

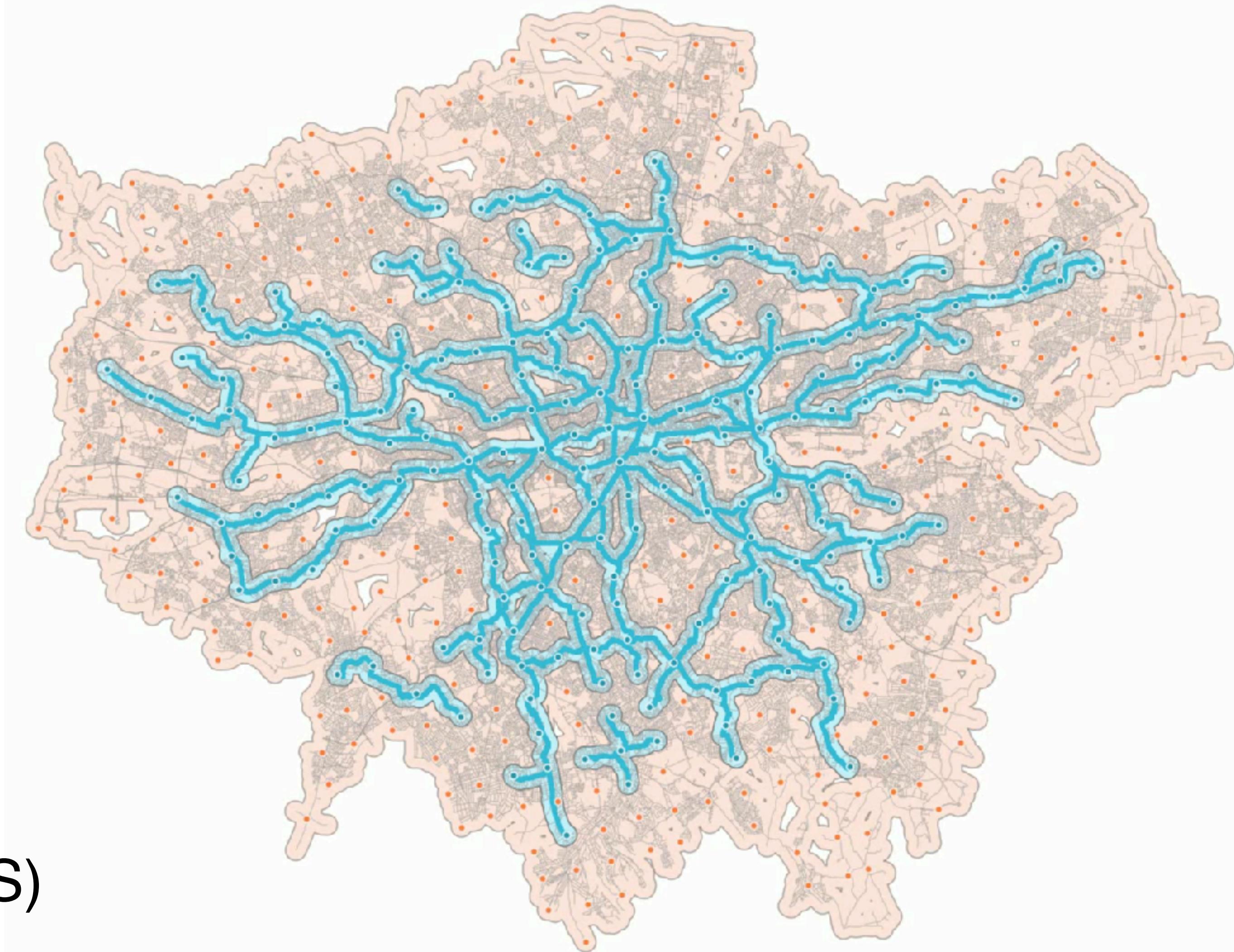
# The geometric limits of growing urban bicycle networks

Michael Szell

with:

S. Mimar, T. Perlman,  
G. Ghoshal, R. Sinatra

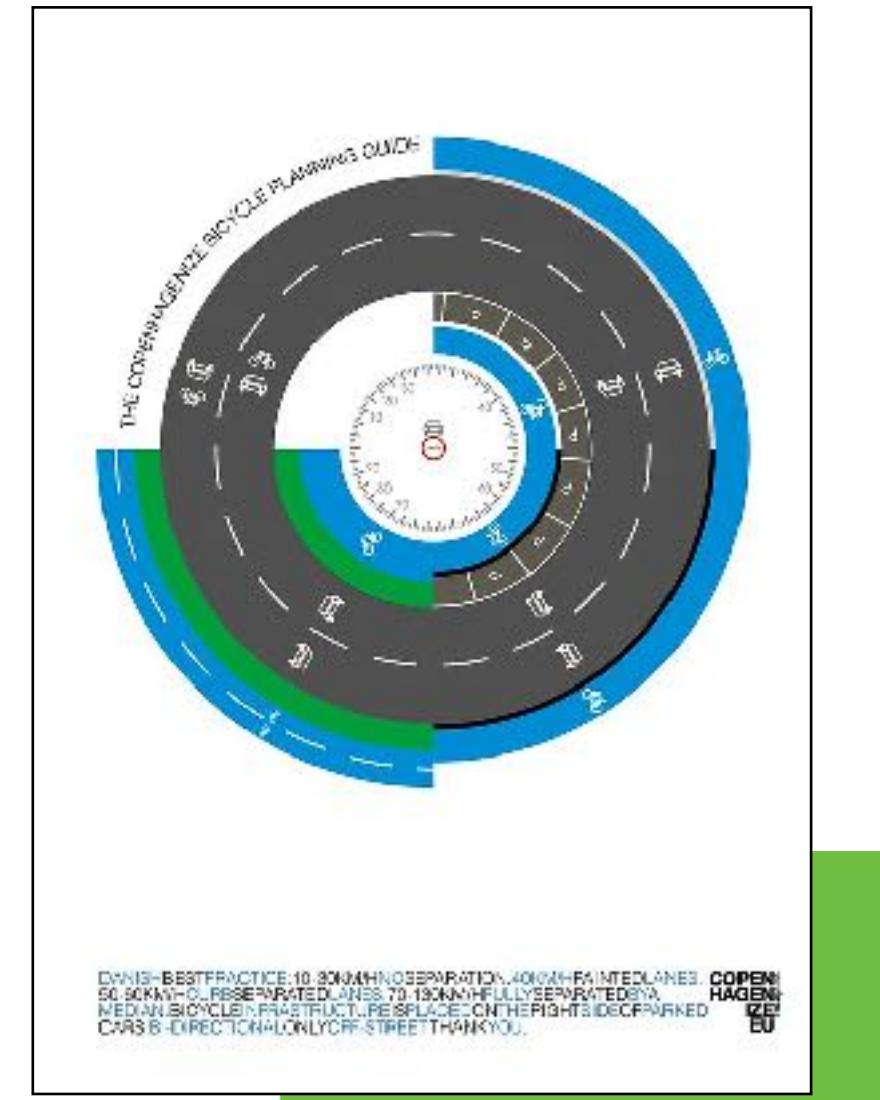
NEtwoRks, Data, and Society (NERDS)



IT UNIVERSITY OF COPENHAGEN

CRBAM21 Copenhagen, Oct 15, 2021

# Why we need a scientific theory of bicycle network development



We have great planning guides.. but



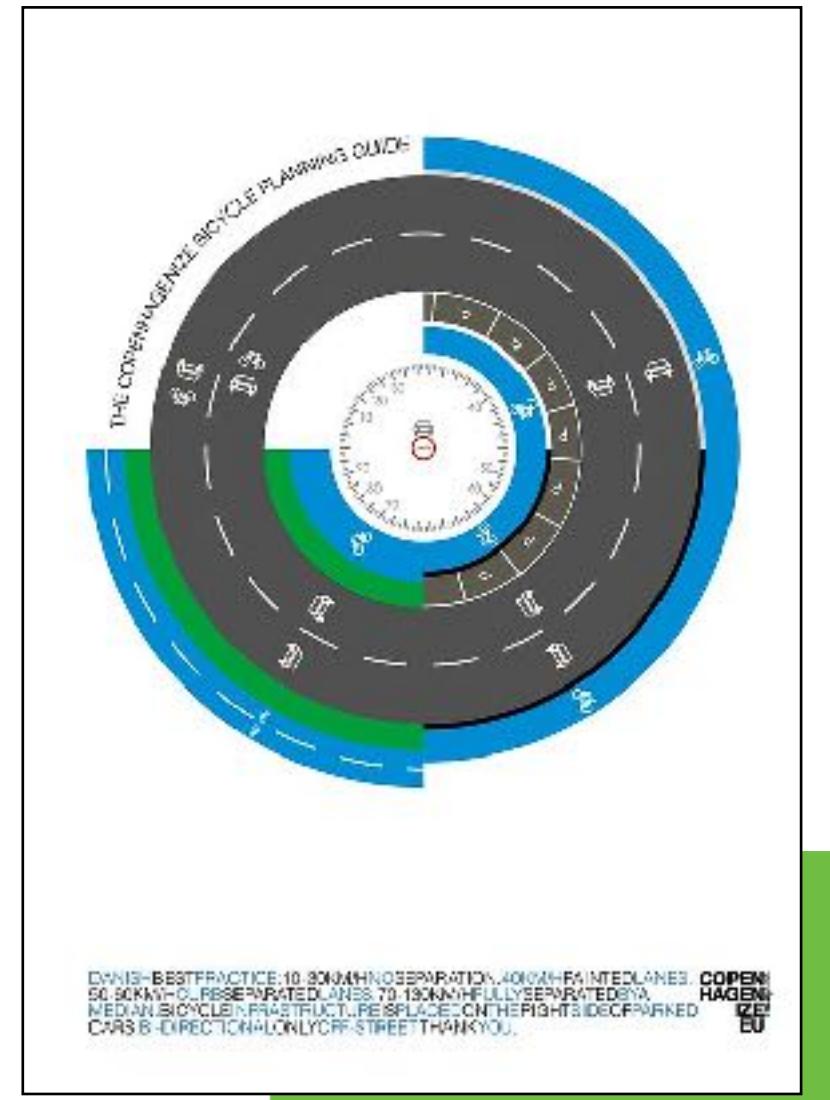
**NACTO**



**Urban Bikeway Design Guide**

April 2011 Edition

# Why we need a scientific theory of bicycle network development



**NACTO**



**Urban Bikeway Design Guide**  
April 2011 Edition

We have great planning guides.. but



We have no knowledge on the fundamental geometric limitations of network growth.

Previous research  
Connecting bicycle networks

# Previous research: Connecting bicycle networks

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[royalsocietypublishing.org/journal/rsos](https://royalsocietypublishing.org/journal/rsos)

Research

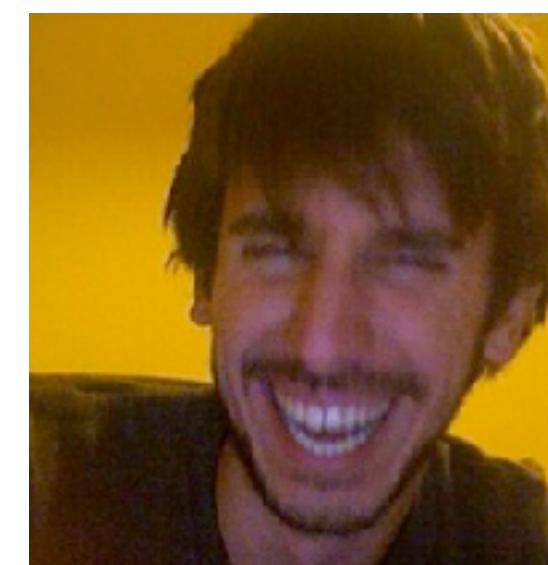
Cite this article: Natera Orozco LG, Battiston F, Iñiguez G, Szell M. 2020 Data-driven strategies for optimal bicycle network growth. *R. Soc. Open Sci.* 7: 201130. <https://doi.org/10.1098/rsos.201130>

 Check for updates

Data-driven strategies  
for optimal bicycle  
network growth

Luis Guillermo Natera Orozco<sup>1</sup>, Federico Battiston<sup>1</sup>,  
Gerardo Iñiguez<sup>1,2,3</sup> and Michael Szell<sup>4,5,6</sup>

<sup>1</sup>Department of Network and Data Science, Central European University, 1100 Vienna, Austria  
<sup>2</sup>Department of Computer Science, Aalto University School of Science, 00076 Aalto, Finland  
<sup>3</sup>Centro de Ciencias de la Complejidad, Universidad Nacional Autónoma de México, 04510 CDMX, Mexico  
<sup>4</sup>NEtwoRks, Data, and Society (NERDS), IT University of Copenhagen, 2300 Copenhagen, Denmark  
<sup>5</sup>ISI Foundation, 10126 Turin, Italy  
<sup>6</sup>Complexity Science Hub Vienna, 1080 Vienna, Austria



