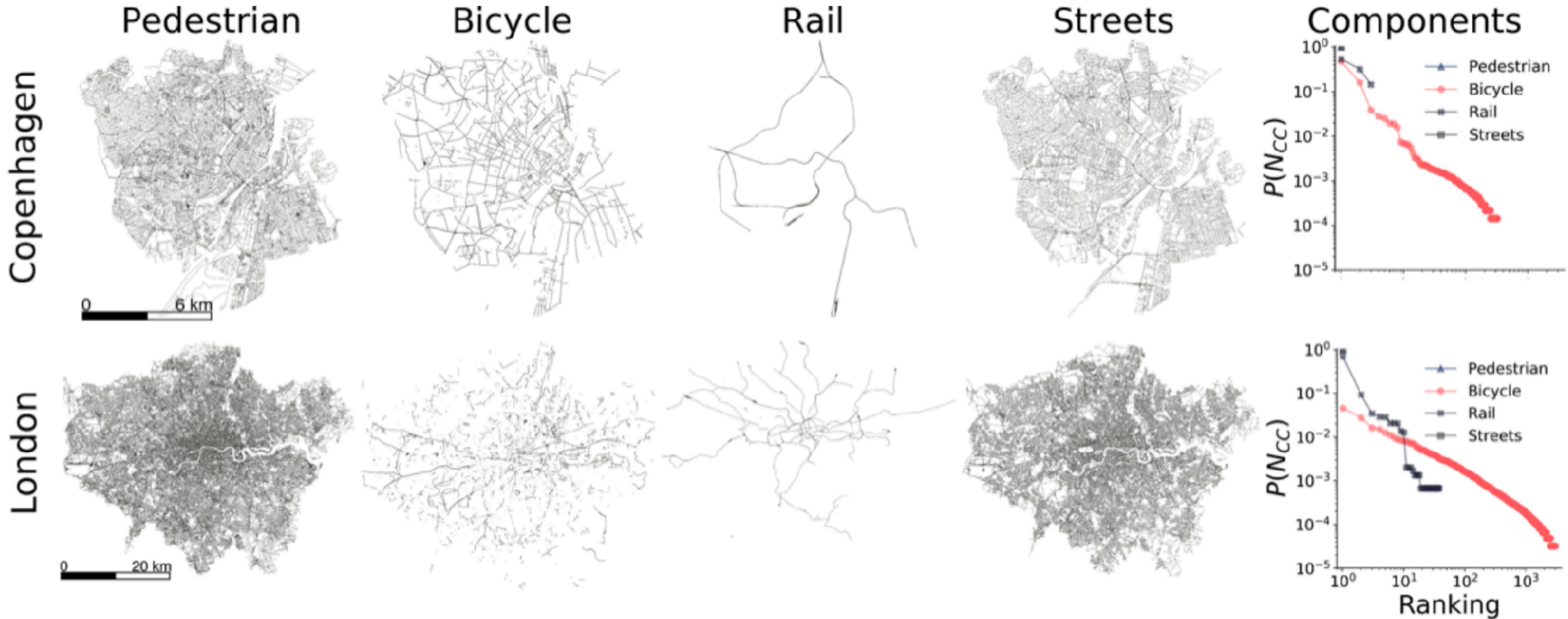
Haklay et al, Cart J 47 (2010)

Barrington-Leigh & Millard-Ball, PLOS ONE 12, (2017)

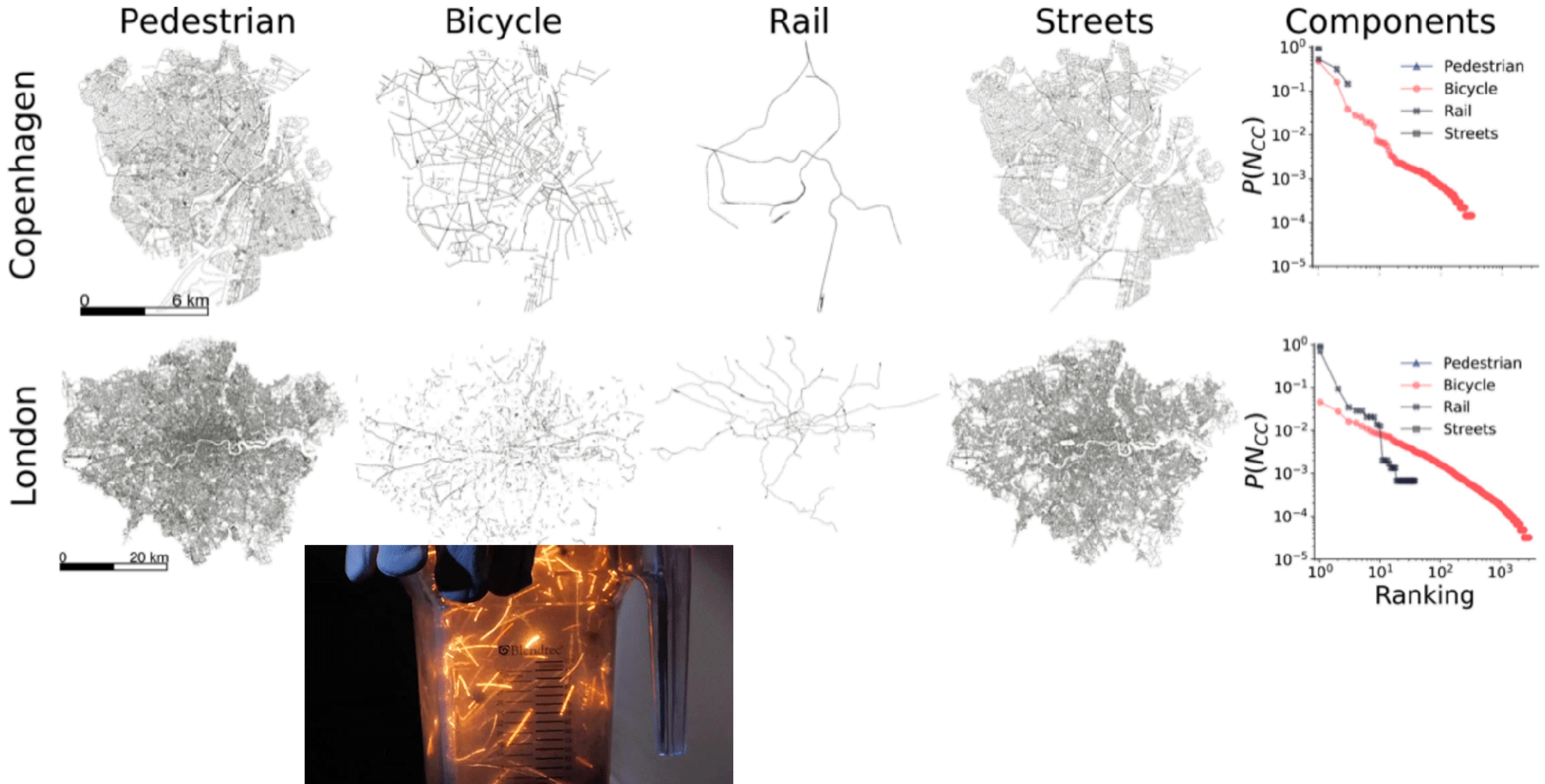
Cities have different transport network layers



Bicycle networks are highly fragmented

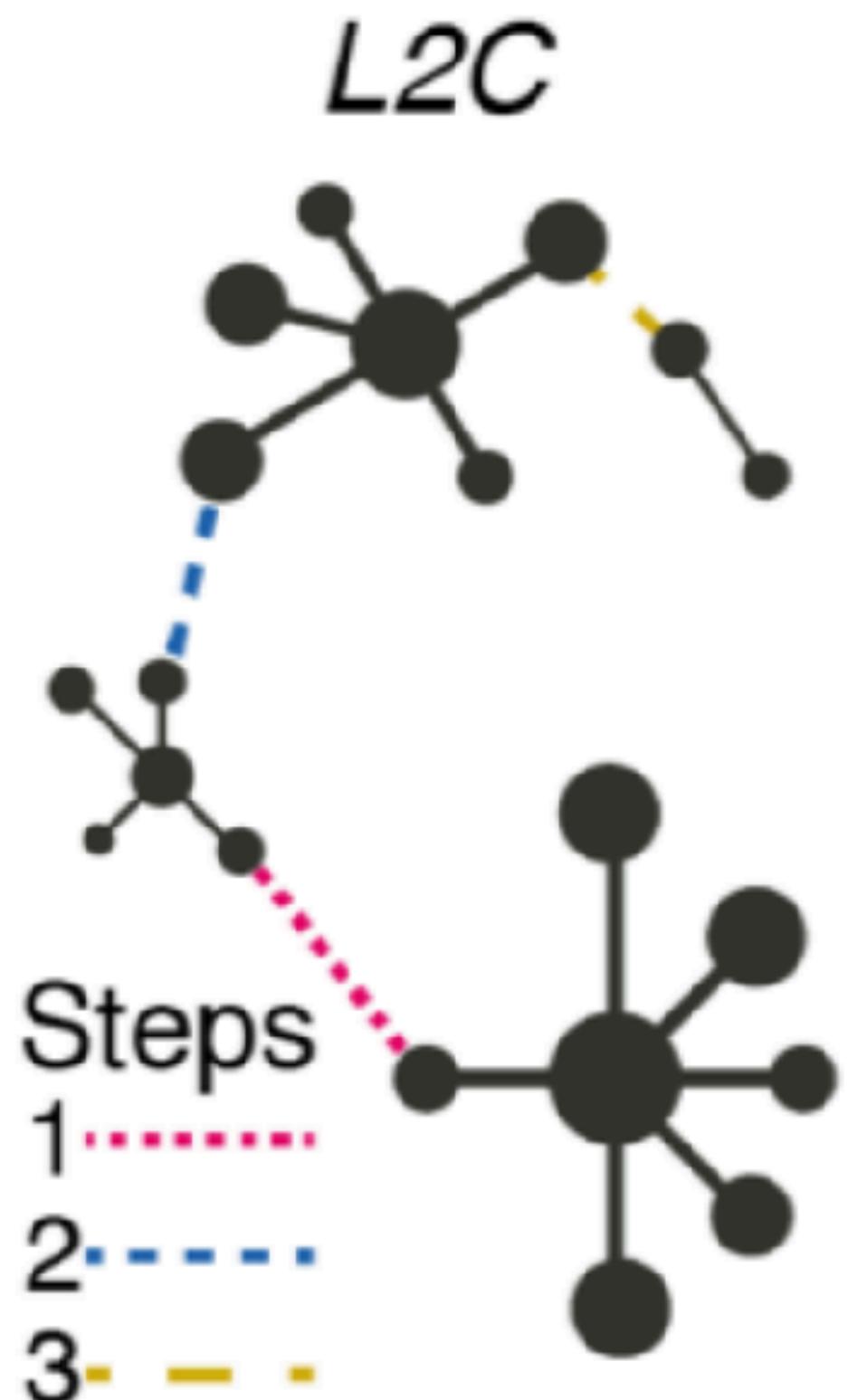


Bicycle networks are highly fragmented



How should we connect the components?

