

Accessibility Around the Last Mile: Concepts and Tools for Pedestrian-scale Modelling.

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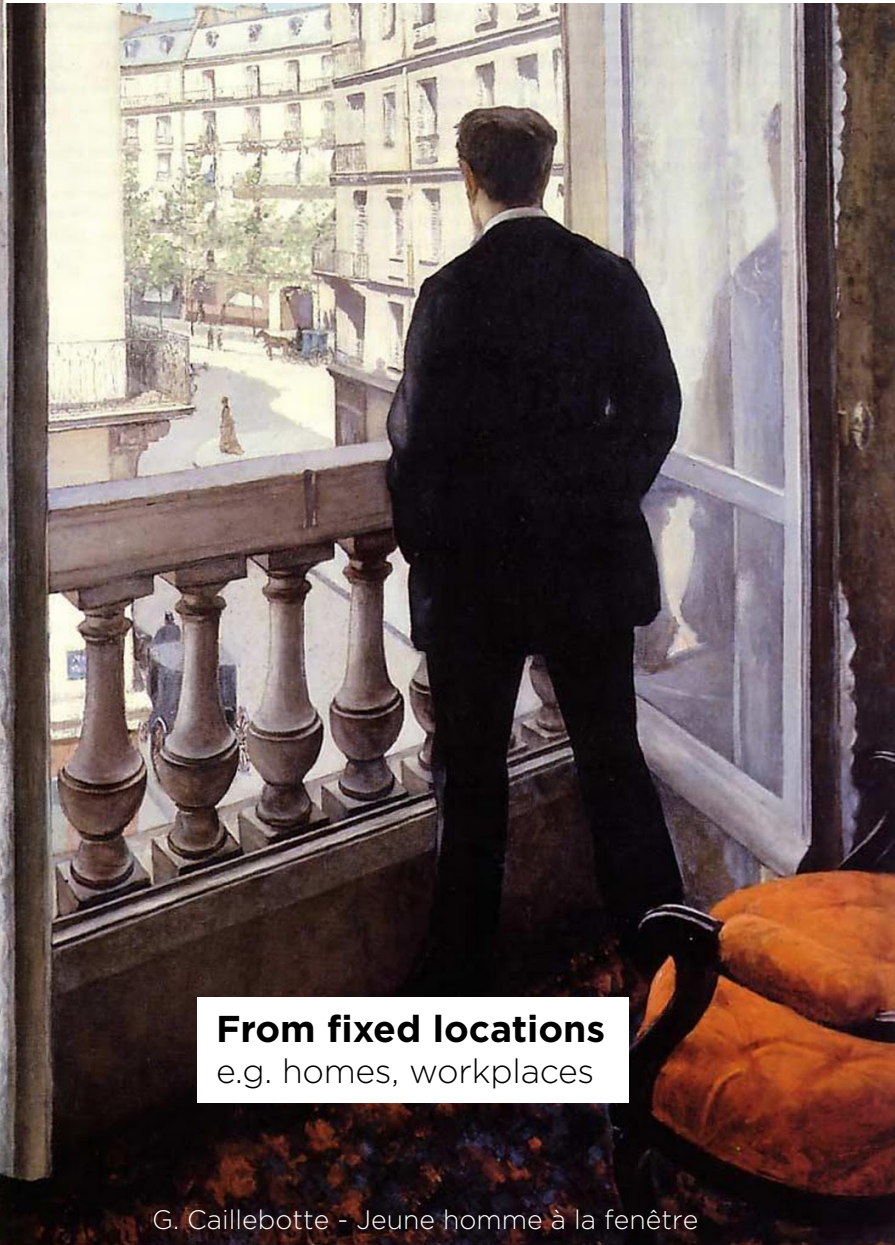
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City Form Lab