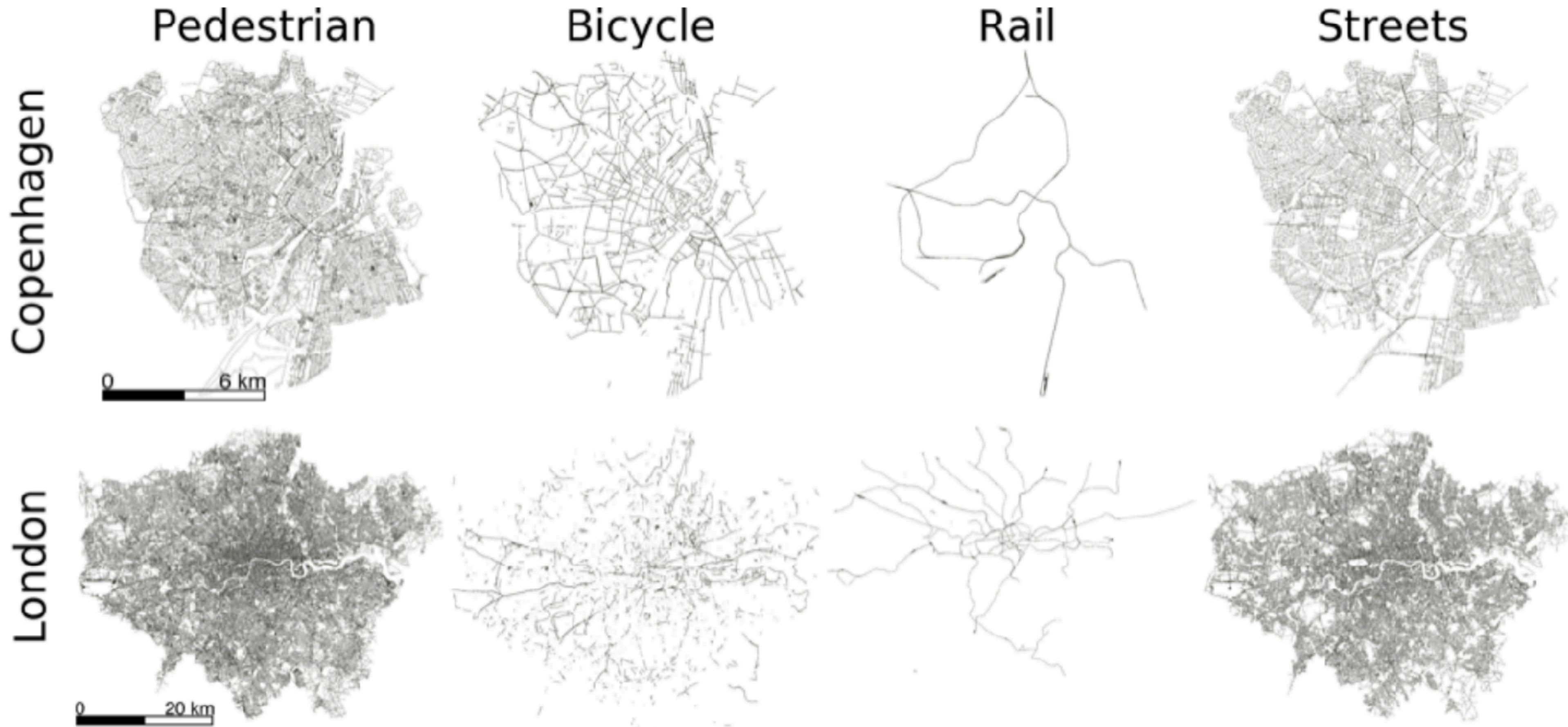
Luis Guillermo  
Natera Orozco



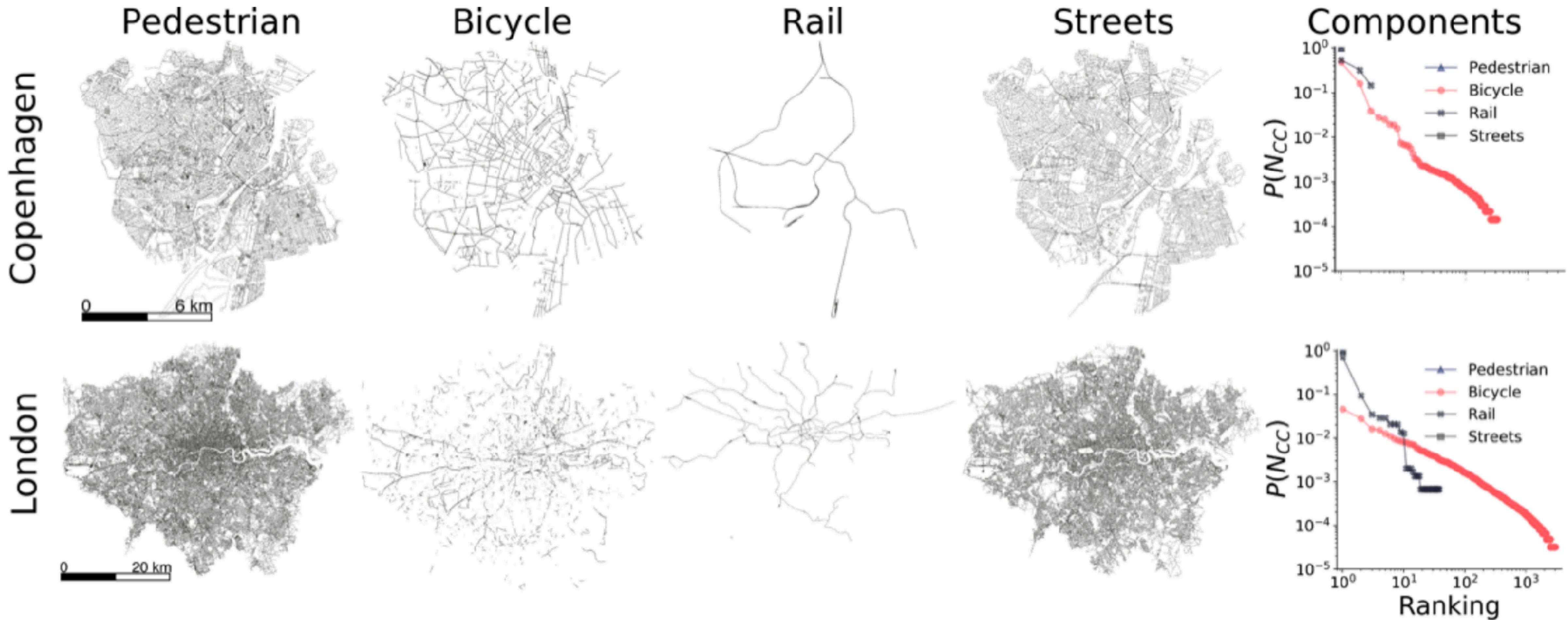
CRBAM19 Delft

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

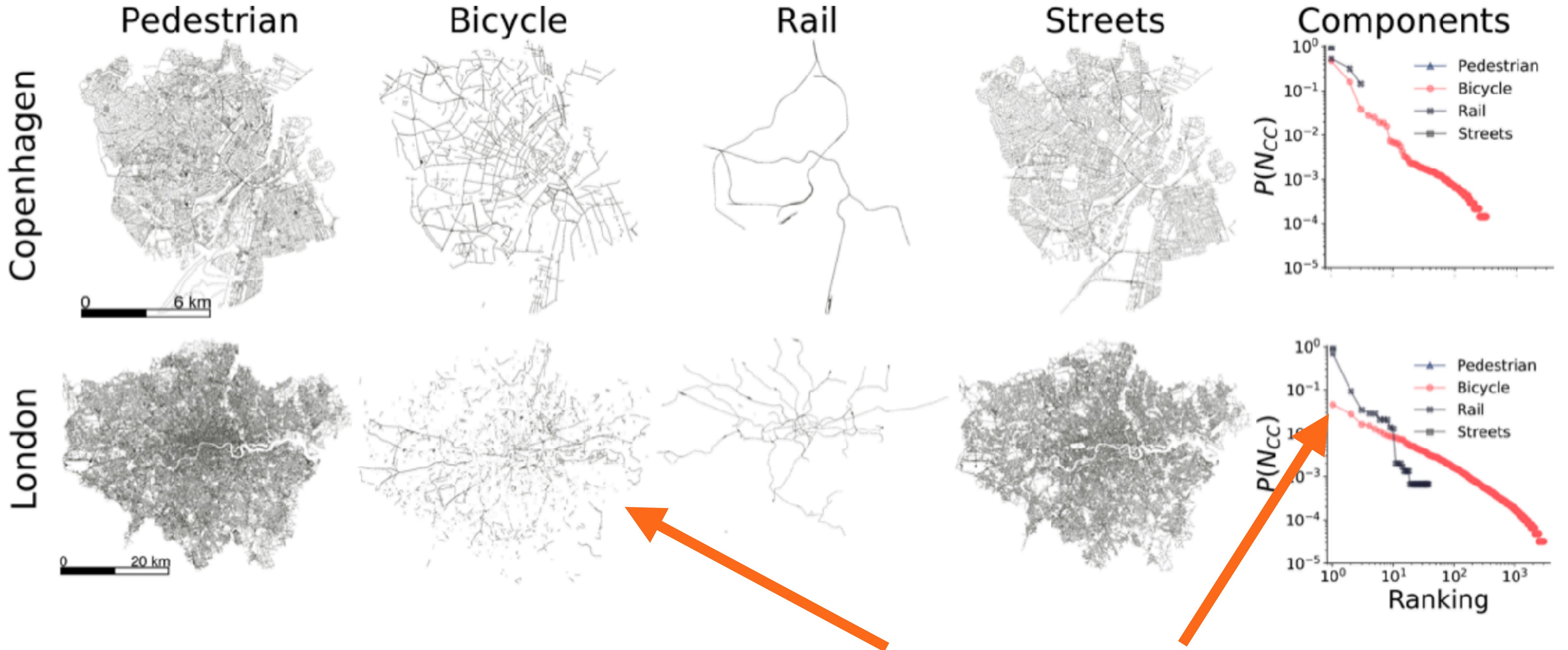
# Cities have different transport network layers



# Bicycle networks are highly fragmented

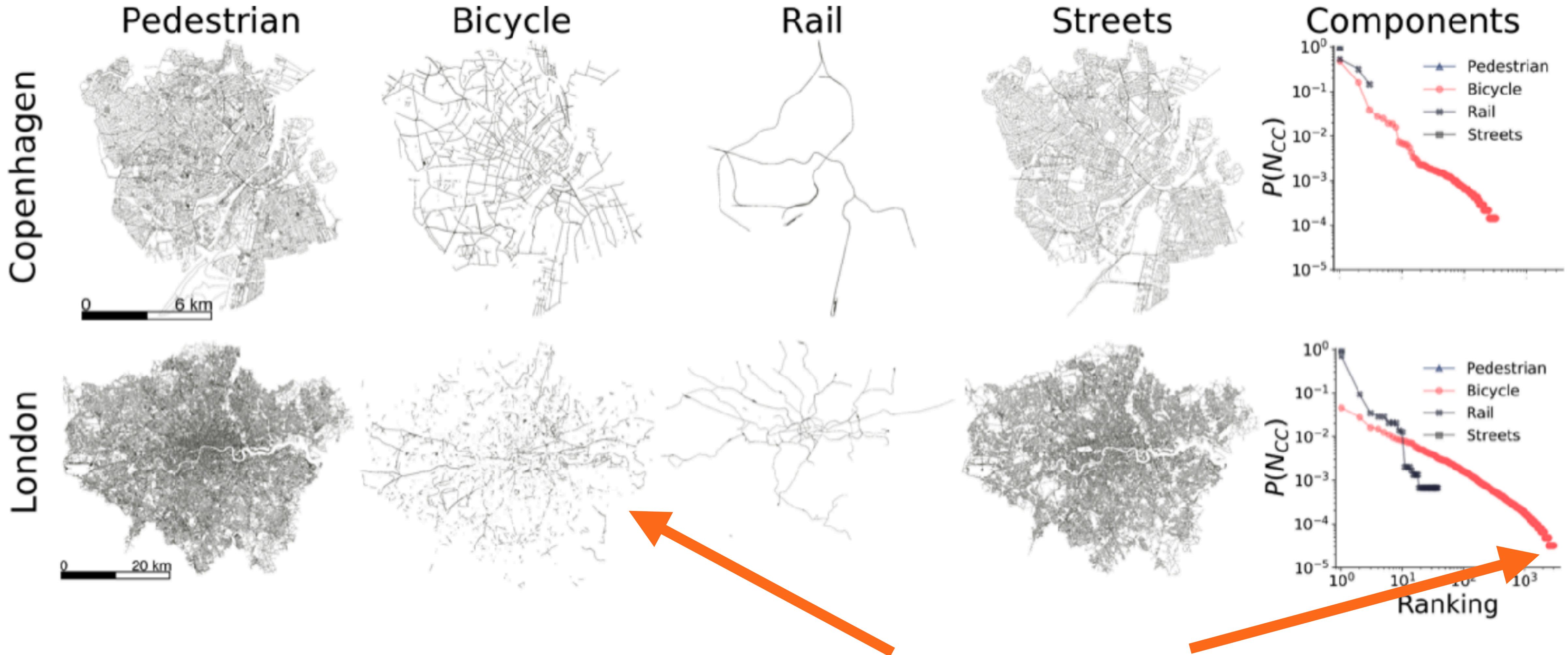


# Bicycle networks are highly fragmented



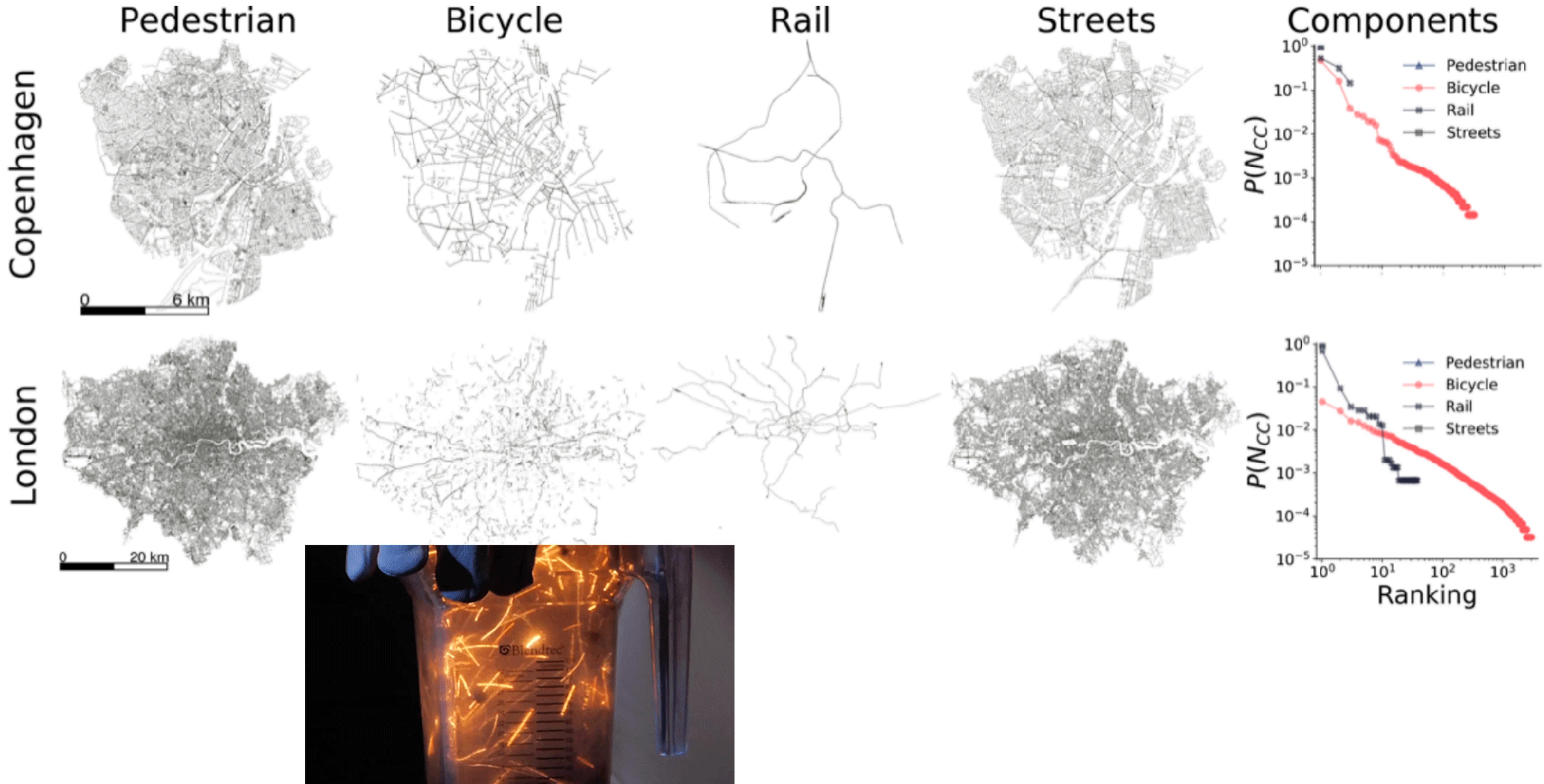
1) In London, the largest connected bicycle component covers only 5% of nodes

# Bicycle networks are highly fragmented



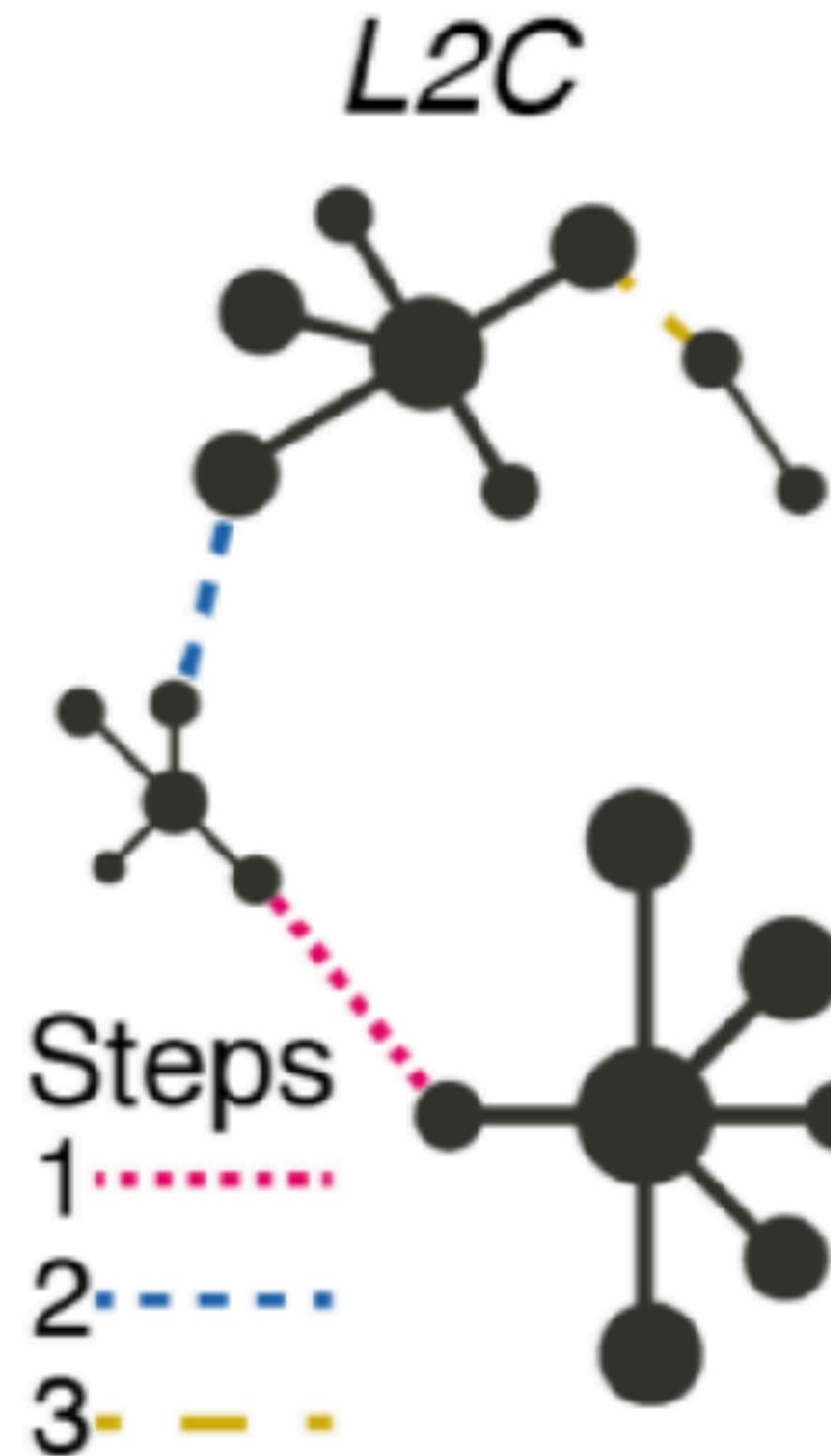
2) In London, the bicycle network has  
>3000 disconnected components