Largest to
closest



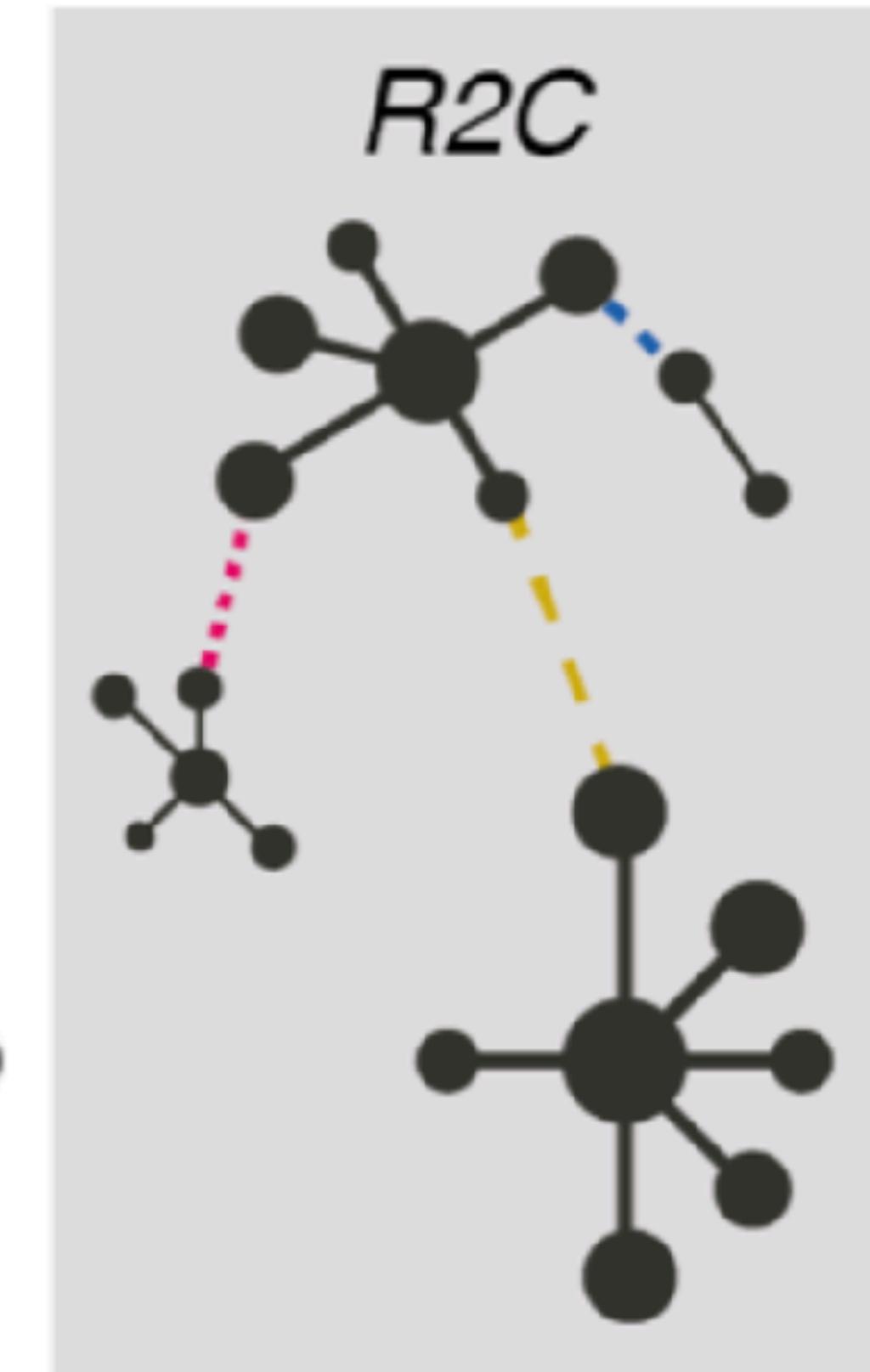
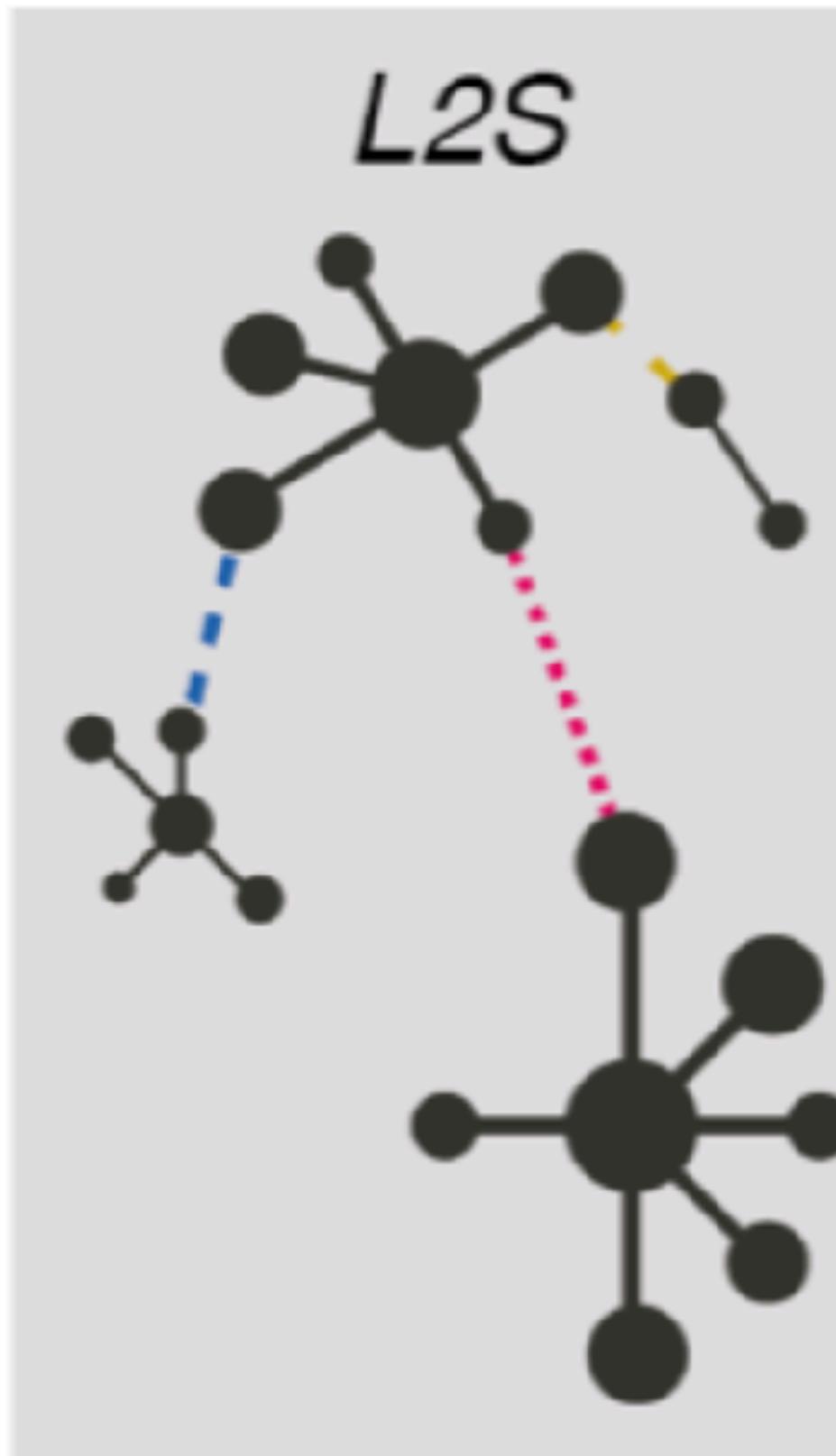
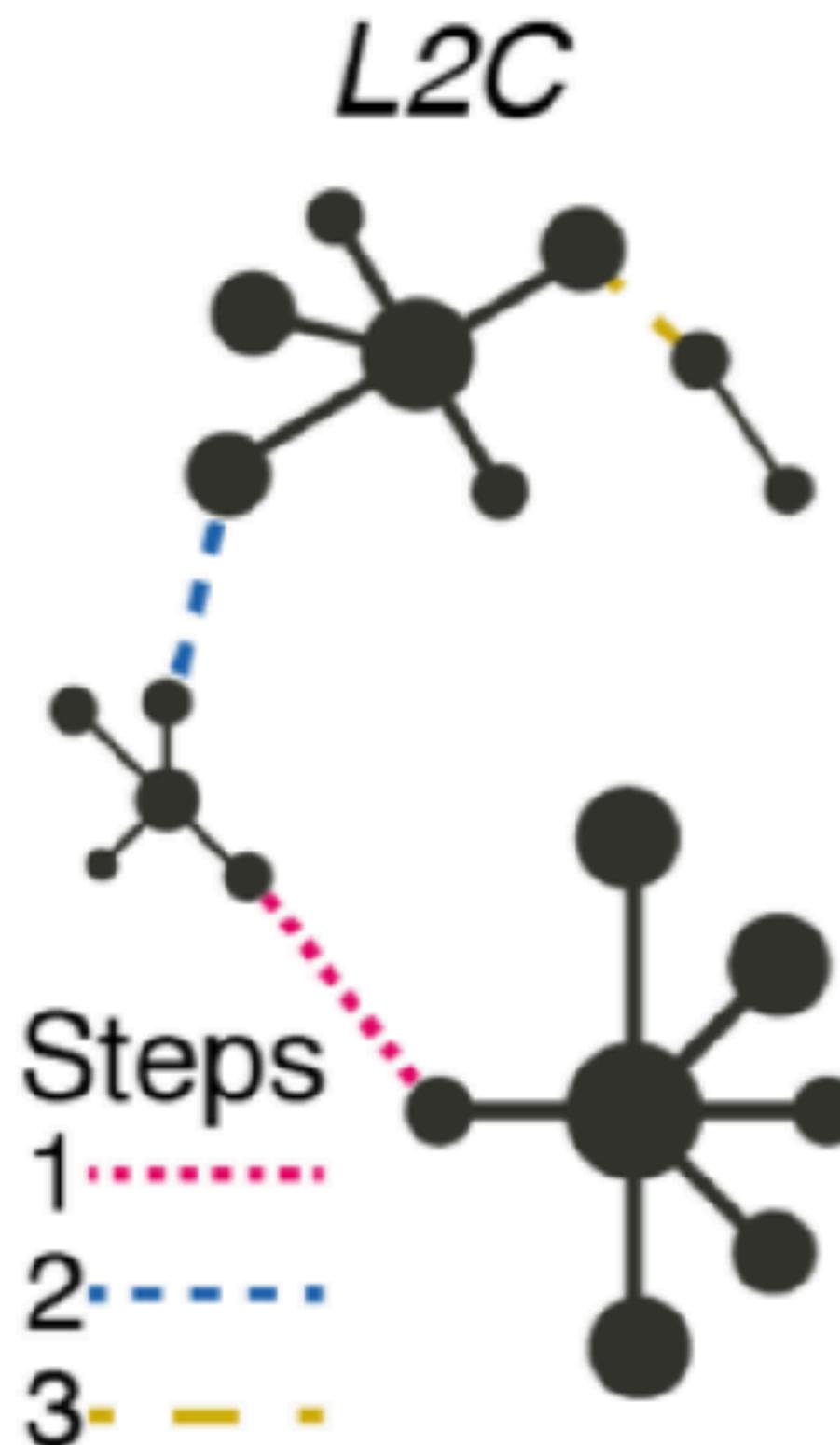
How should we connect the components?