# Bicycle networks are highly fragmented

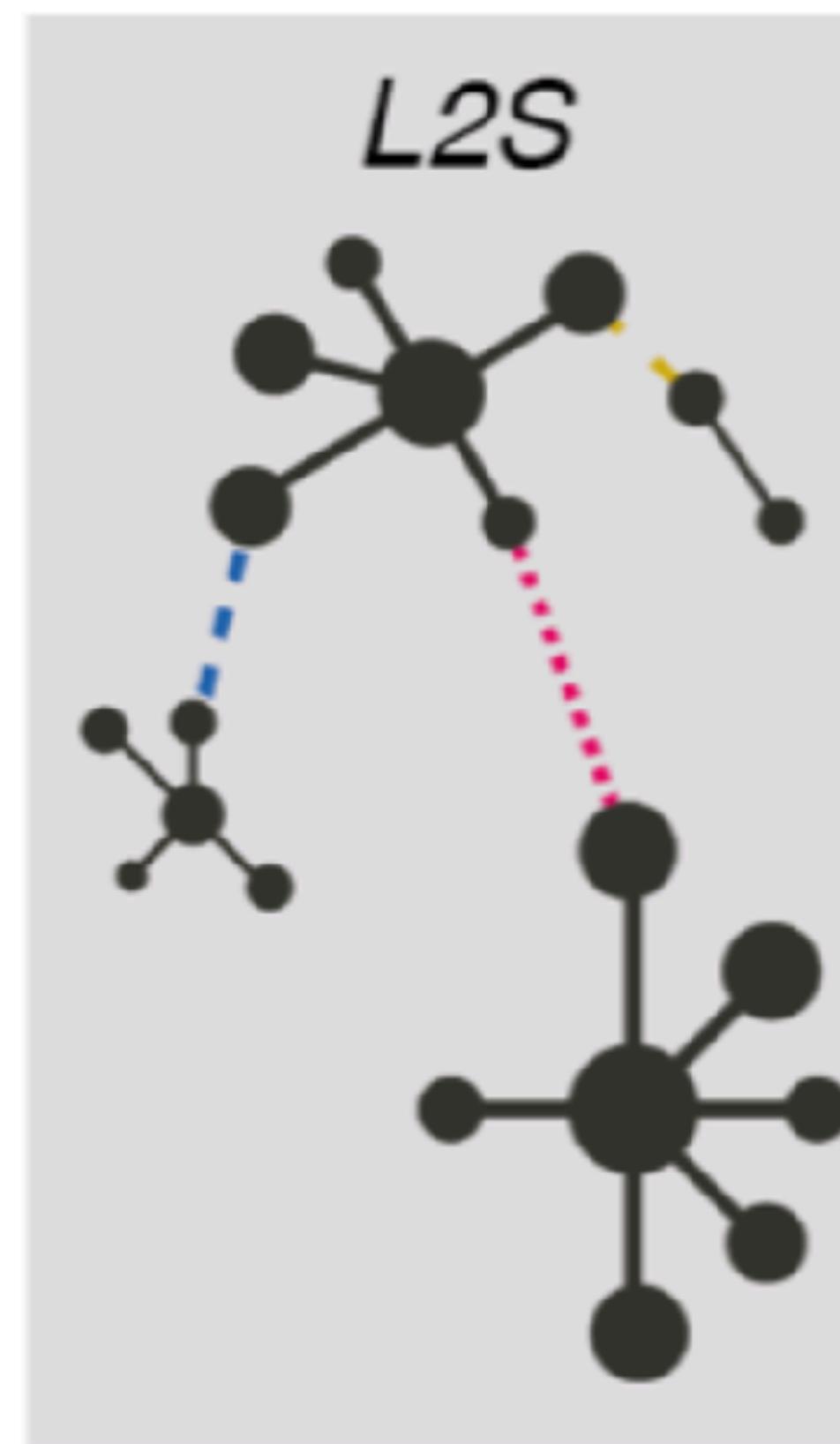


# How should we connect the components?

Largest to  
closest



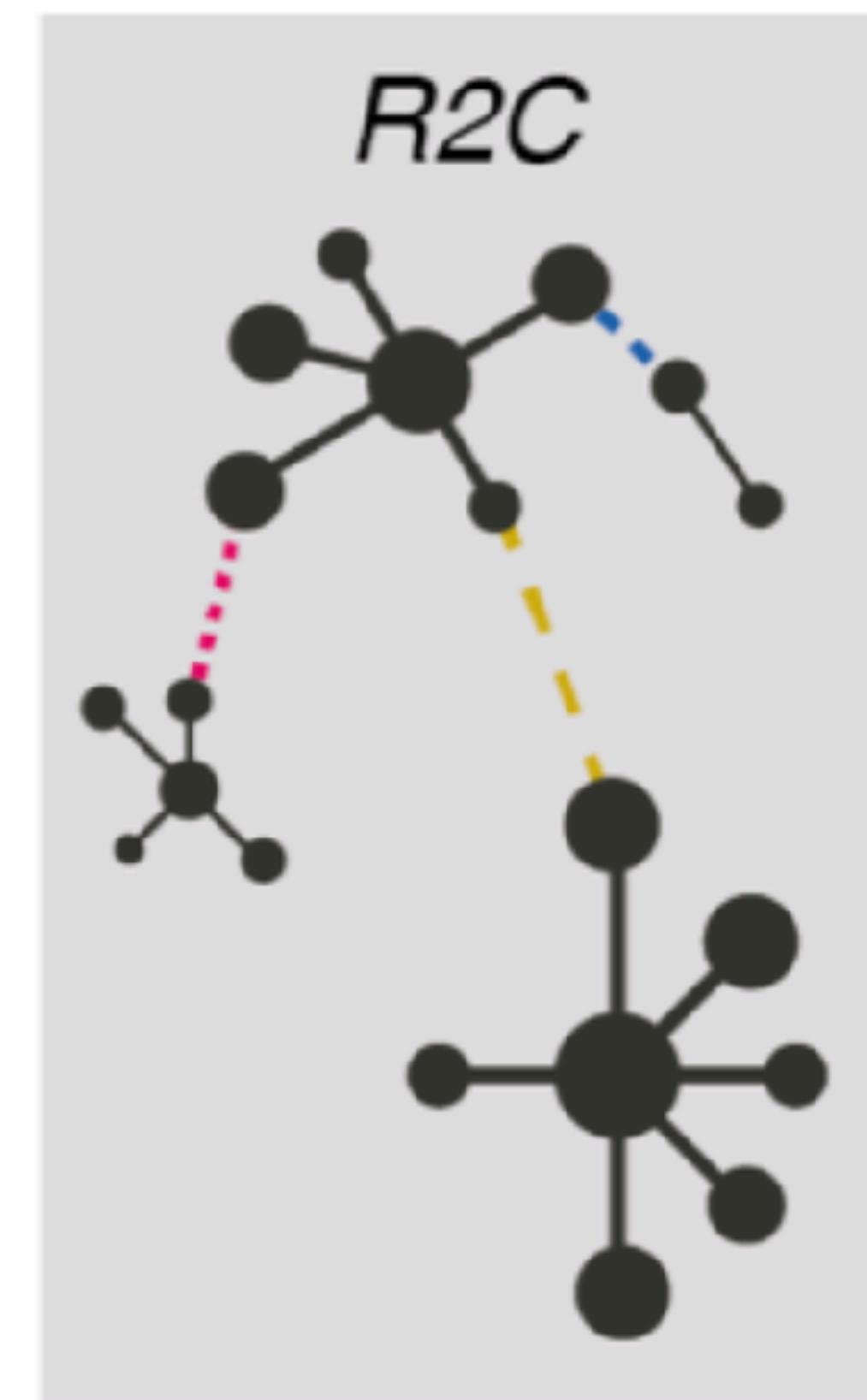
Largest to  
second largest



Closest  
components



Random to  
closest



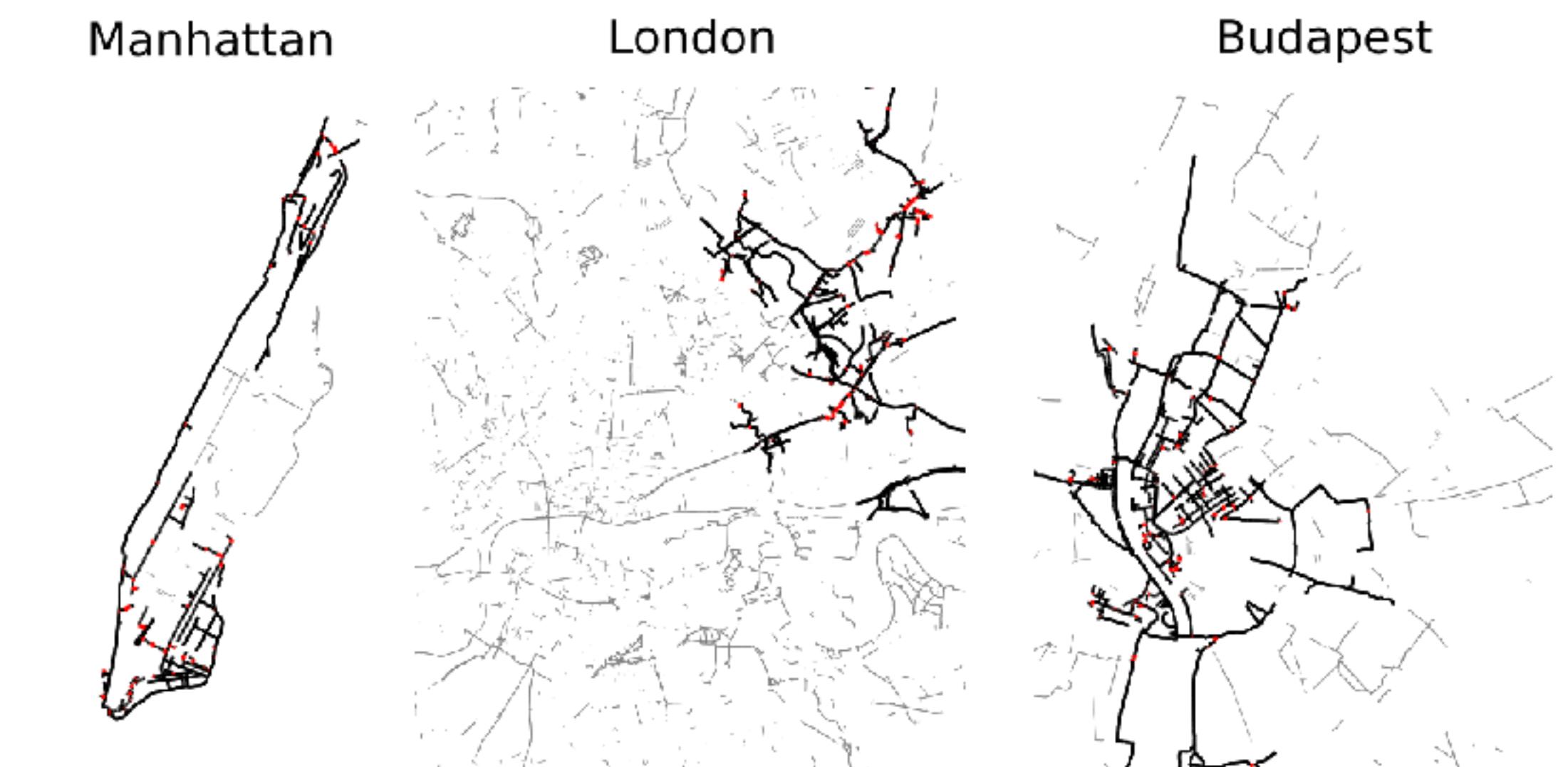
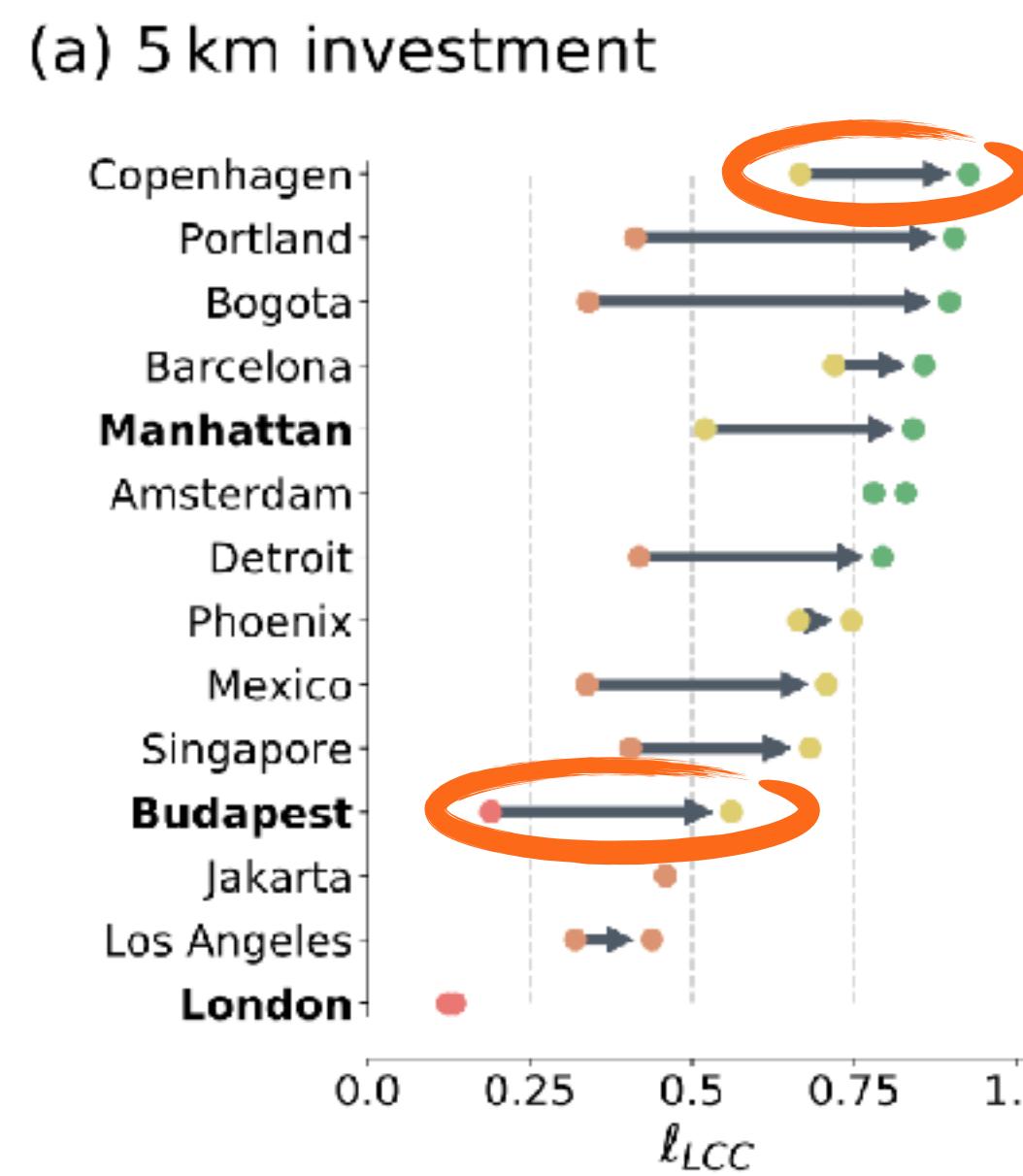
# Main insights from our previous study

## 1) Fragmentation

All cities have fragmented bicycle networks, even Copenhagen

## 2) Effective connectivity improvements possible

In developed cities like Copenhagen, small but focused investments connect the bicycle network effectively

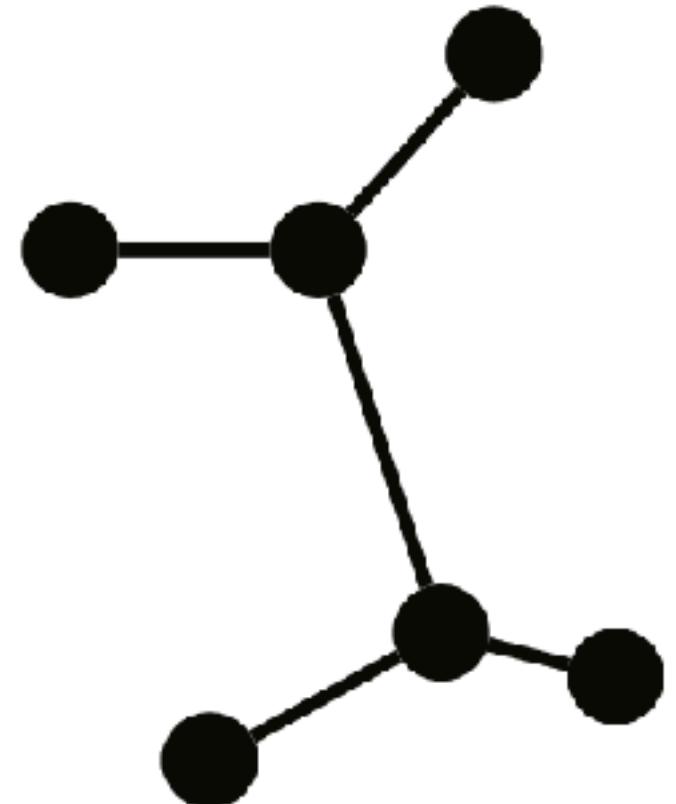


New research  
**Growing bicycle networks**

# Just connecting components comes with 3 issues

## 1) No resilience

Minimum spanning tree



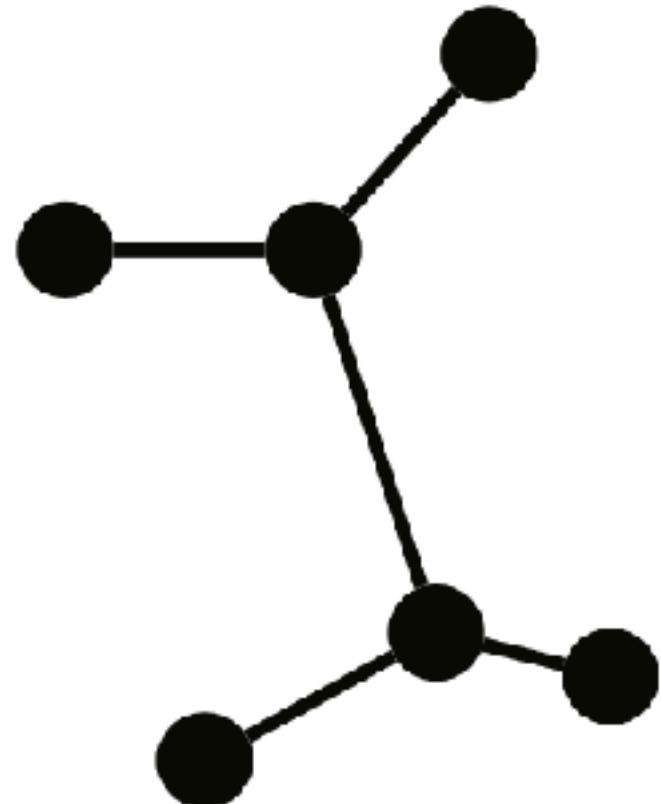
Investor's optimum

# Just connecting components comes with 3 issues

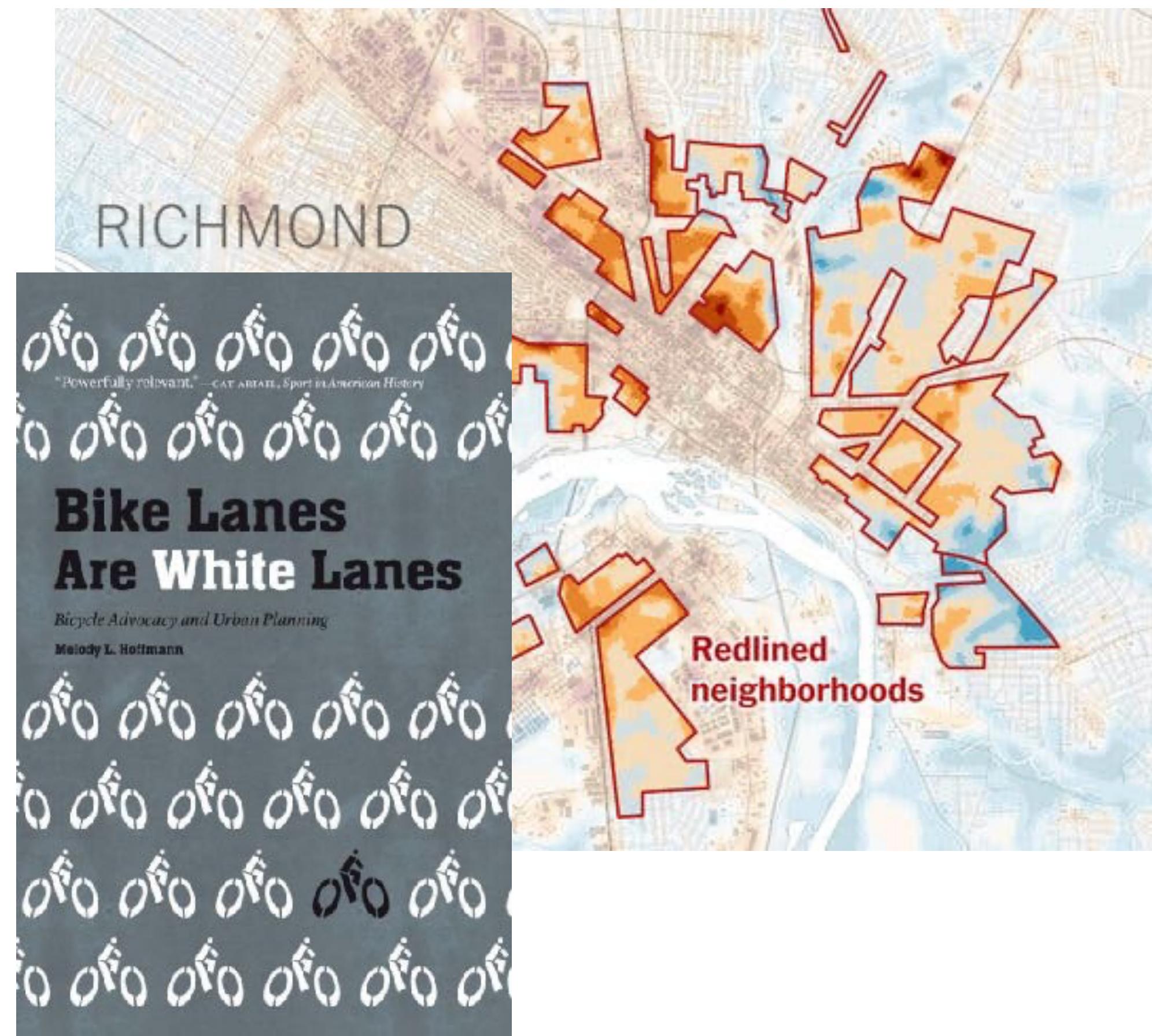
1) No resilience

2) Develops only developed areas

Minimum spanning tree



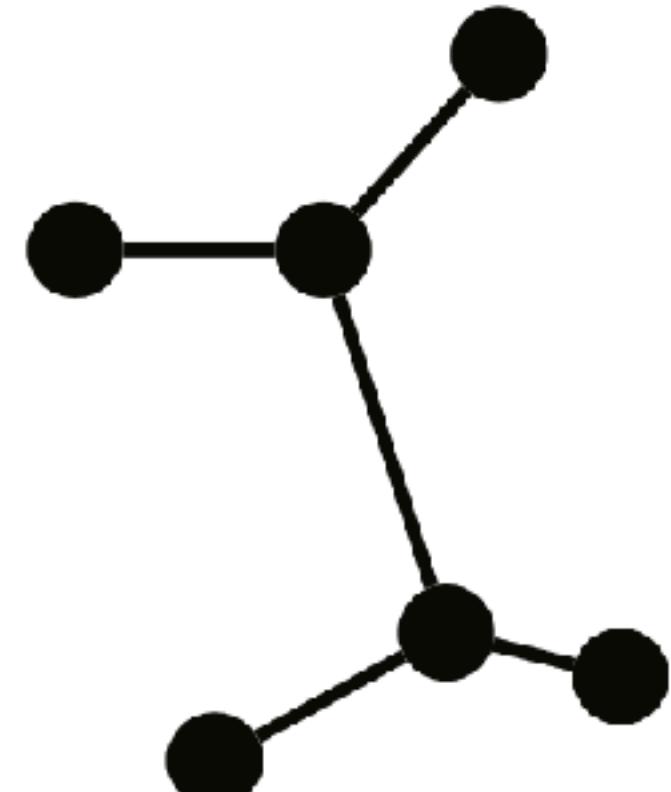
Investor's optimum



# Just connecting components comes with 3 issues

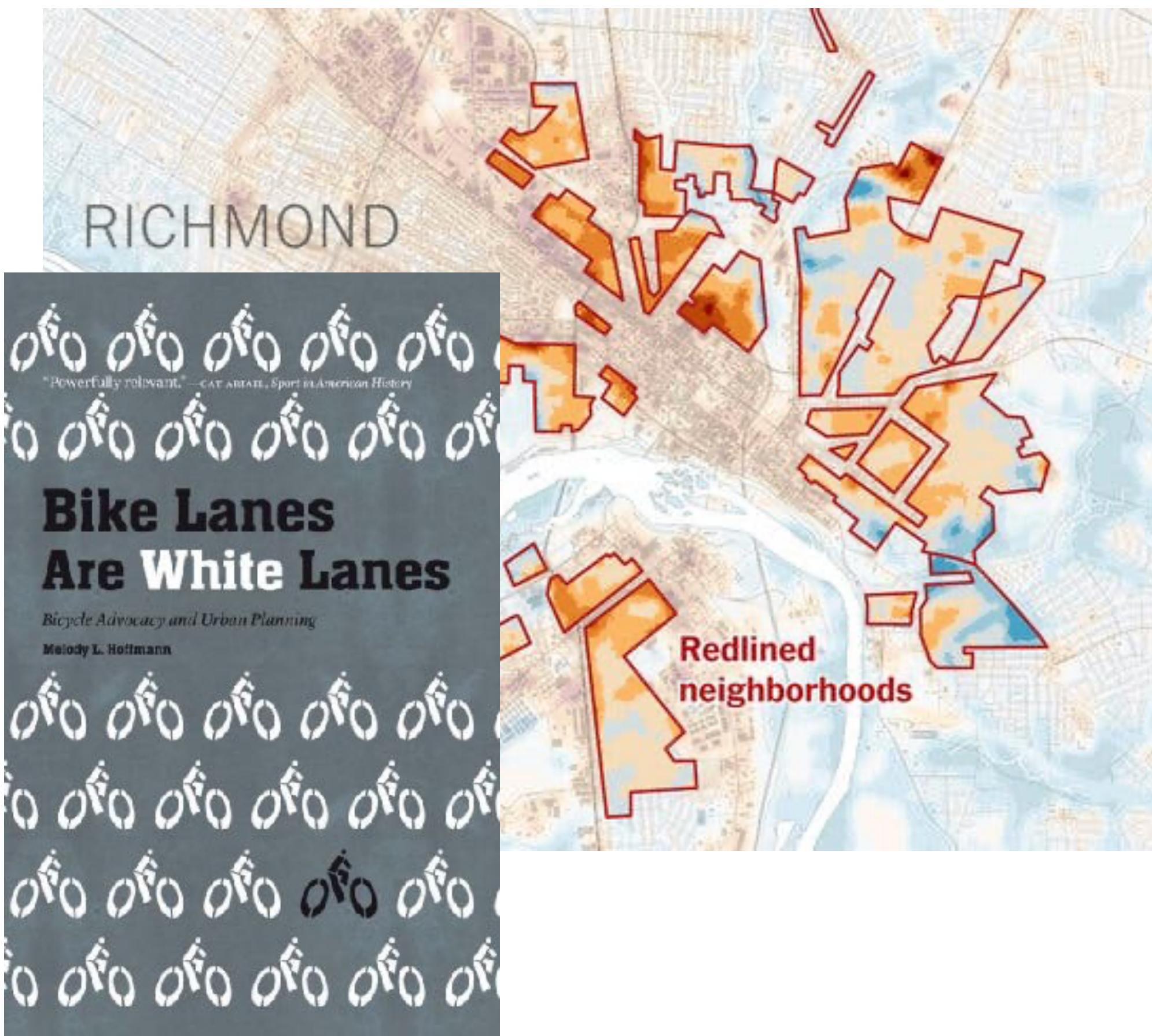