Largest to
closest

Largest to
second largest

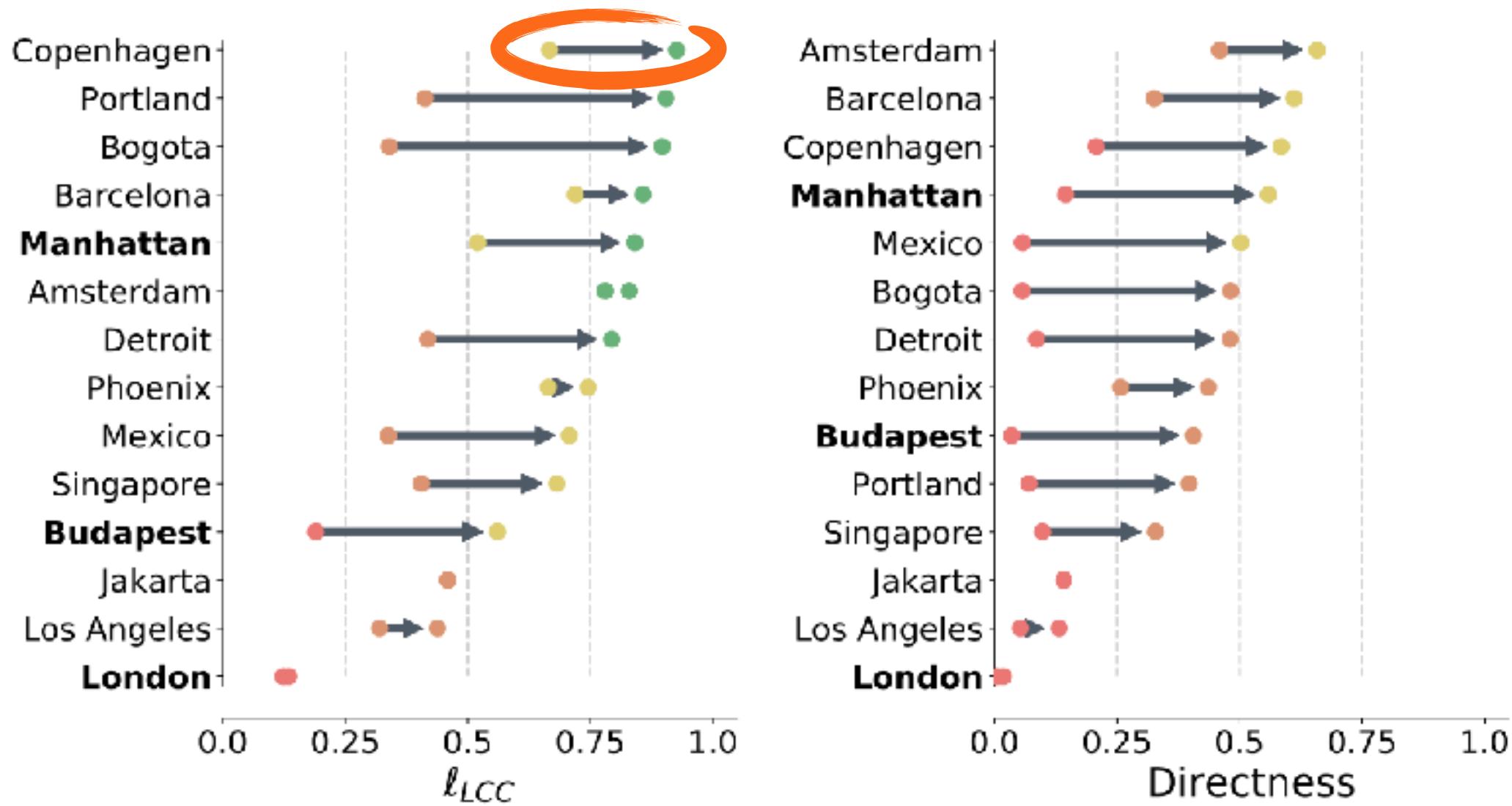
Closest
components

Random to
closest



Investing in connections makes sense in well developed cities

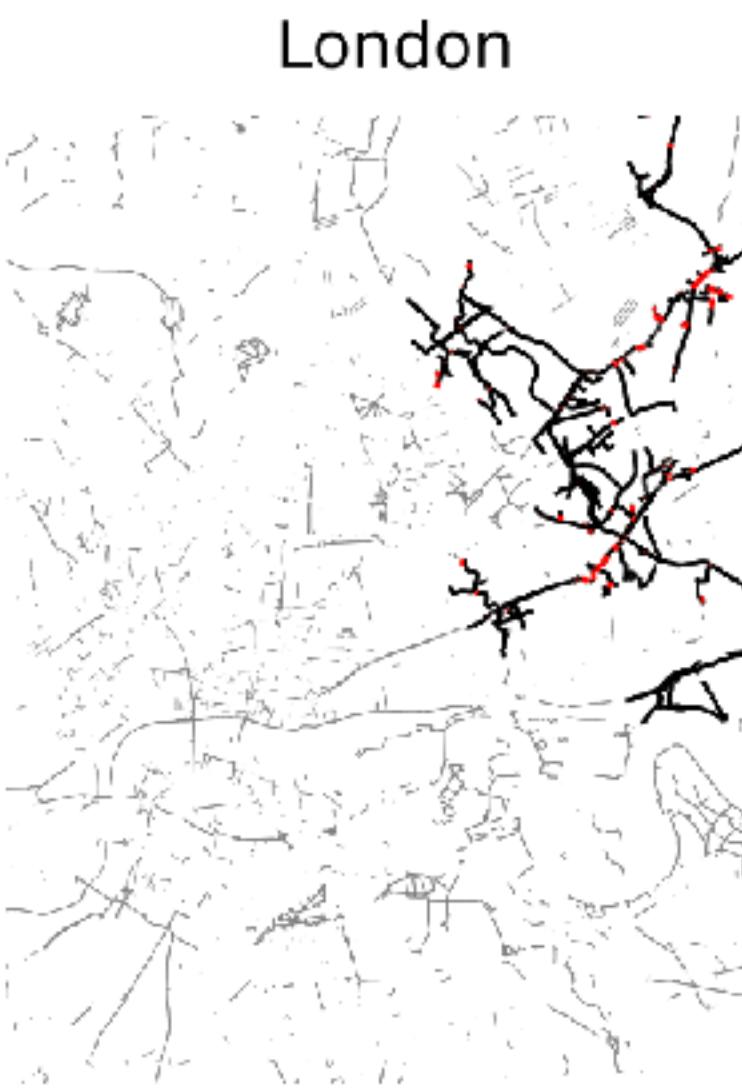
(a) 5 km investment



Manhattan



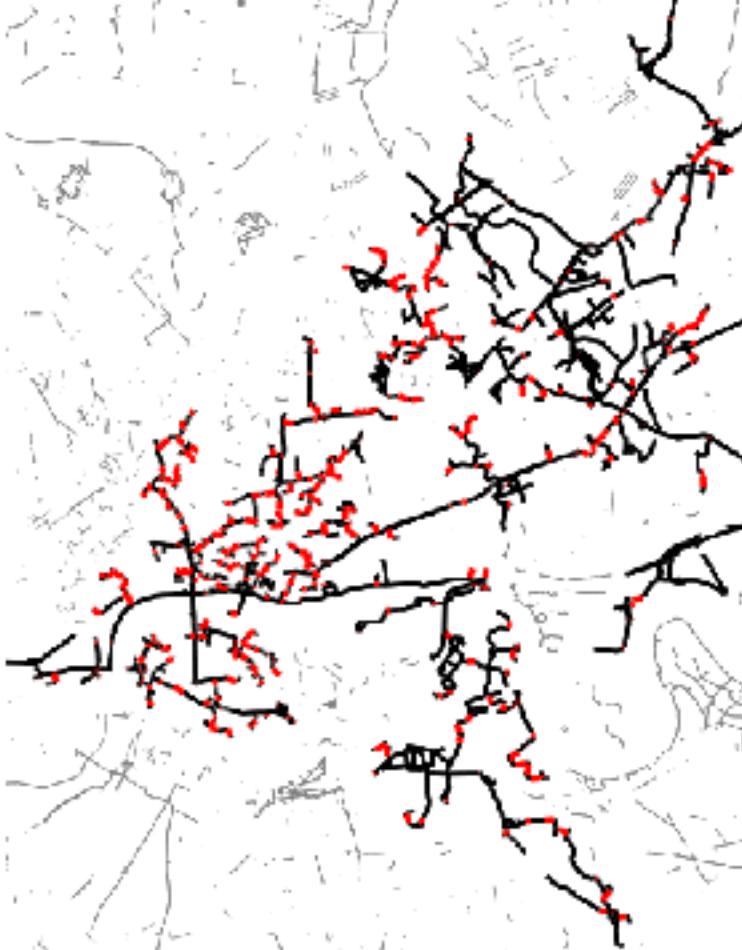
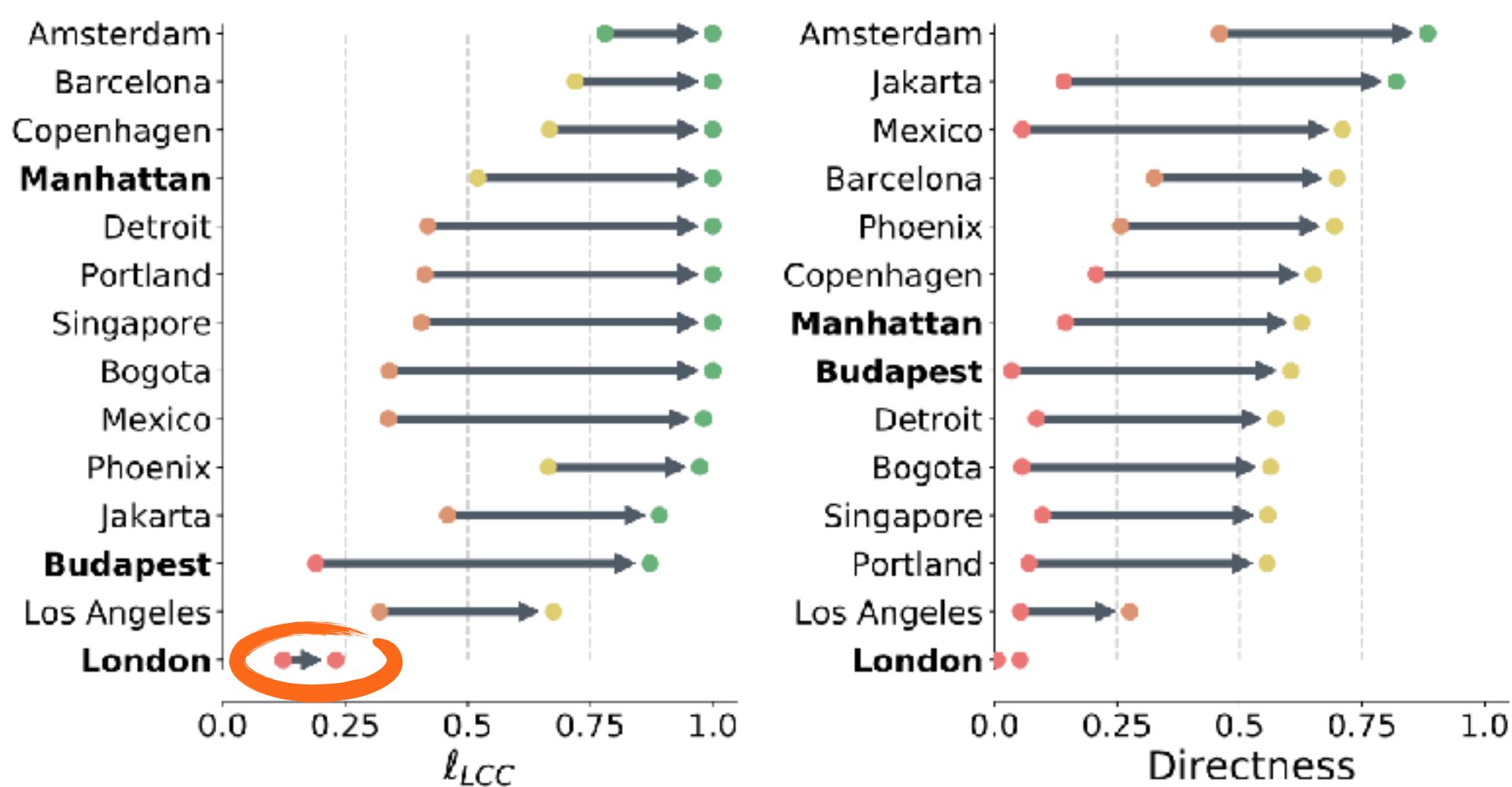
London