1) No resilience

Minimum spanning tree

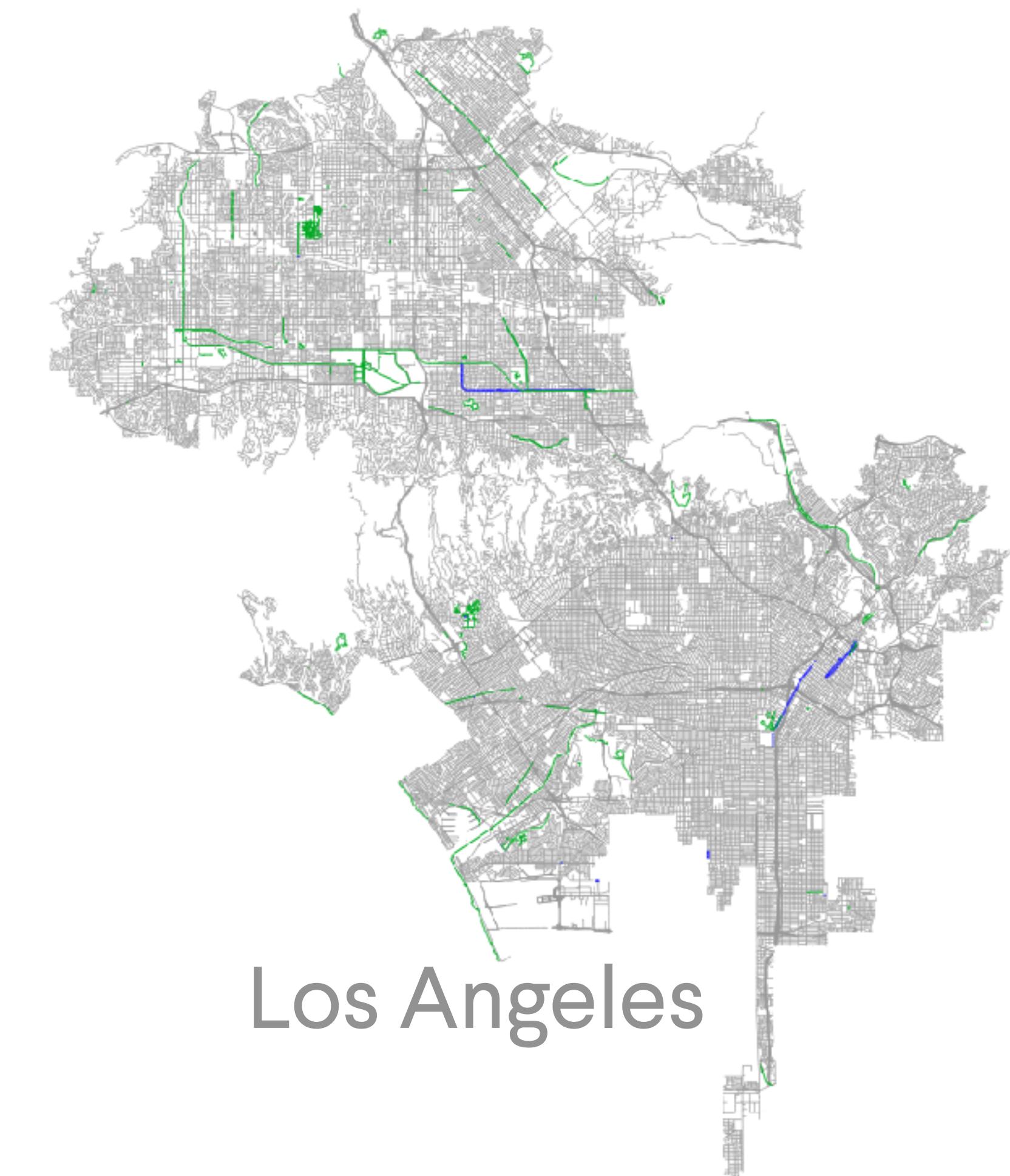


Investor's optimum

2) Develops only developed areas



3) Irrelevant for >99% of cities on the planet

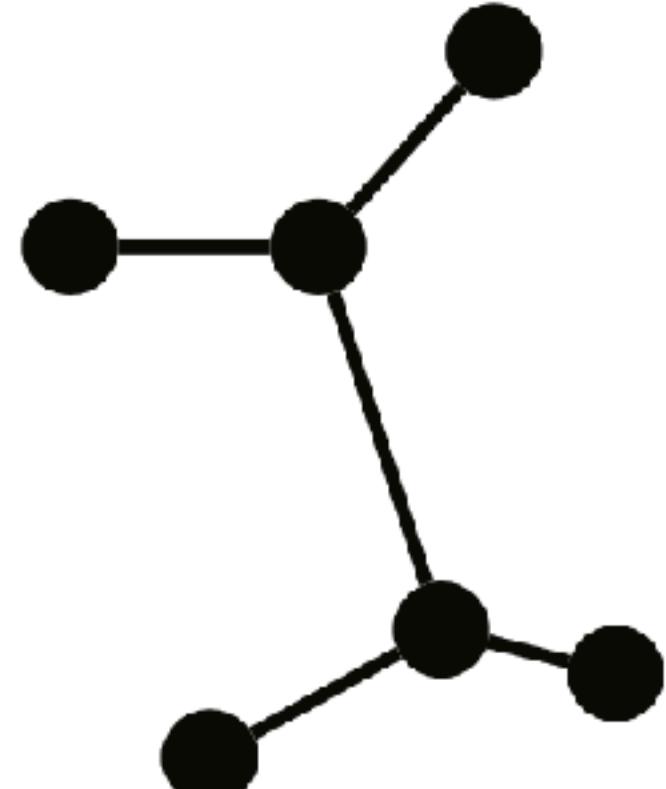


Let's study growing networks  
from scratch

# Inspired by CROW, we want a **cohesive** network

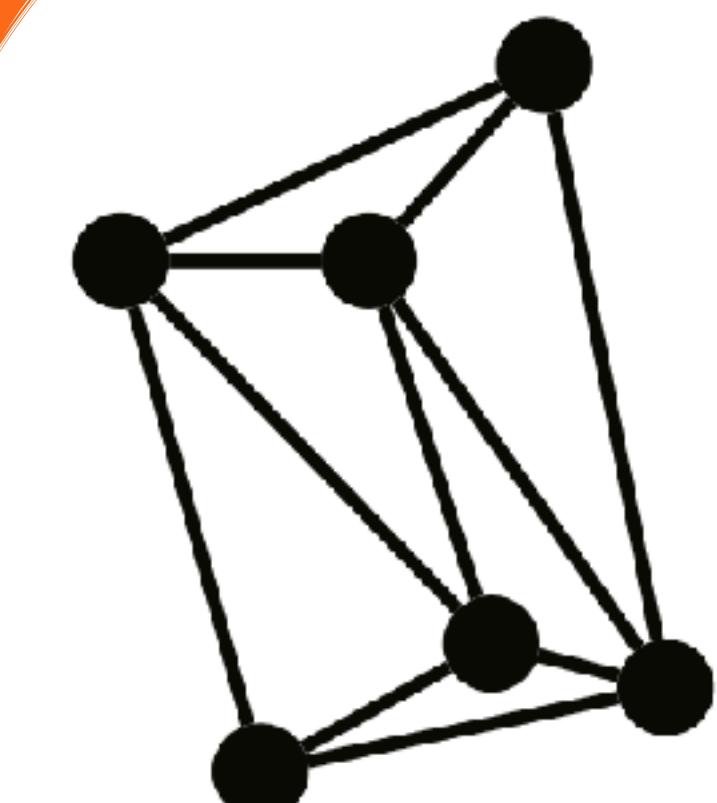
Connectedness & Resilience

Minimum spanning tree



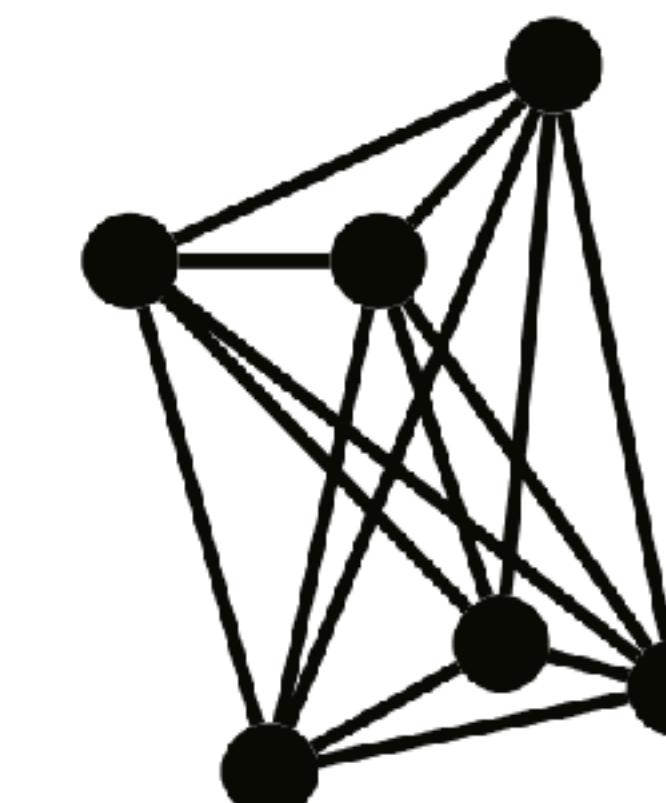
Investor's optimum

Triangulation



Cohesive planar network

Fully connected



Traveler's optimum

Economic

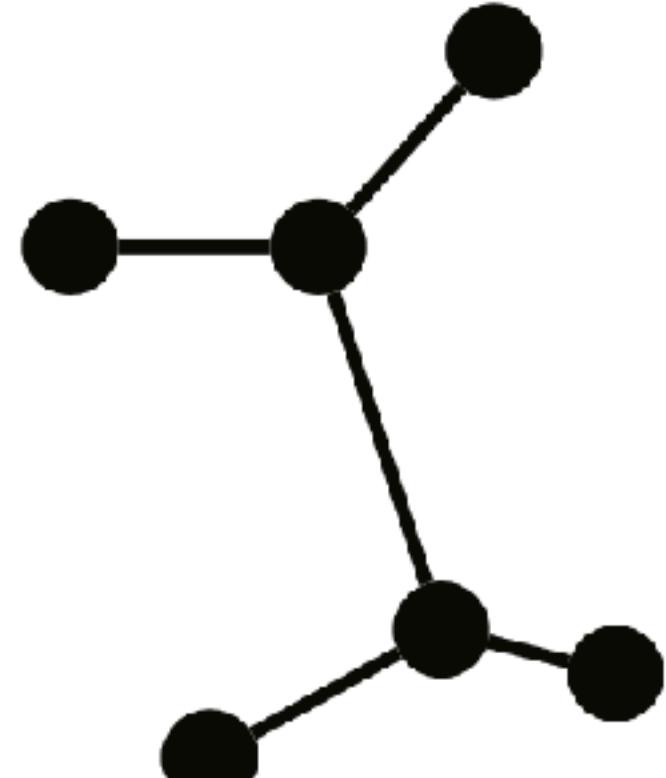
Resilient

# Inspired by CROW, we want a **cohesive** network

Connectedness & Resilience

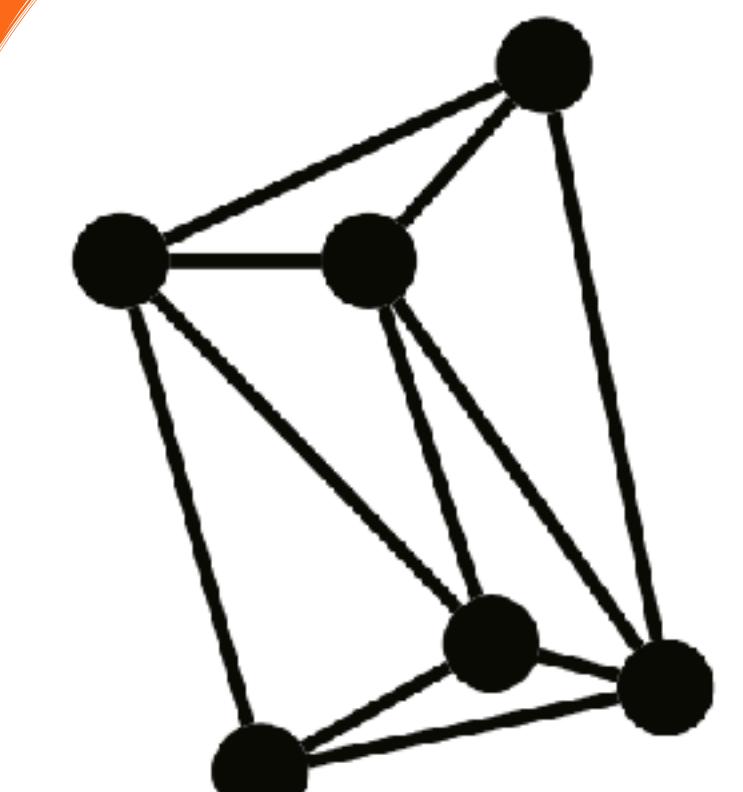
& Coverage

Minimum spanning tree



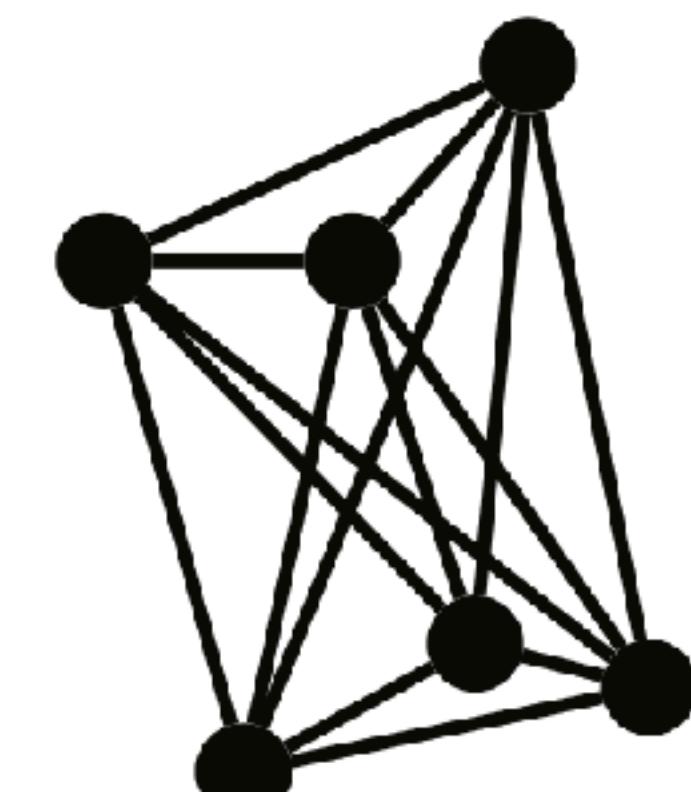
Investor's optimum

Triangulation



Cohesive planar network

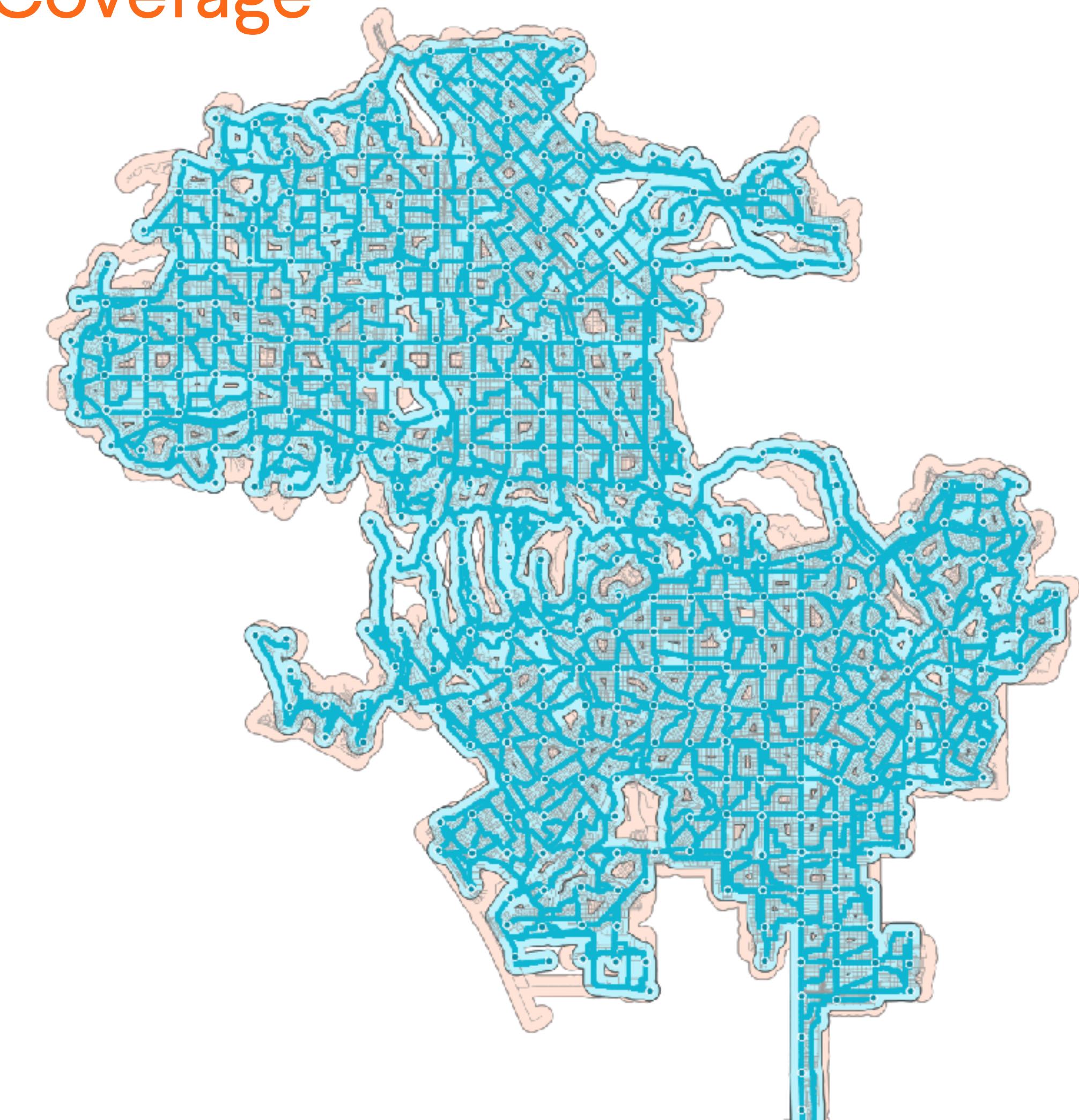
Fully connected



Traveler's optimum

Economic

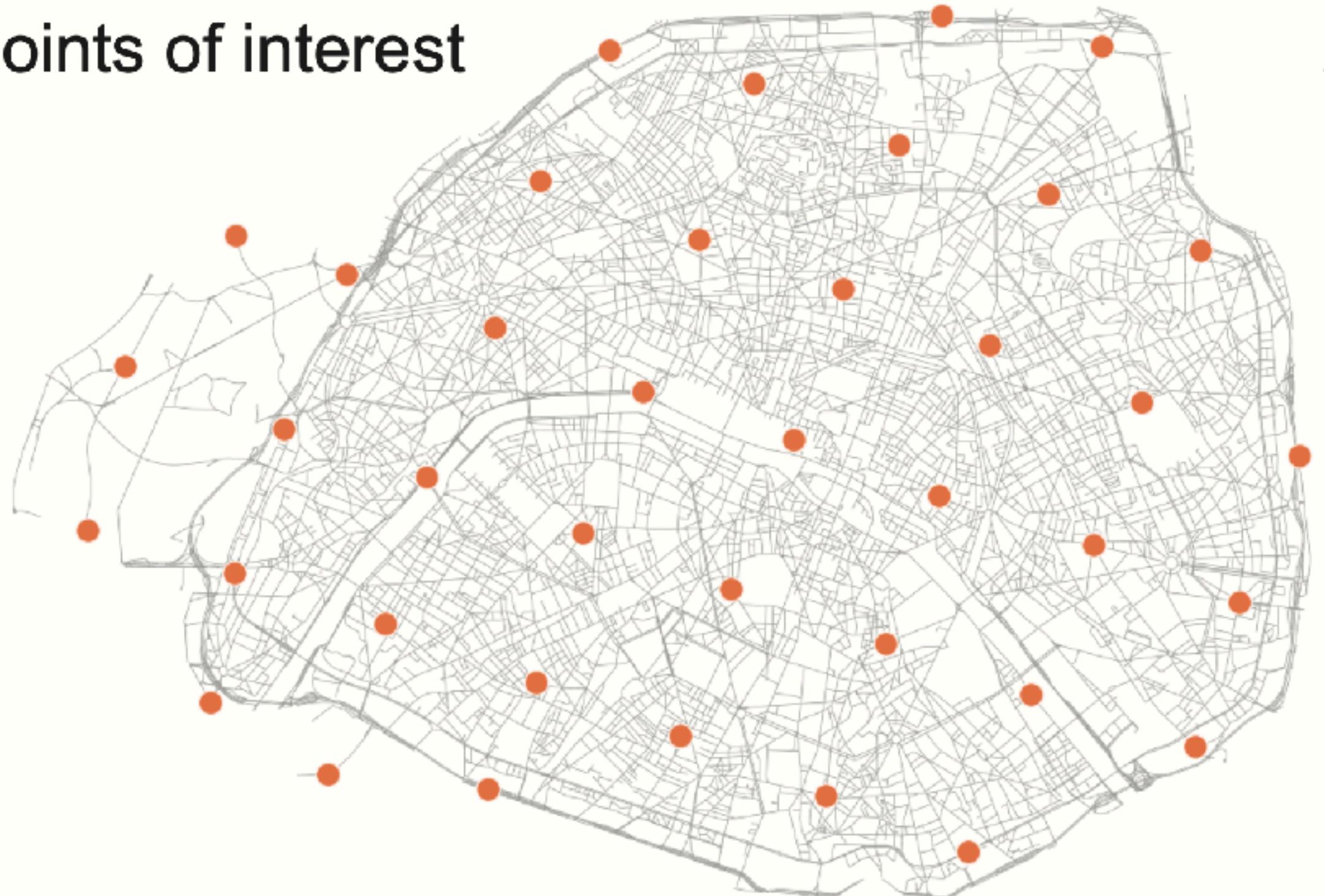
Resilient



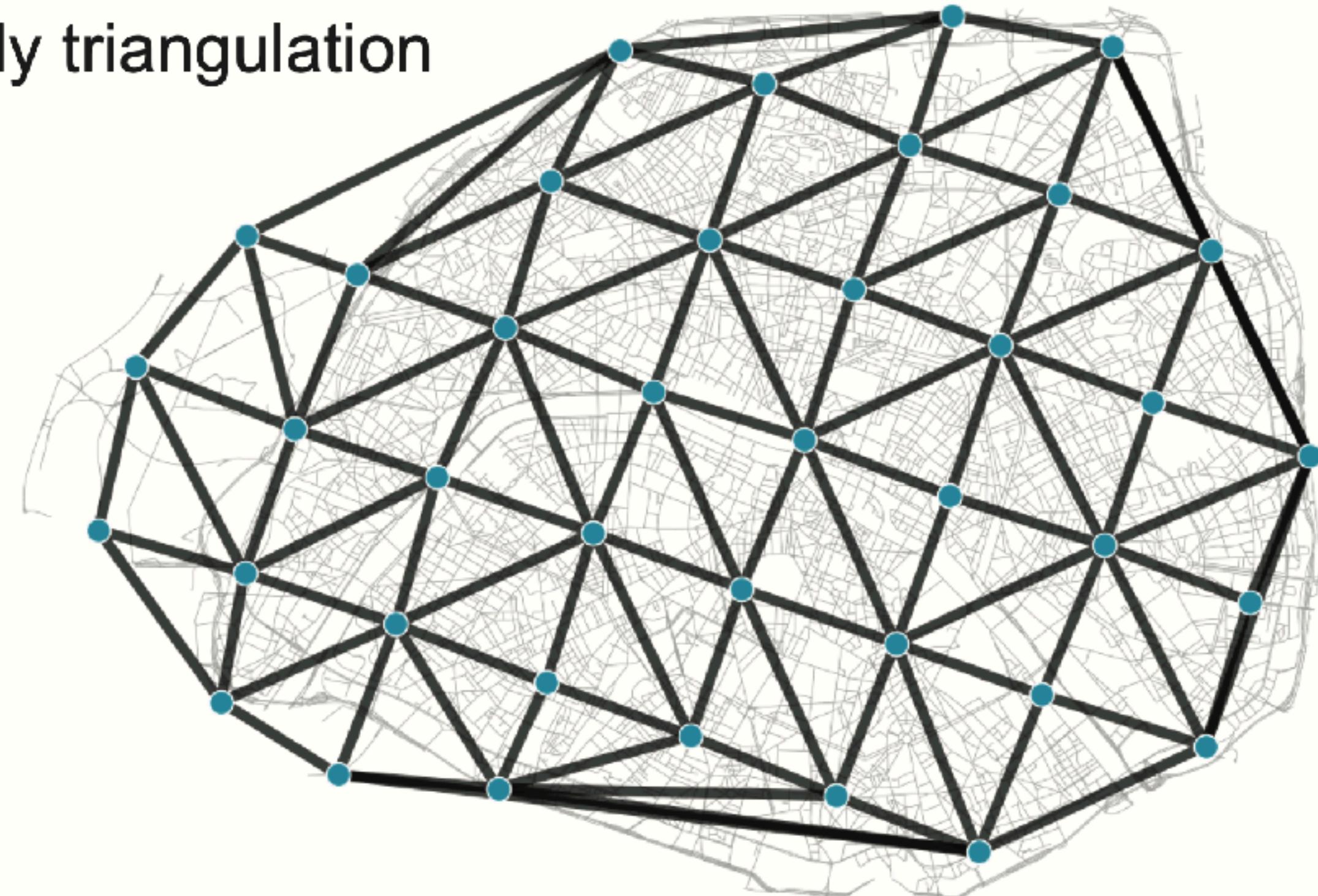
# We build a greedy triangulation between points of interest

Street network &

1) Points of interest



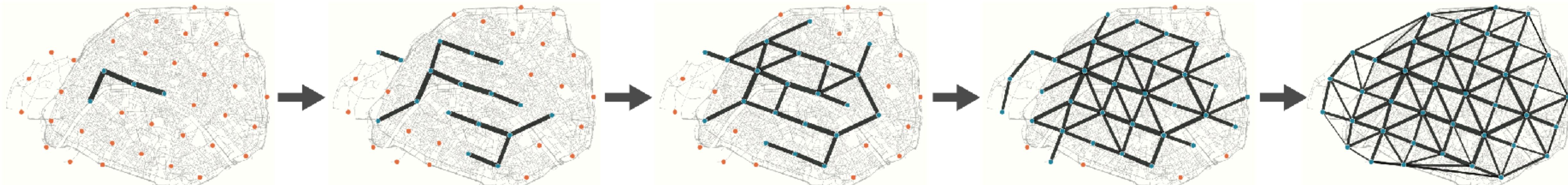
2) Greedy triangulation



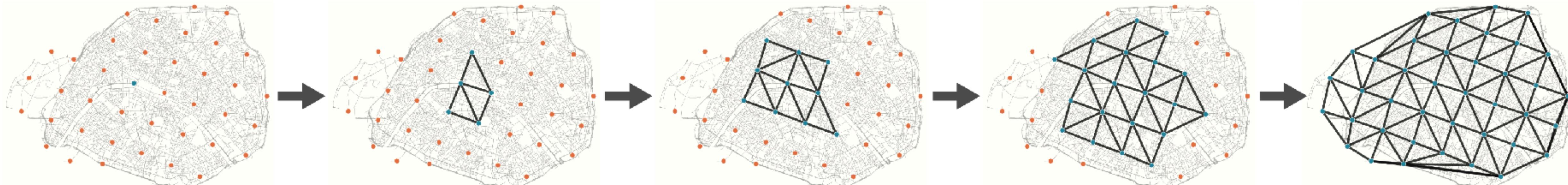
# We build a greedy triangulation between points of interest

## 3) Order by growth strategy

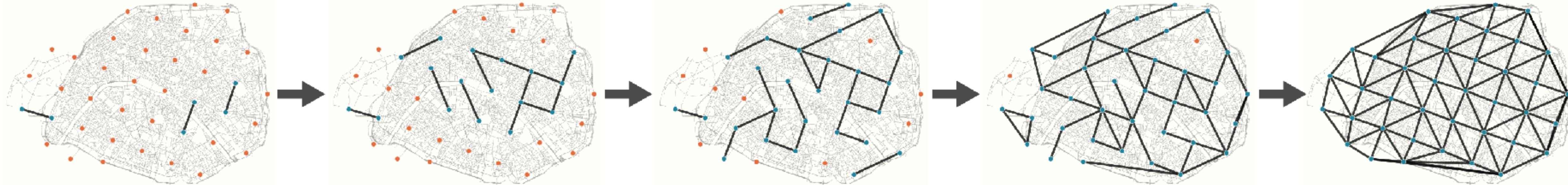
Betweenness



Closeness



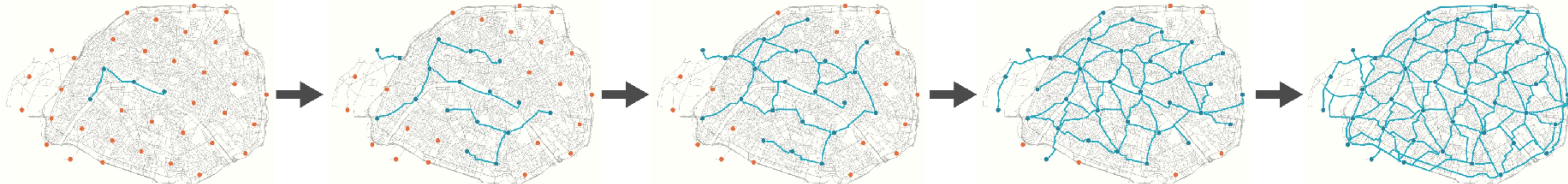
Random



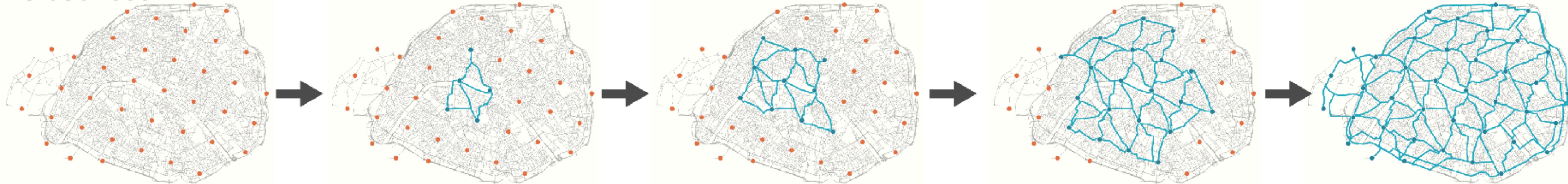
# We build a greedy triangulation between points of interest