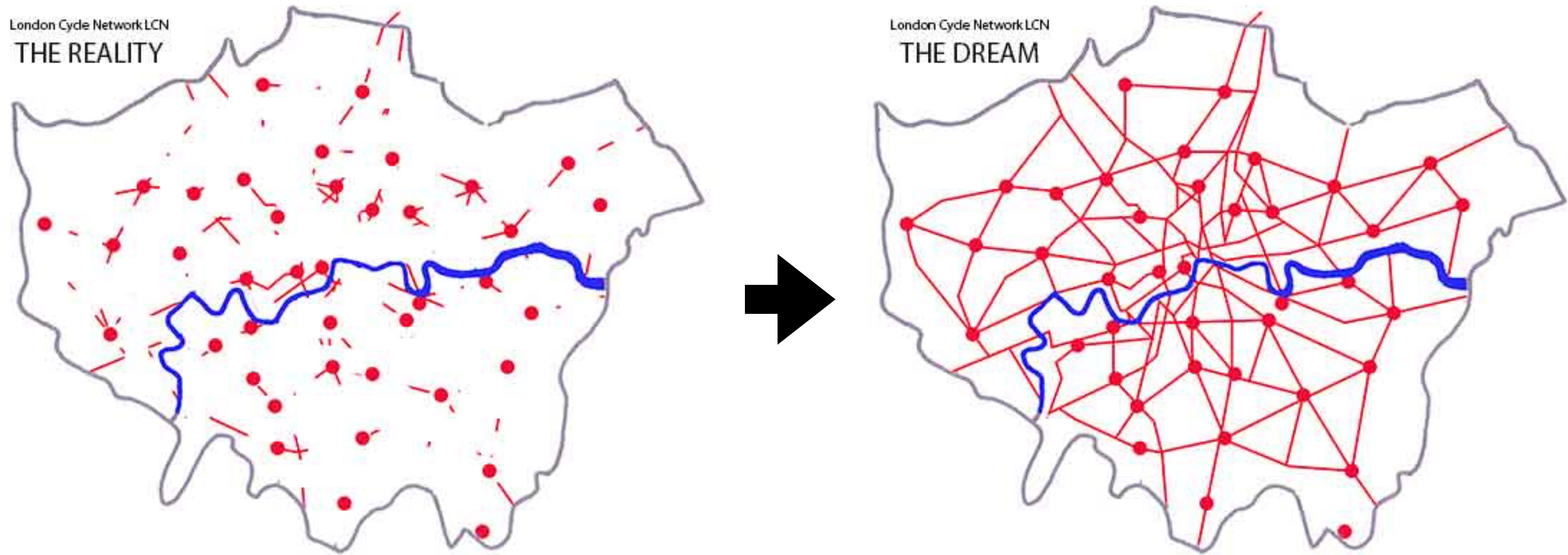
Budapest



(b) 35 km investment



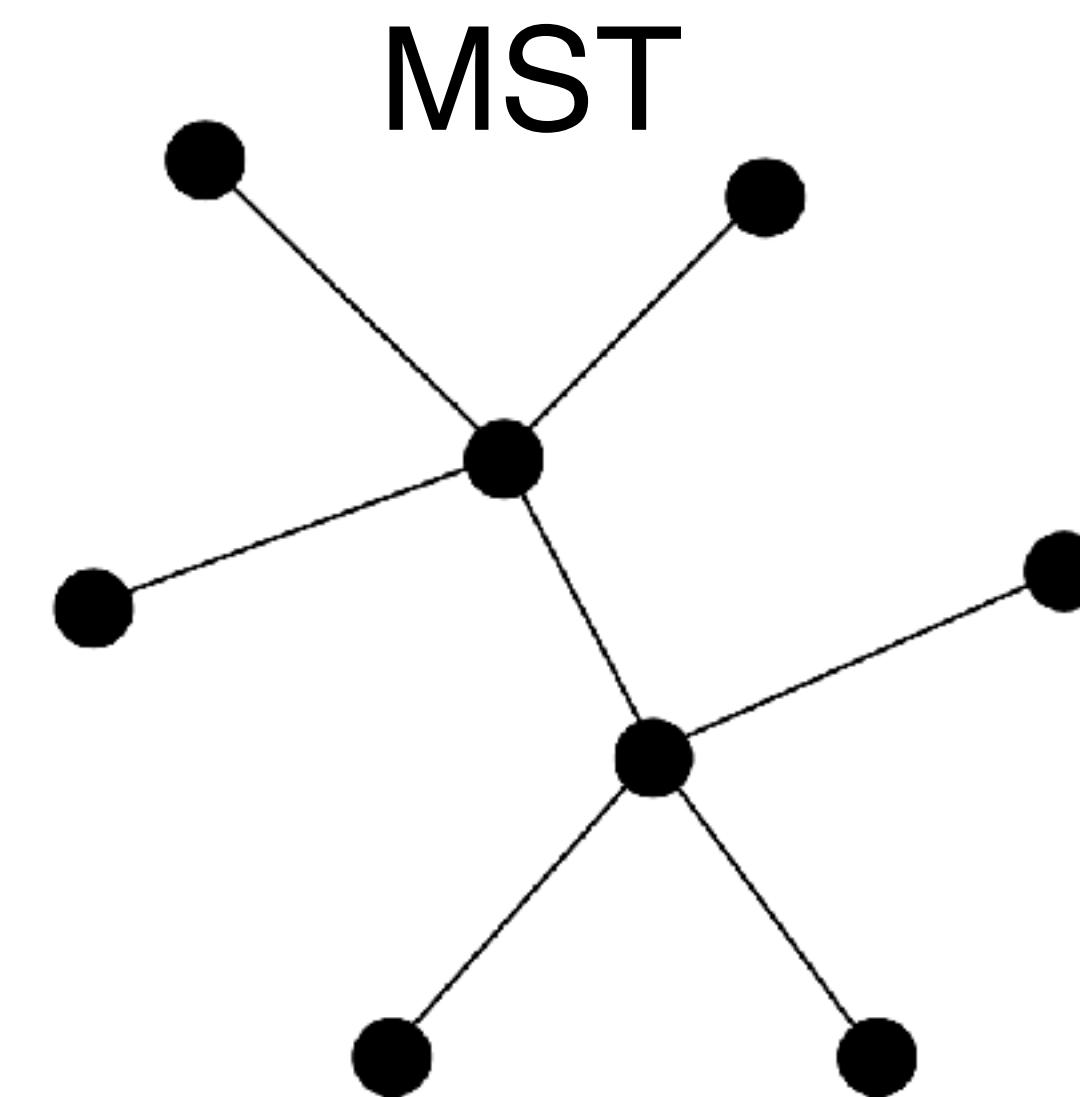
For most cities it makes more sense to start from scratch



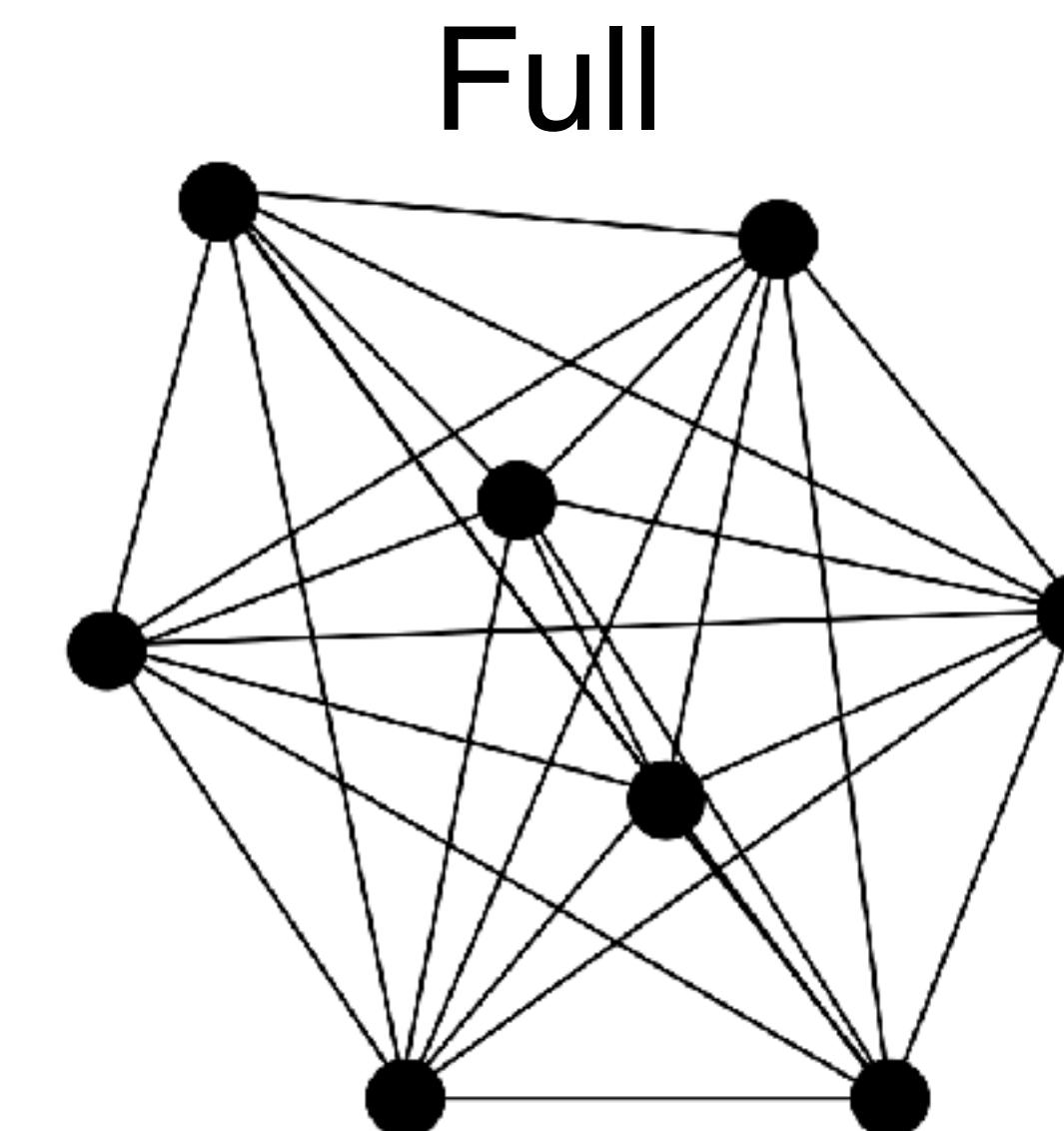
It is not enough to just connect components

A minimum spanning tree has no redundancy, and no:

- Fault tolerance (roadworks, traffic)
- Directness



Investors' optimum



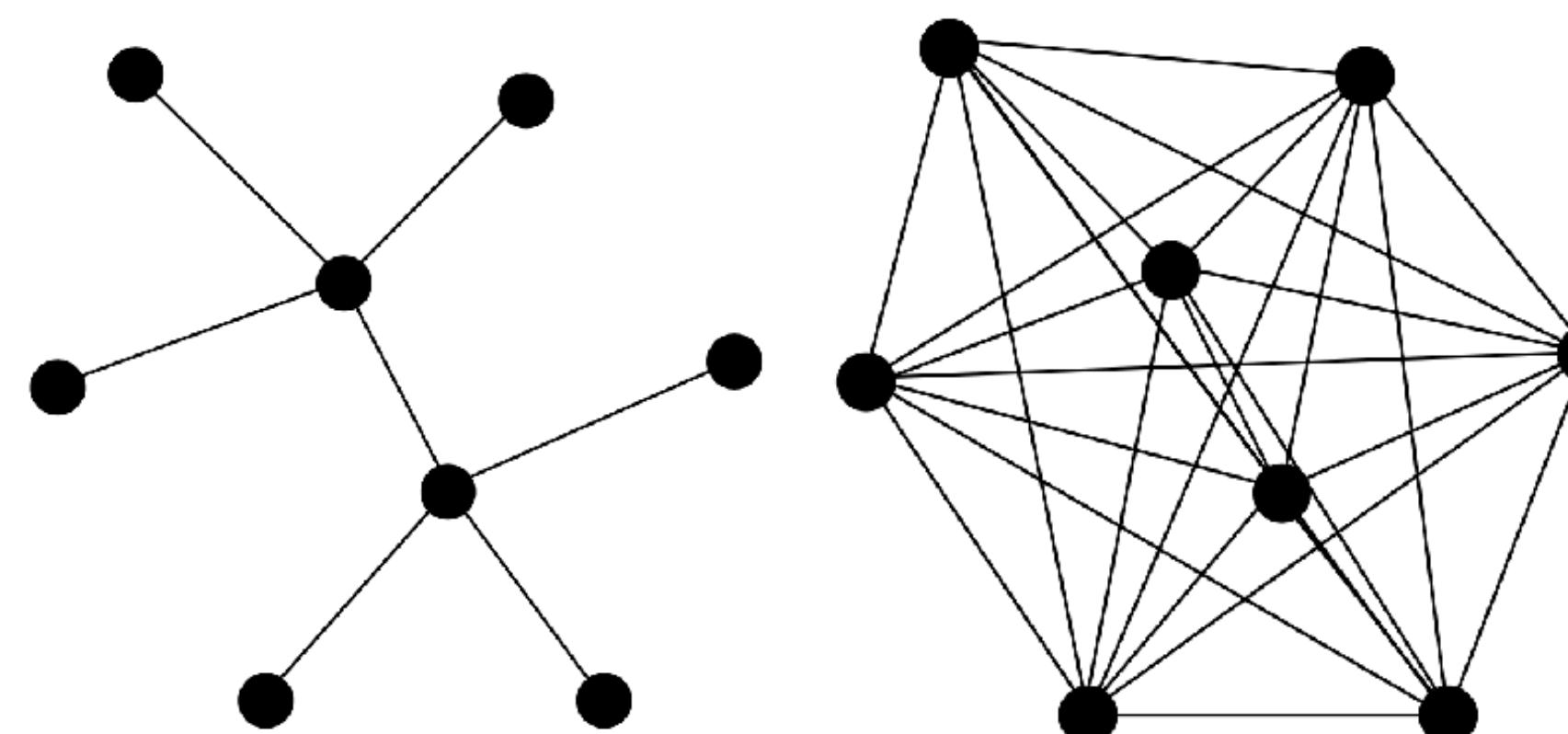
Travellers' optimum

This is not the end of the story

So far we focused ONLY on 1) connectedness, 2) directness

Our current research extends to:

Efficiency / Redundancy



Investors' optimum

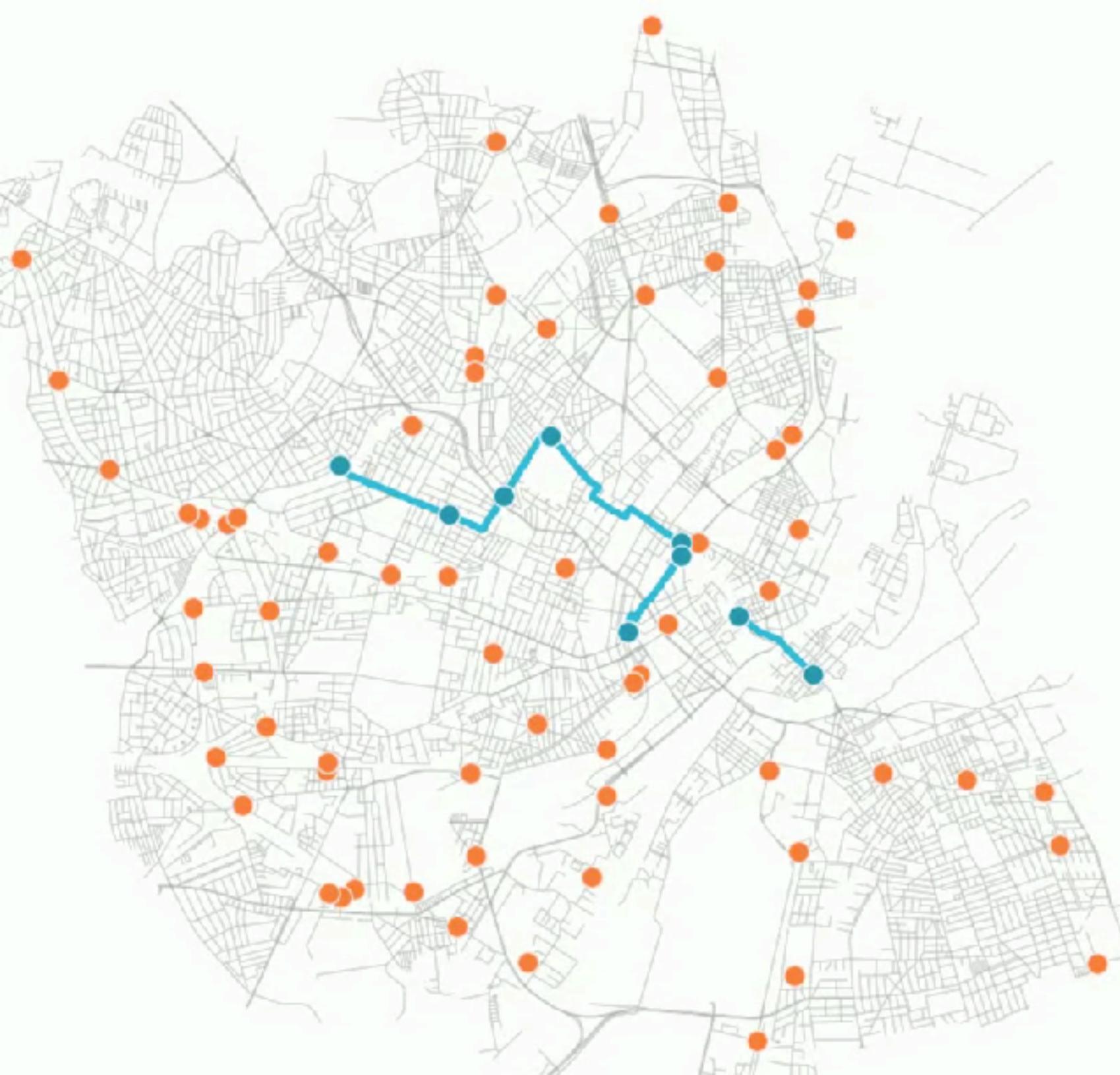
Travellers' optimum

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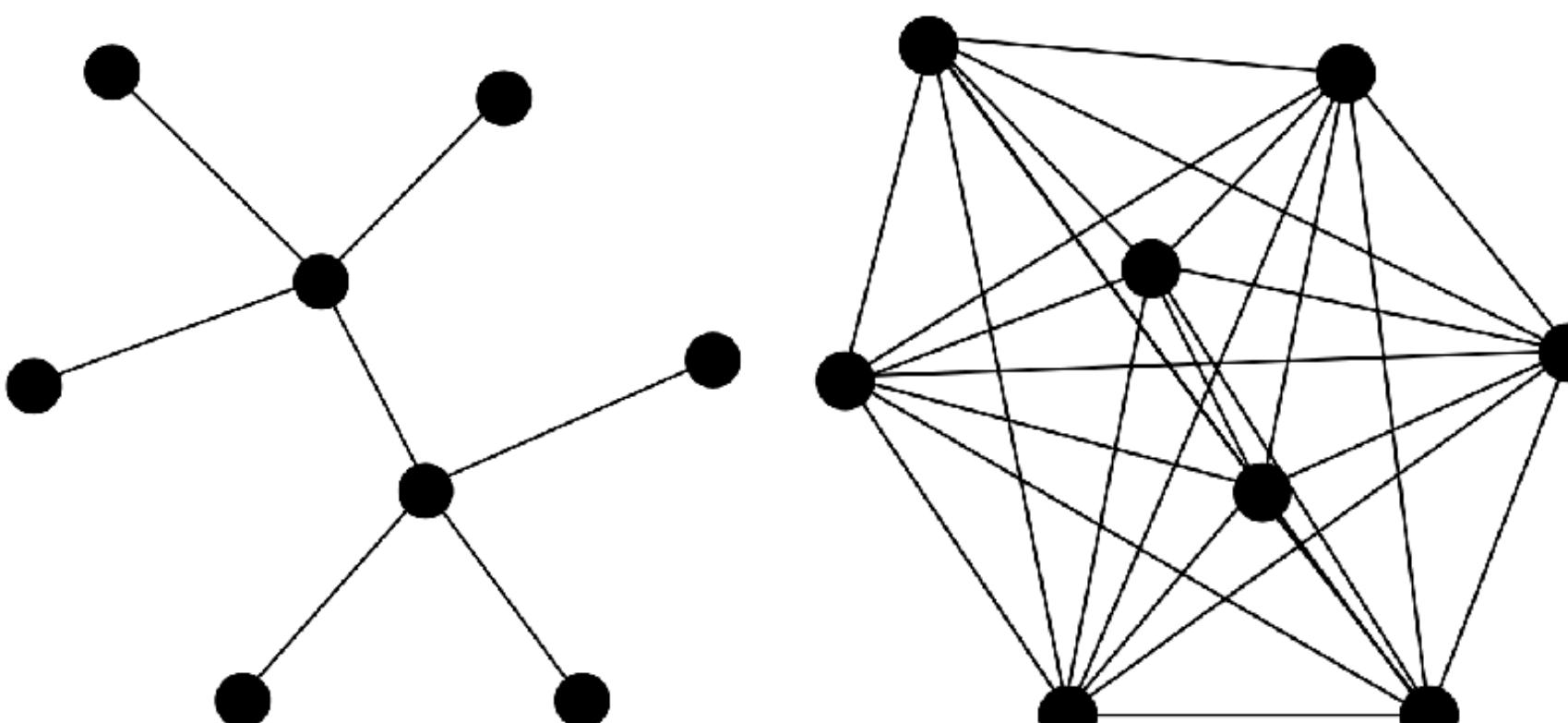
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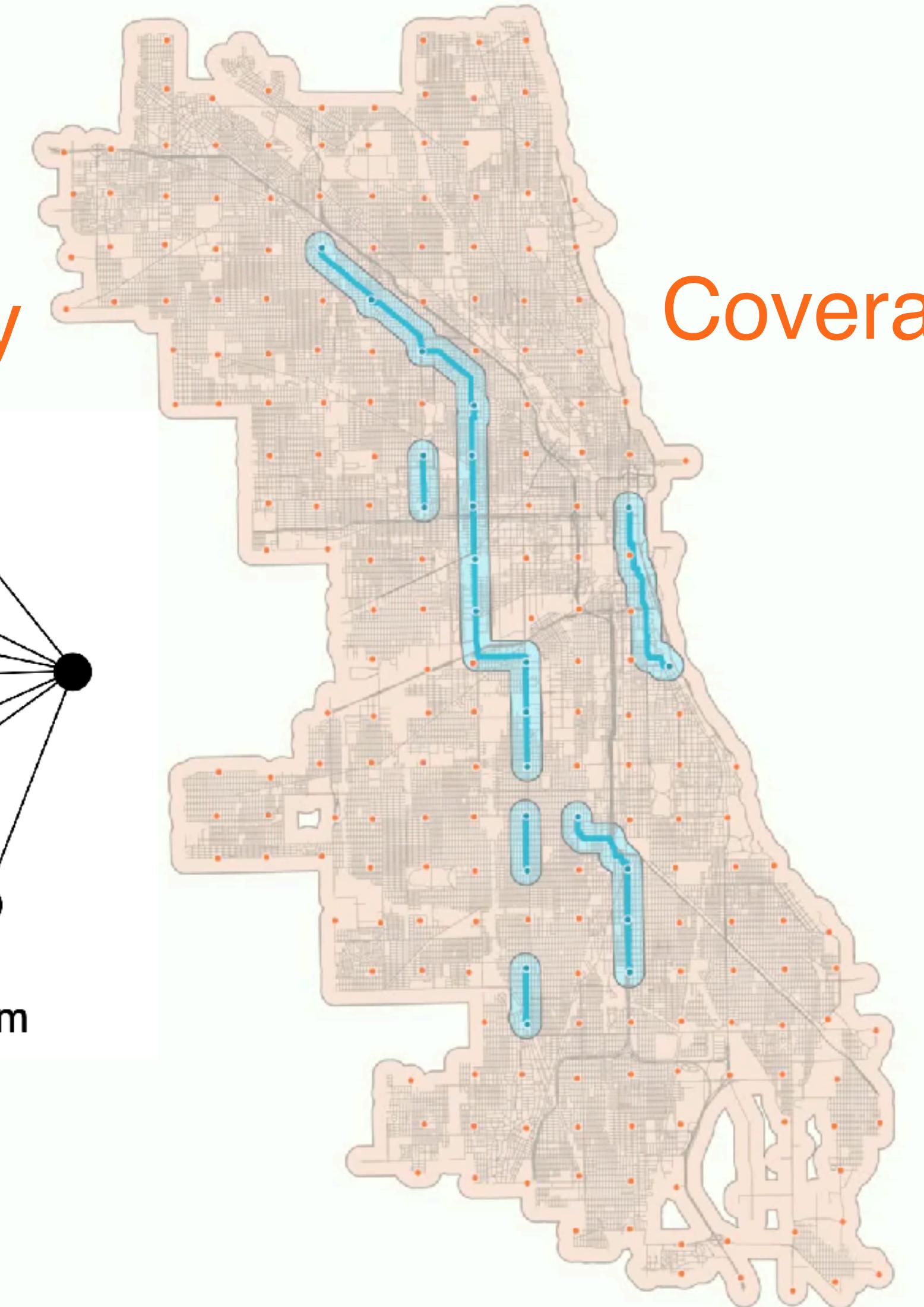
Growth