## 4) Route on street network

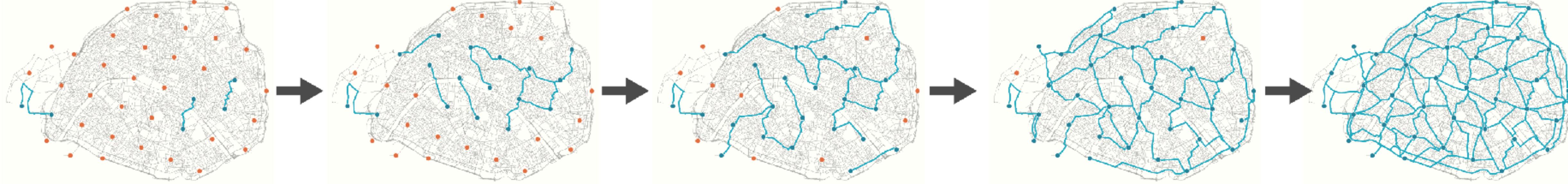
Betweenness



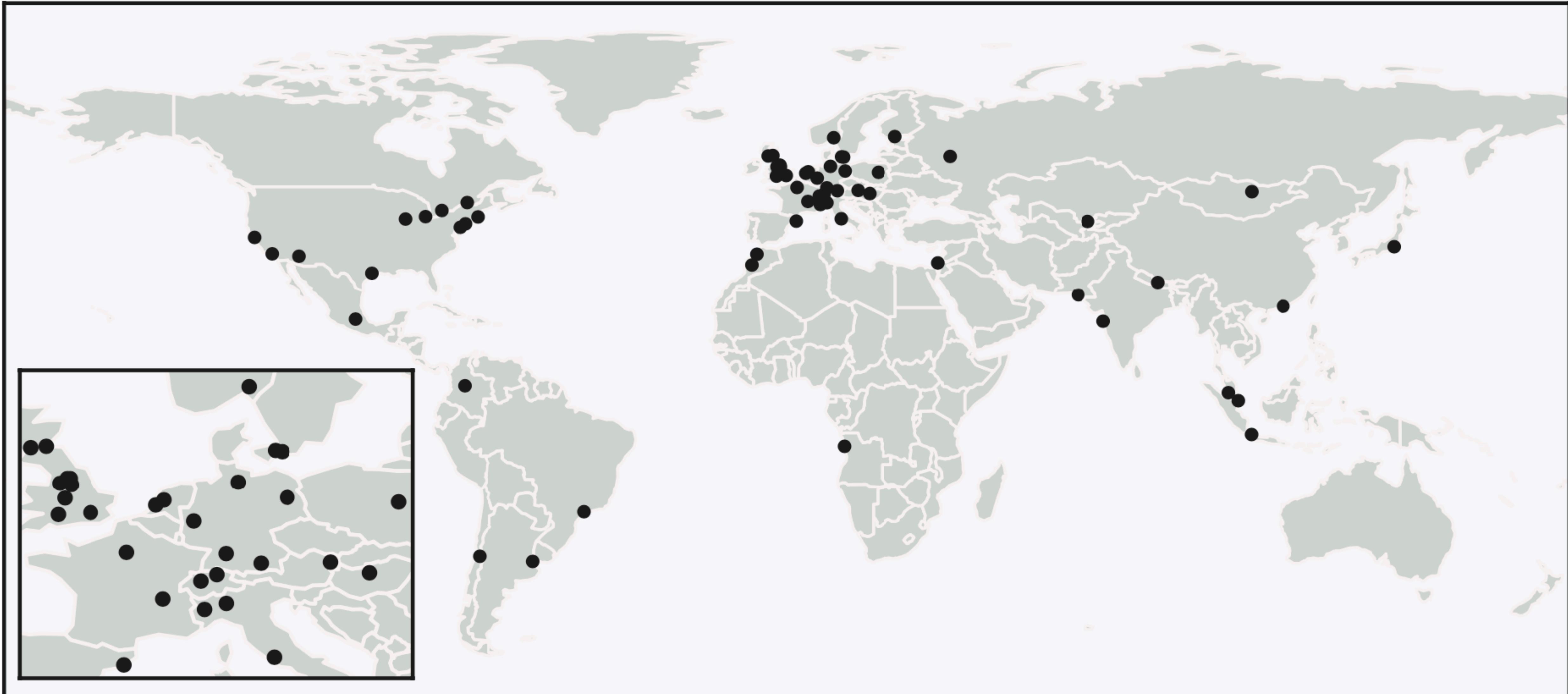
Closeness



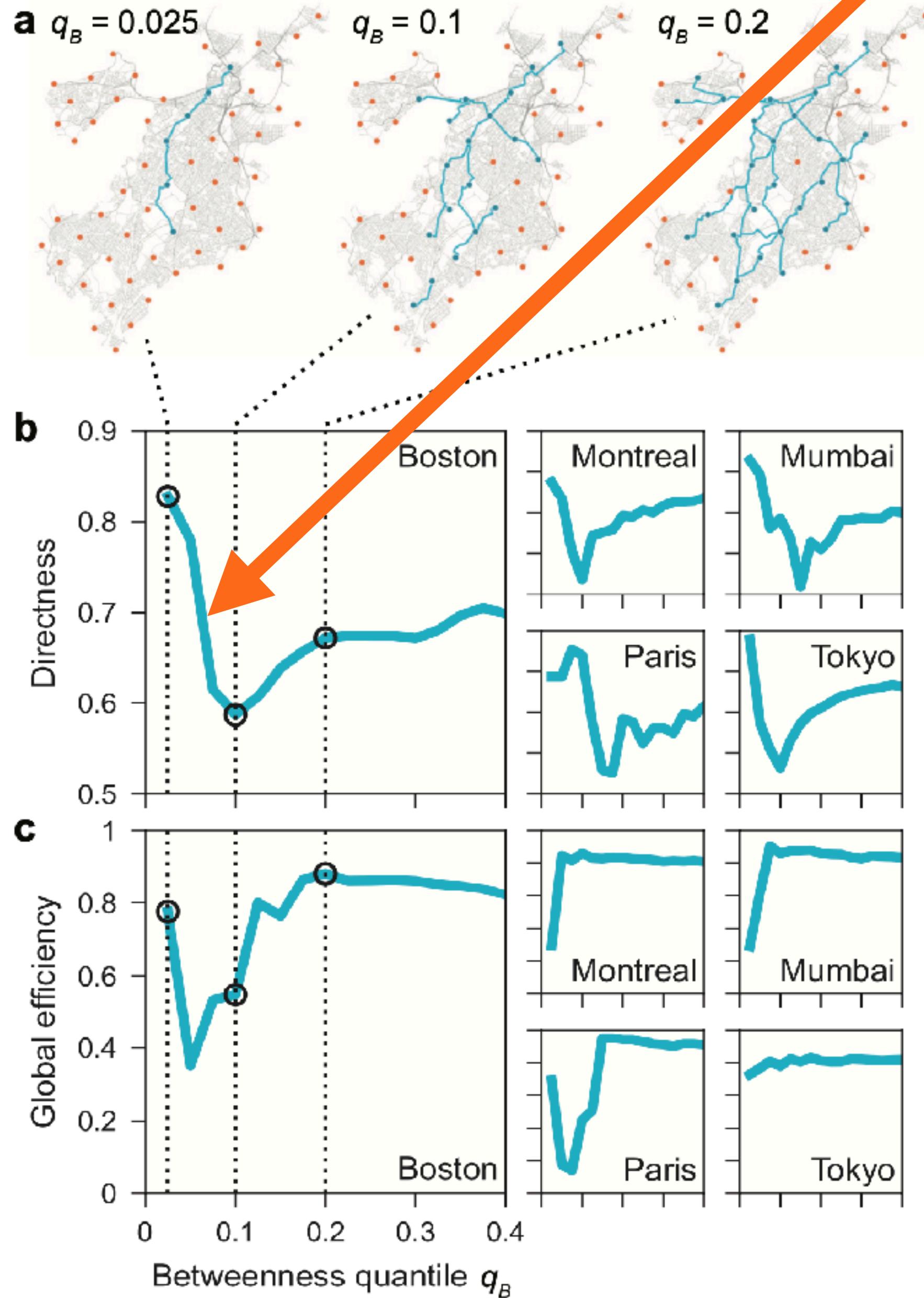
Random



We explore 62 cities, to be general & place-independent



# Result 1: First there is **decreasing** return of investment!



The pieces need  
to connect and  
to form cycles

# Policy implication 1: Invest persistently!



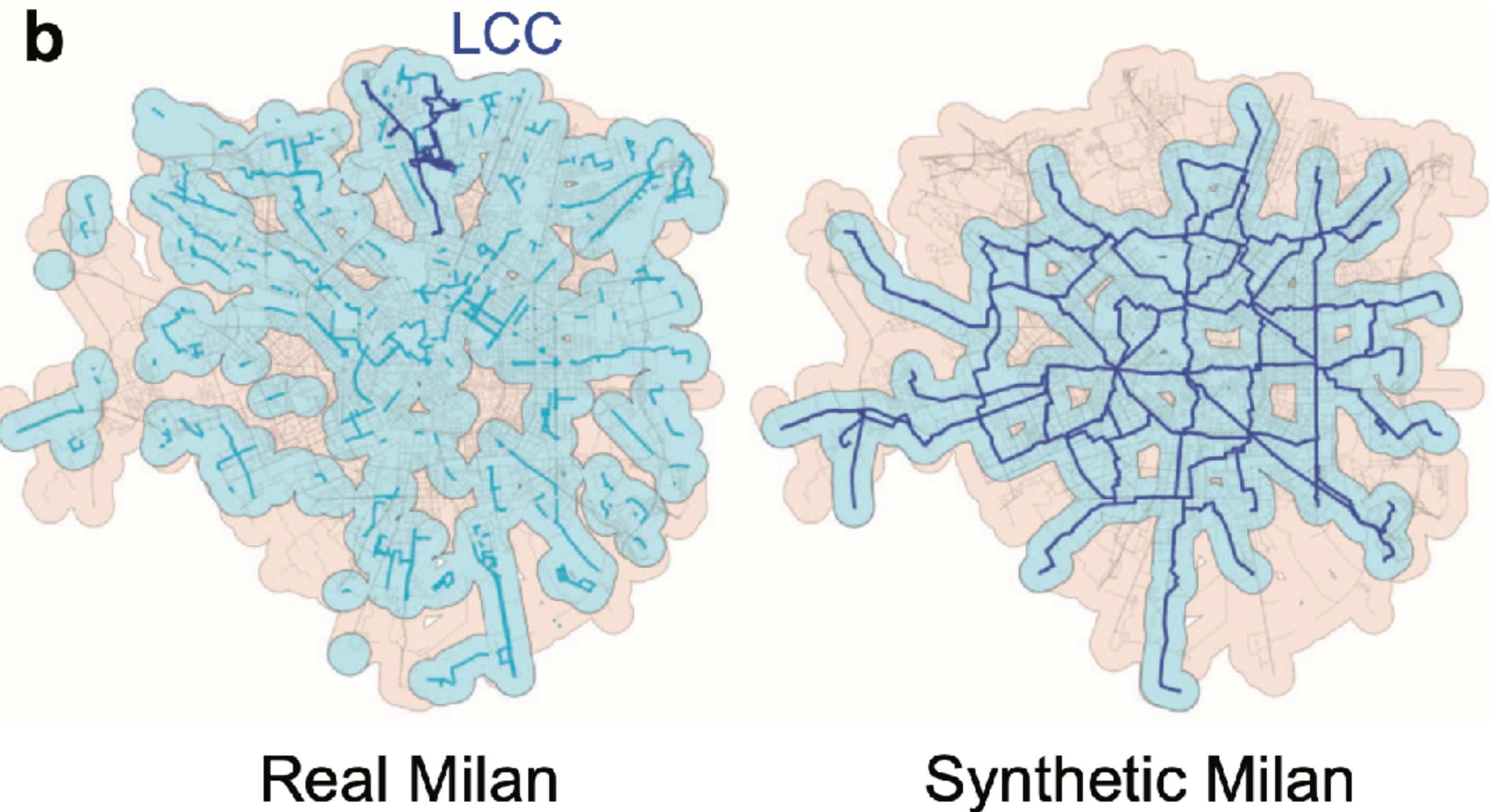
**Brent Toderian** @BrentToderian · Jul 30

...

My real advice for ambitious municipal elected leaders on building a safe, connected network of REAL (not painted lines or sharrows) bike infrastructure — direct your staff to do ALL of the work that you're currently planning to build over the next 5-10 years, ALL IN ONE YEAR.

Result 2: It's not a network's length that matters but how you grow it

At same length, we could  
do much better

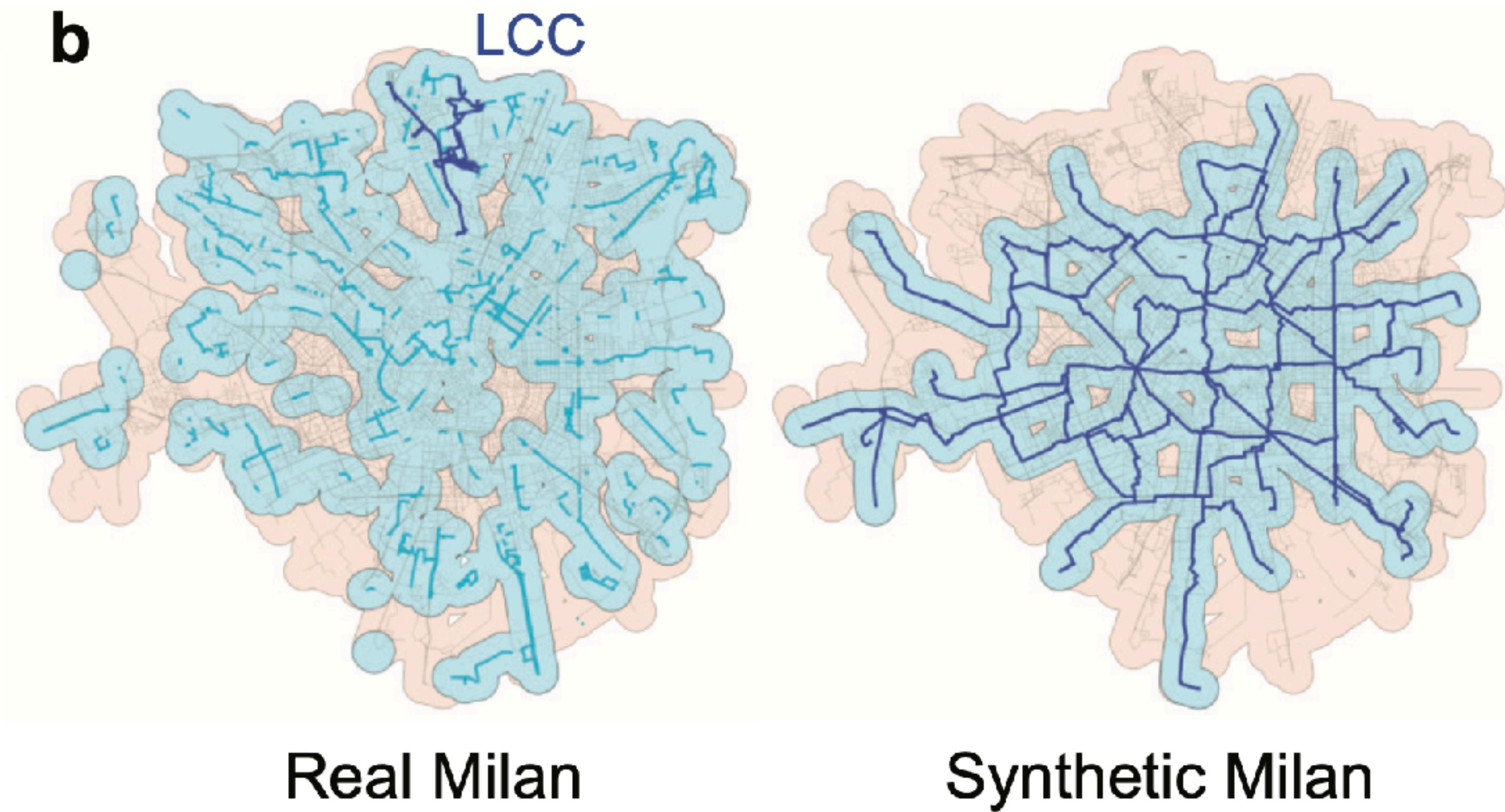


## Policy implication 2: Strategy matters - build for the whole city

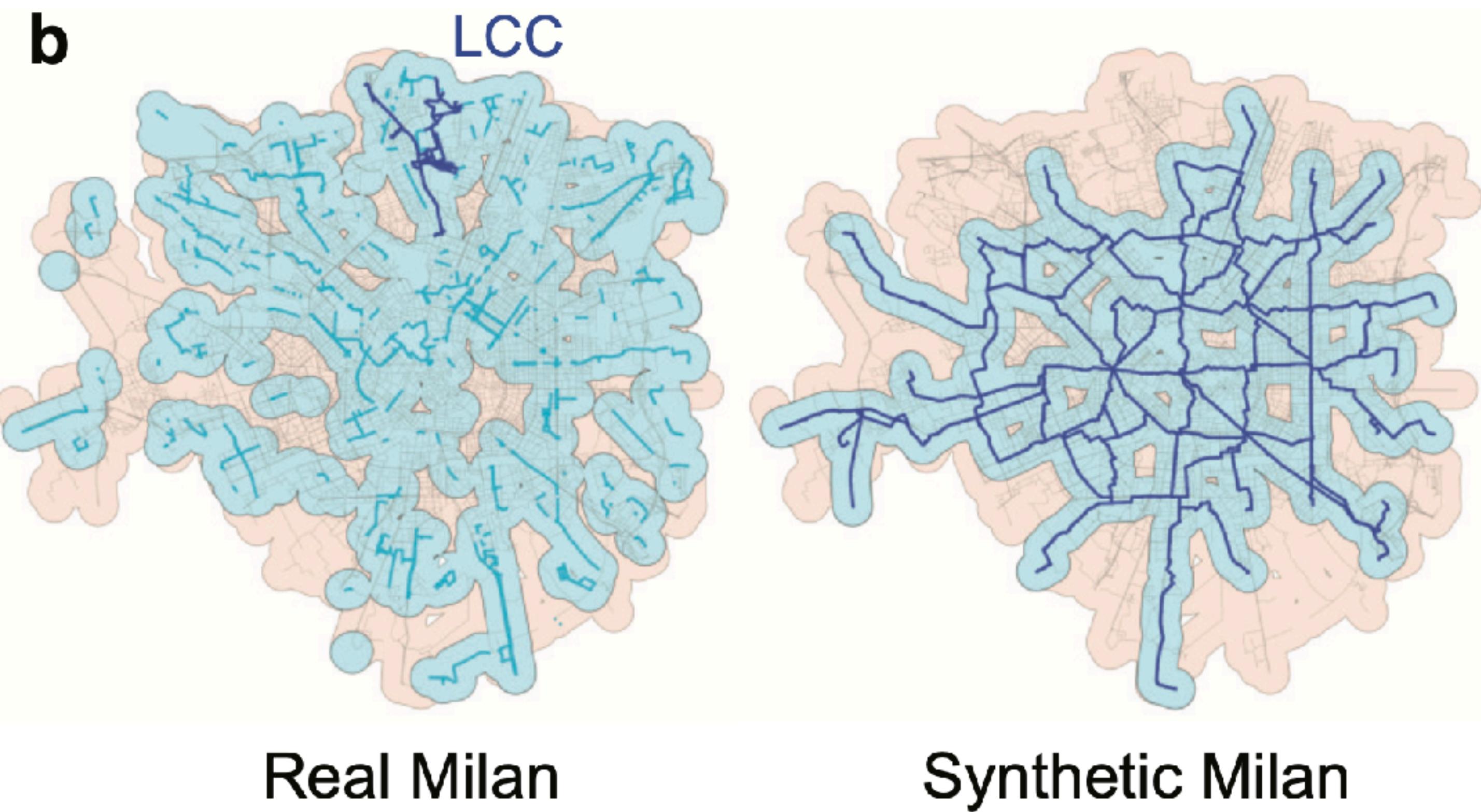
Avoid "random-like",  
piecewise growth



We've built many bike tracks  
but nobody is using them,  
so why build more?

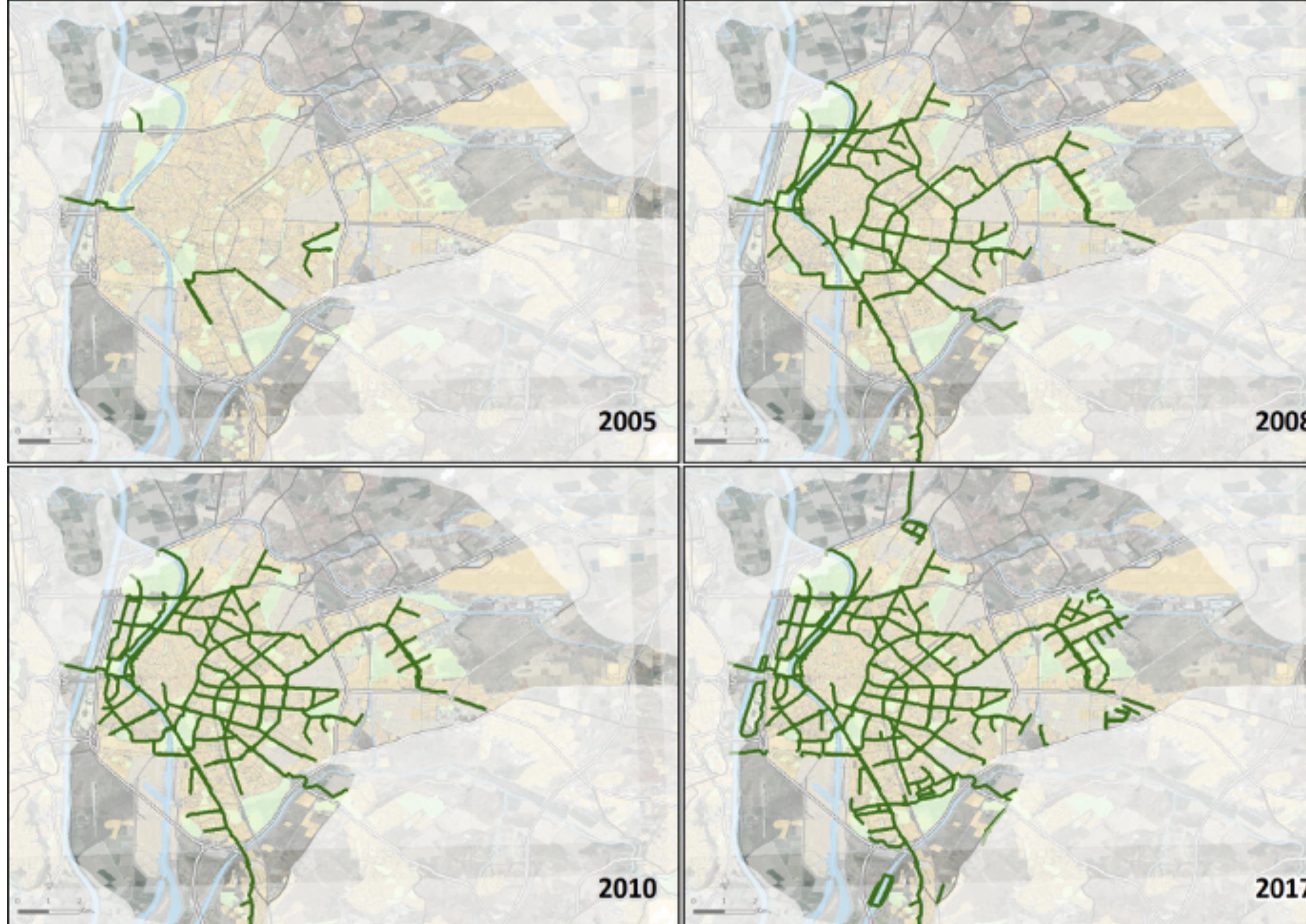


*Easier said than done - Isn't this unrealistic??*



*Easier said than done - Isn't this unrealistic??*

Nope: See Seville



Also: Paris, Oslo, ...

**There is  
no excuse**

# Our procedure generates a first cohesive network

Can be refined arbitrarily:

Population density

Road type

Inclination

Traffic / Stress

Routes

Green spaces

....

Open-sourced at:

<https://github.com/mszell/bikenwgrowth>



Explore your city at [GrowBike.Net](#)



Download the preprint

<https://arxiv.org/abs/2107.02185>



## Growing Urban Bicycle Networks

Michael Szell<sup>a,b</sup>, Sayat Mimar<sup>c</sup>, Tyler Perlman<sup>c</sup>, Gourab Ghoshal<sup>c</sup>, and Roberta Sinatra<sup>a,b</sup>

<sup>a</sup>*NEtworks, Data, and Society (NERDS), IT University of Copenhagen, 2300 Copenhagen, Denmark*

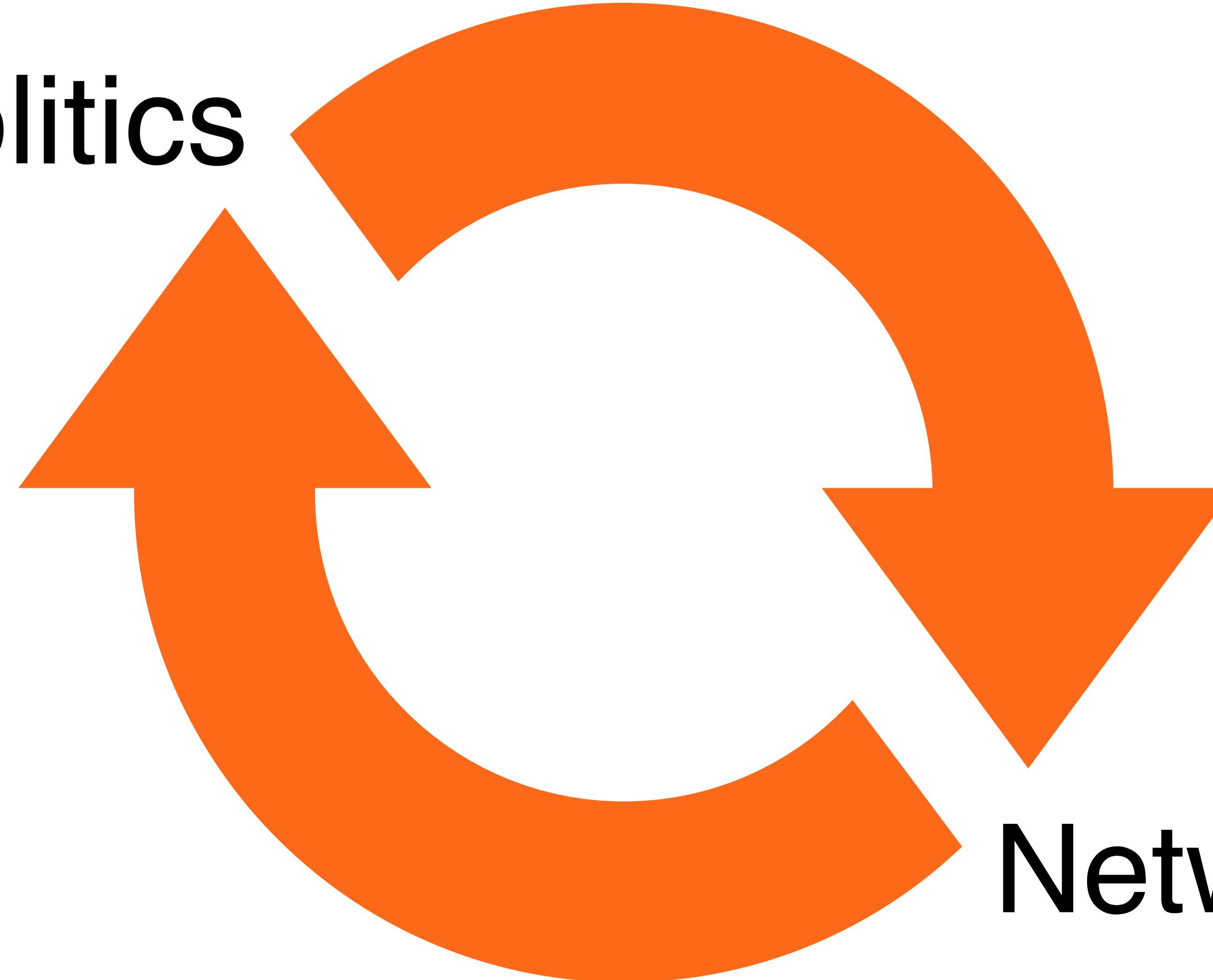
<sup>b</sup>*Complexity Science Hub Vienna, 1080 Vienna, Austria*

<sup>c</sup>*Department of Physics and Astronomy, University of Rochester, Rochester, NY 14627, USA*

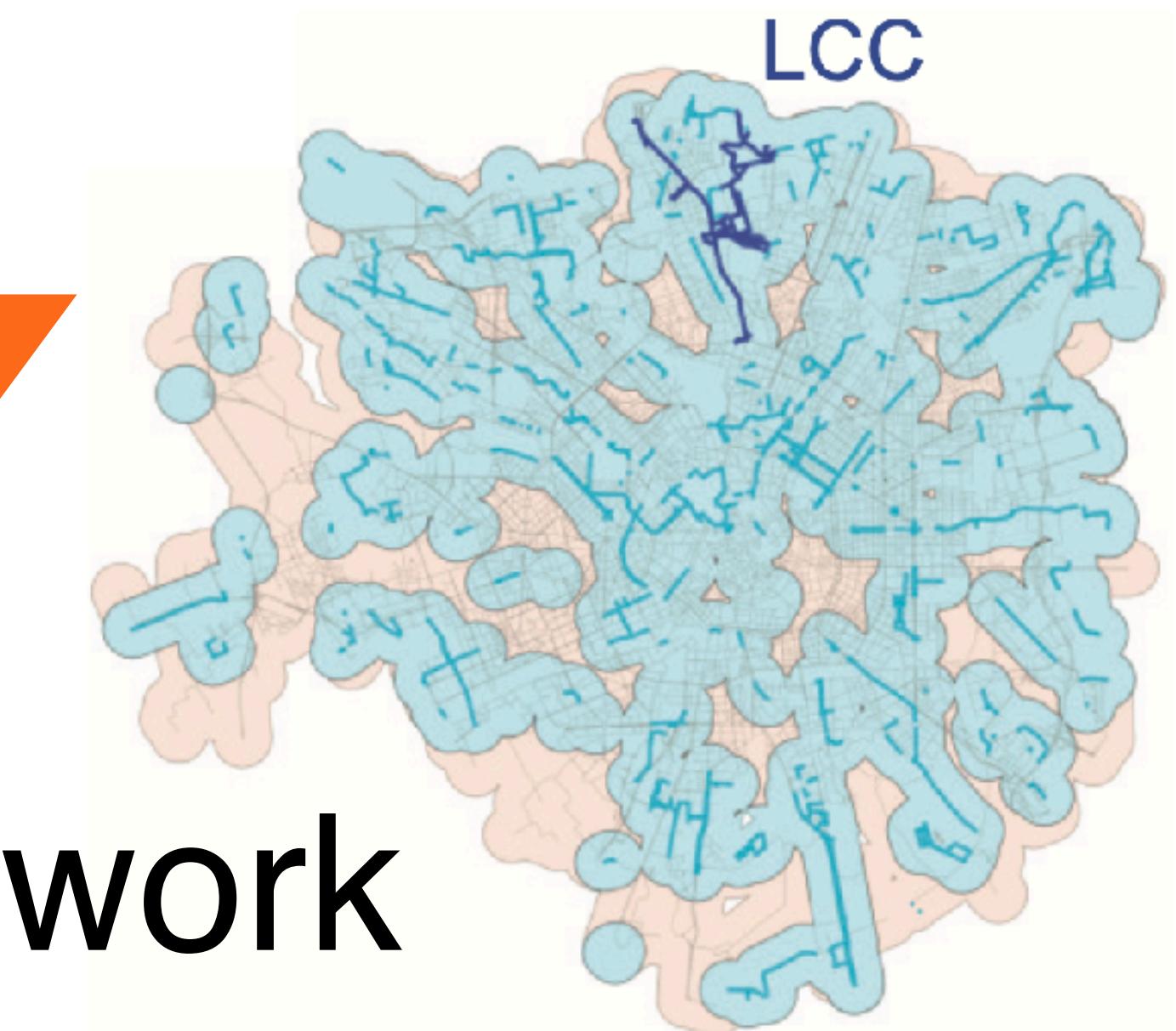
Bicycle network planning is about **both** politics and geometry



Politics



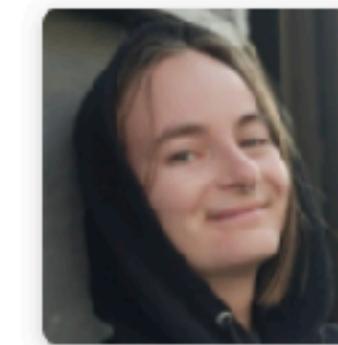
Network  
geometry



# Bicycle research at NERDS, ITU Copenhagen

NERDS = NEtwoRks, Data, and Society

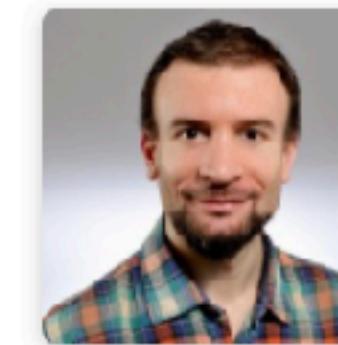
[nerds.itu.dk](http://nerds.itu.dk)



Anastassia Vybornova

**Network algorithms for the identification and classification of gaps in urban bicycle networks based on OSM data**

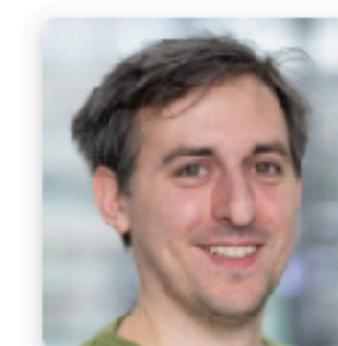
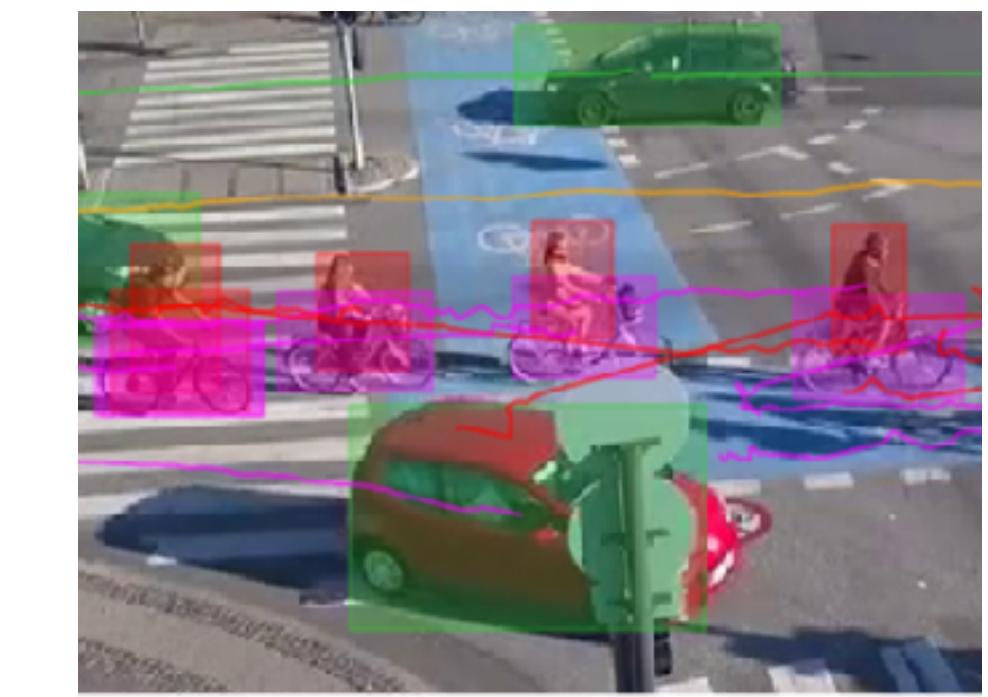
Oct 15, 10:40, Session 2.5: Bicycle network analysis



Bojan Kostic

**Analysing cyclist behavior at signalized intersections using computer vision**

Oct 14, 15:30, Session 2.4: Modelling bicycle traffic



Michael Szell

**The geometric limits of growing urban bicycle networks**

Oct 15, 11:00, Session 2.5: Bicycle network analysis

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[@mszll](https://twitter.com/mszll)  
misz@itu.dk



Ane Rahbek Vierø (currently at Aalborg University)

**Cyclists' access to everyday amenities**

Oct 15, 10:00, Session 2.5: Bicycle network analysis