Efficiency / Redundancy

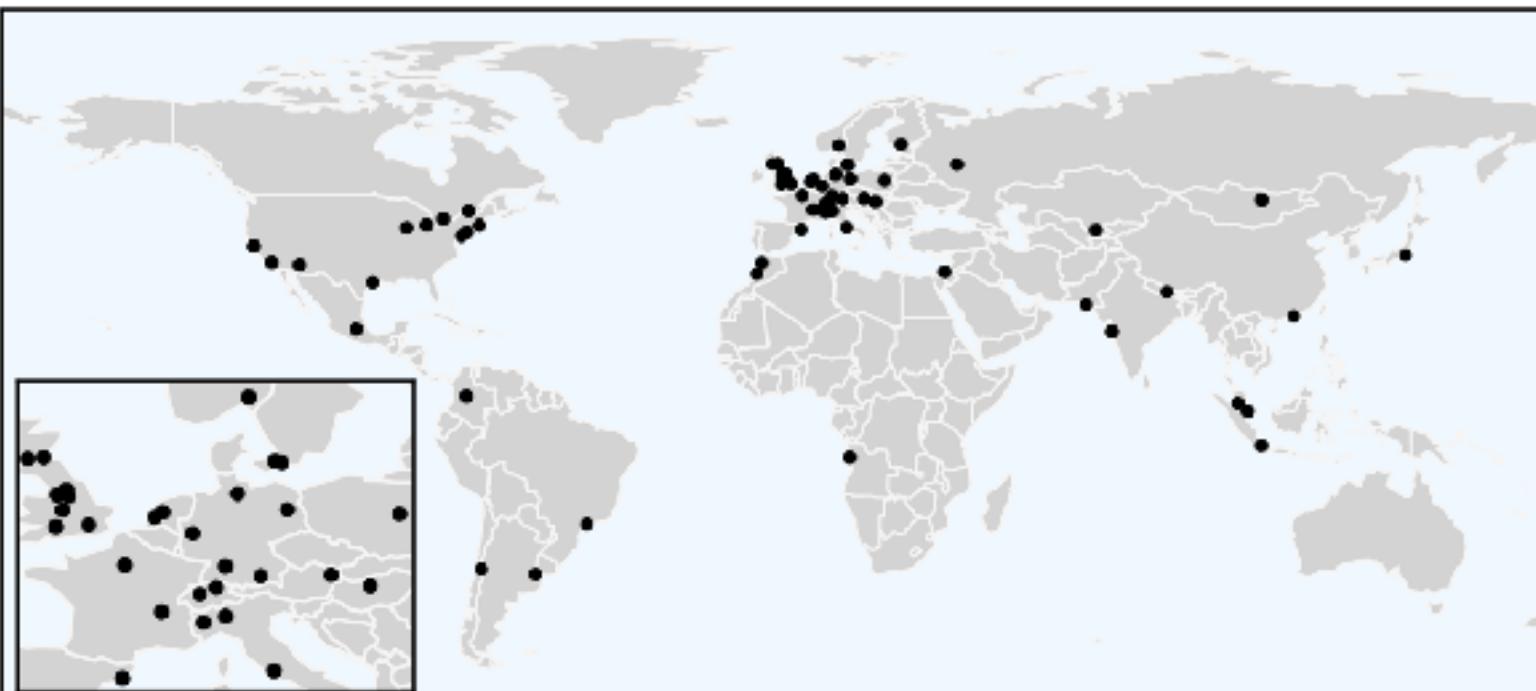
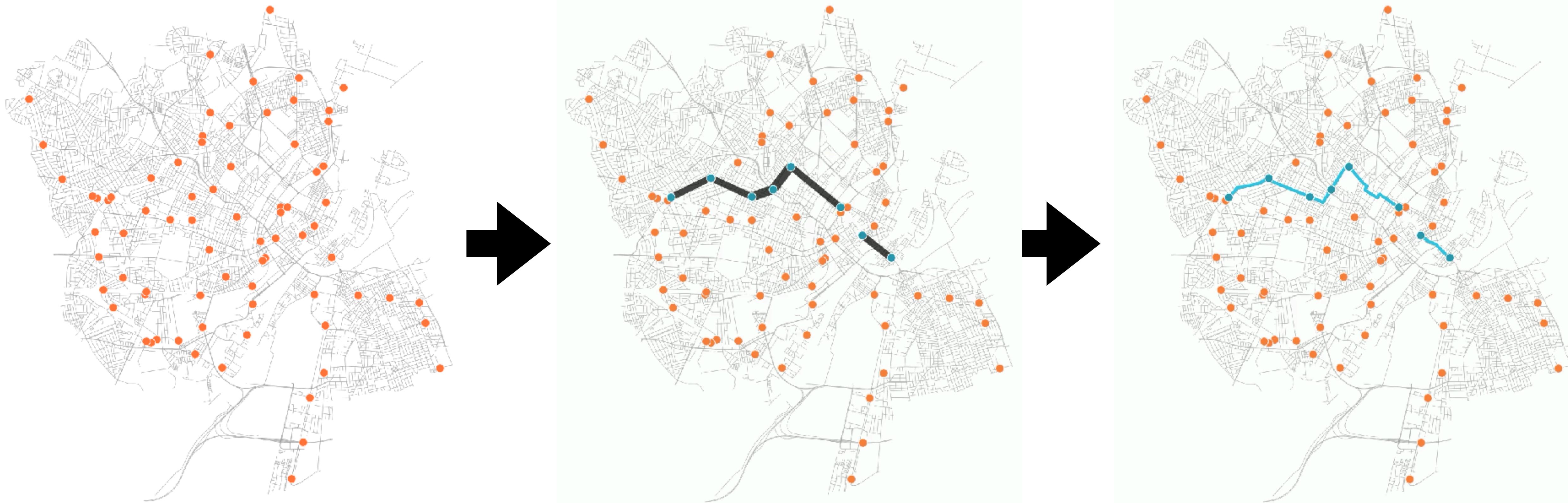


Coverage



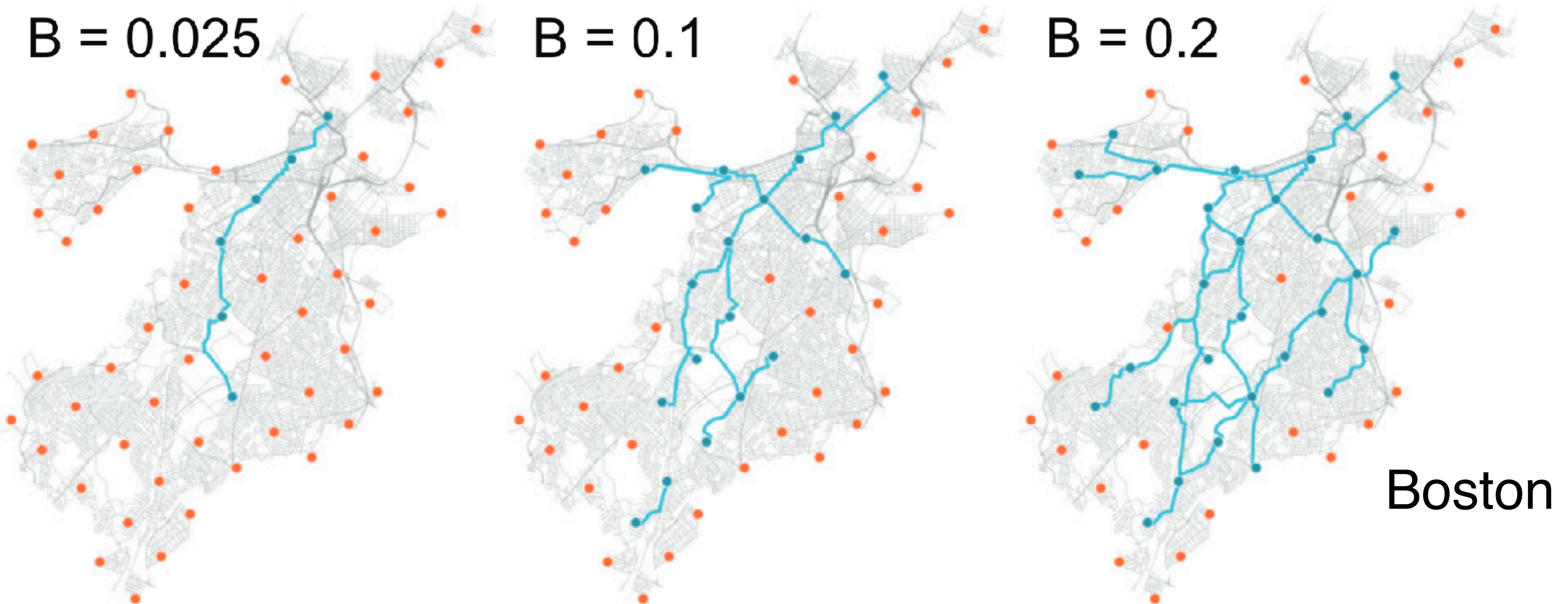
van Nes, Univ of Delft (2002)

Our idea: POIs → Greedy Triangulation → Routing

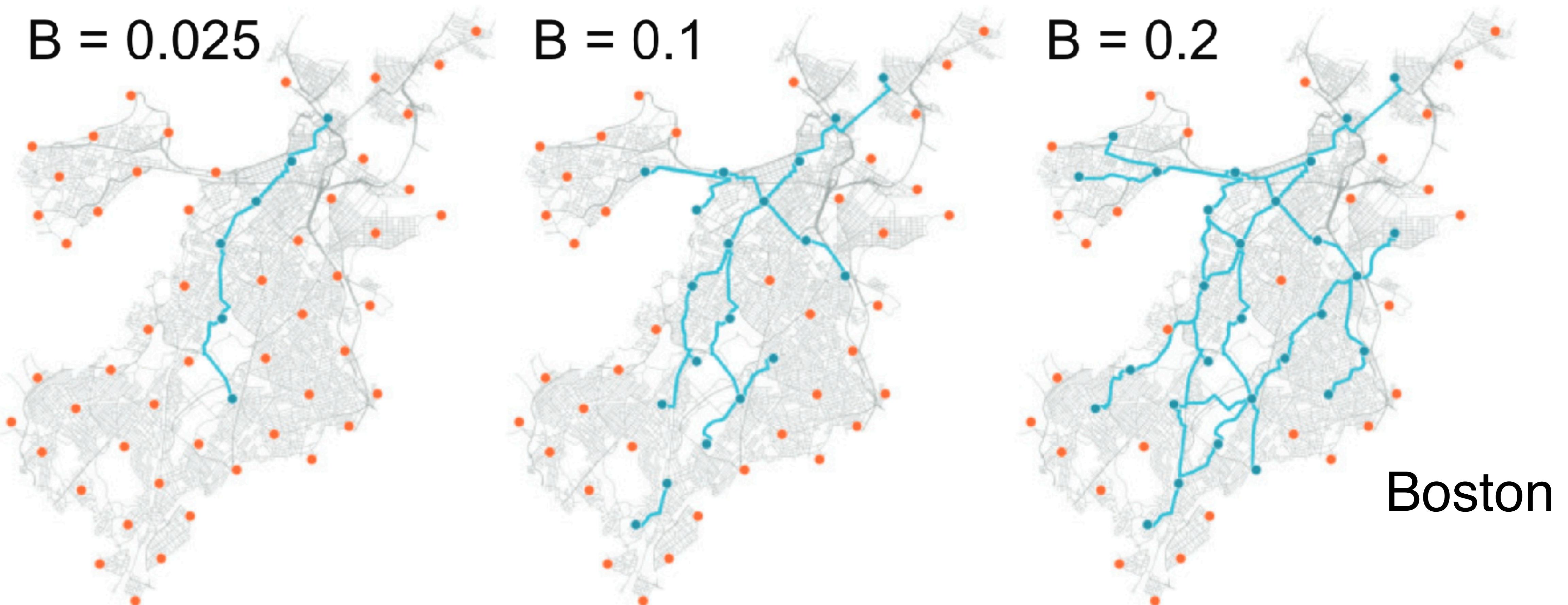


Growth metric quantiles 0→1

"Surprise": We grow networks and find percolation thresholds



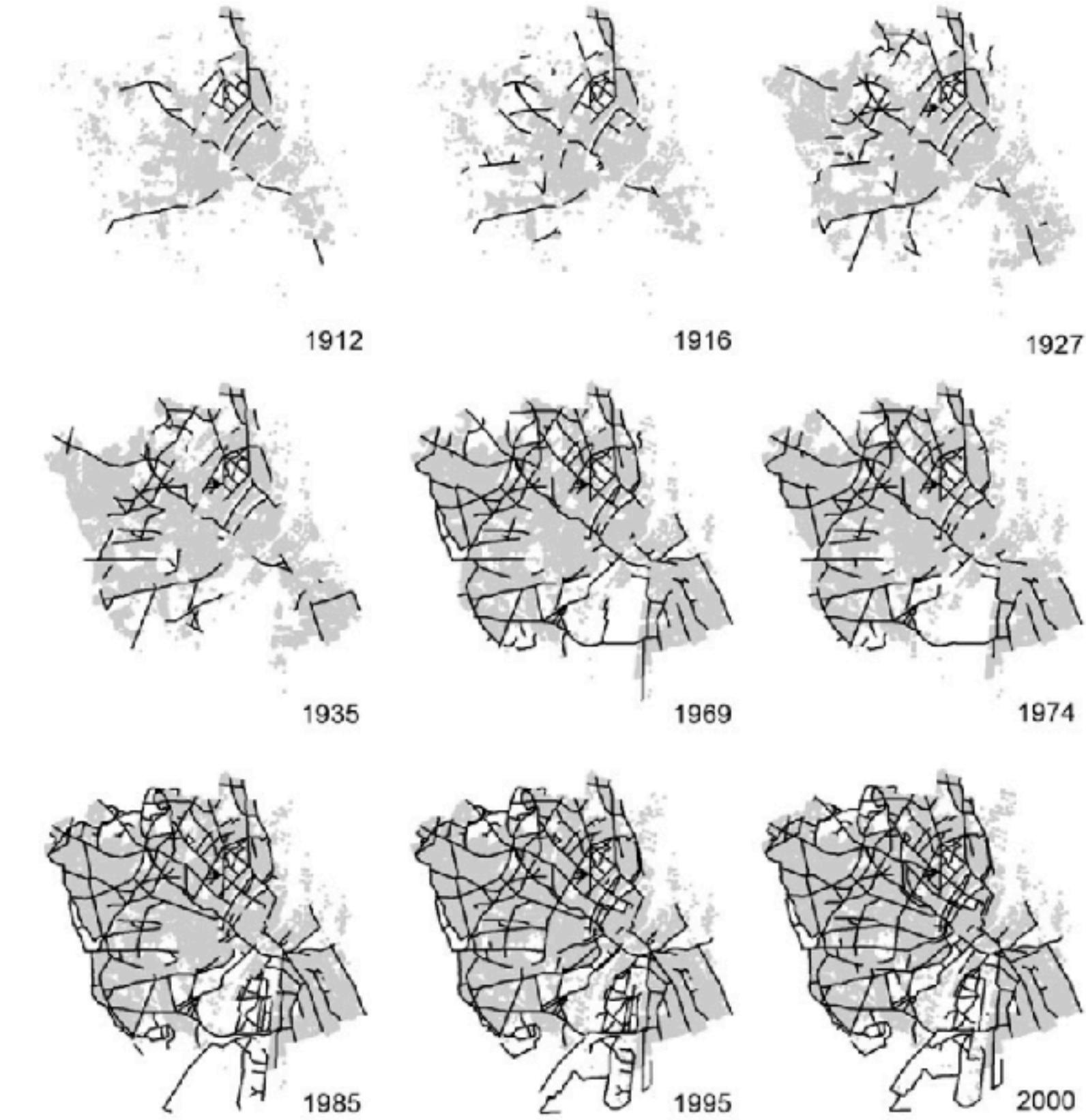
"Surprise": We grow networks and find percolation thresholds



2 Fundamental implications on bicycle network planning:

- 1) We need to grow with the right strategy
- 2) We need to invest **boldly** to reach a critical mass

The leading manuals suggest slow, local growth



It took Copenhagen many decades of political struggles to grow a cohesive network. Can we even plan for a whole city?

Time is running out

COVID popup lanes showed
accelerated transition is possible



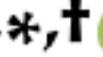
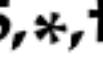
Failure to act fast has dire consequences..



My goal: Combine network+data science and
data visualization to make cities better places

Editorial

Human-Centric Data Science for Urban Studies

Bernd Resch^{1,2,*†}  and Michael Szell^{3,4,5,*†} 

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² Center for Geographic Analysis, Harvard University, Cambridge, MA 02138, USA

³ NEtwoRks, Data, and Society (NERDS), IT University of Copenhagen, 2300 Copenhagen, Denmark

Resch & Szell, ISPRS International Journal of Geo-Information 8, 584 (2019)

NERDS = NEtwoRks, Data, and Society

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