at the Harvard Graduate School of Design | cityform.gsd.harvard.edu

Two common ways of approaching destinations in the city



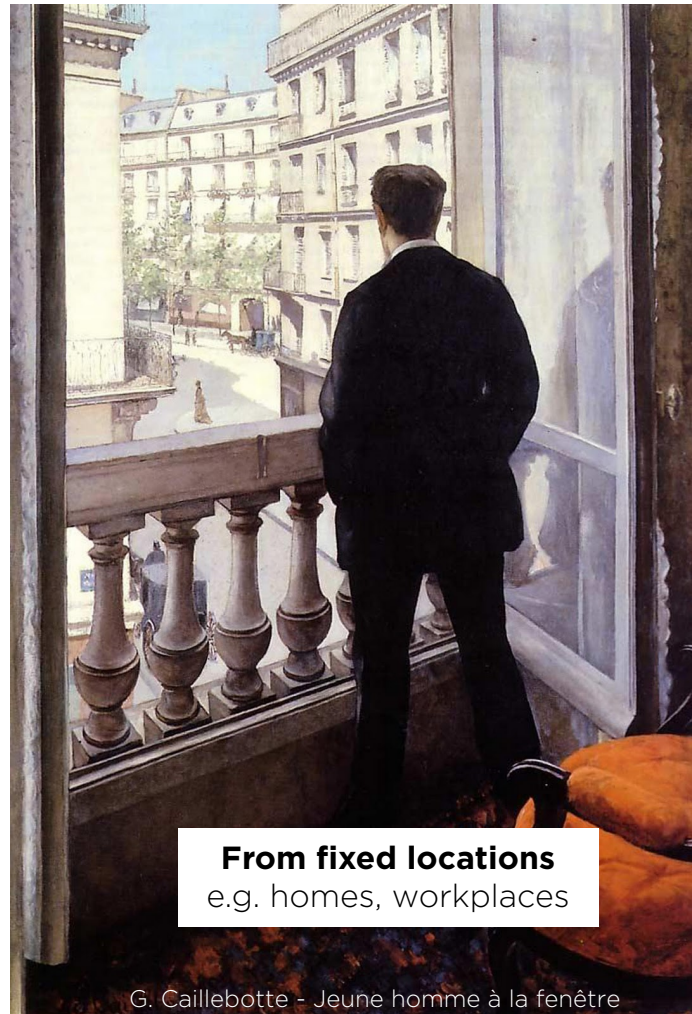
From fixed locations
e.g. homes, workplaces

G. Caillebotte - Jeune homme à la fenêtre



While moving around
e.g. on the way to transit

1. Fixed Origin Spatial Accessibility Metrics

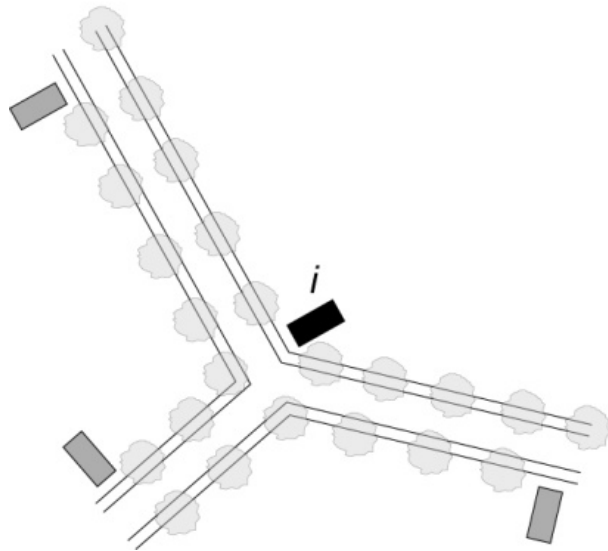


Reach accessibility index

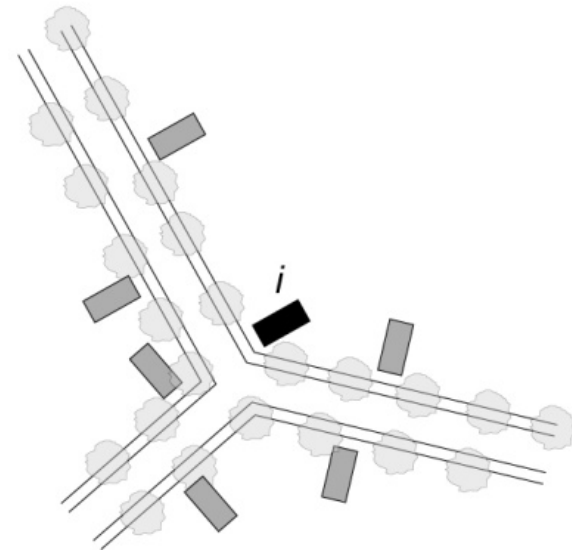
How many surrounding destinations j can be reached from building i within a given network radius?

$$Reach[i]^r = \sum_{j \in G - \{i\}, d[i,j] \leq r} W[j]$$

LESS REACH



MORE REACH



The map shows buildings that lie within a 10-minute (600m) walkshed from Darwin's café (shaded dark). On Brattle St.



Accessibility can be specified to any type of destination

Transit



Businesses



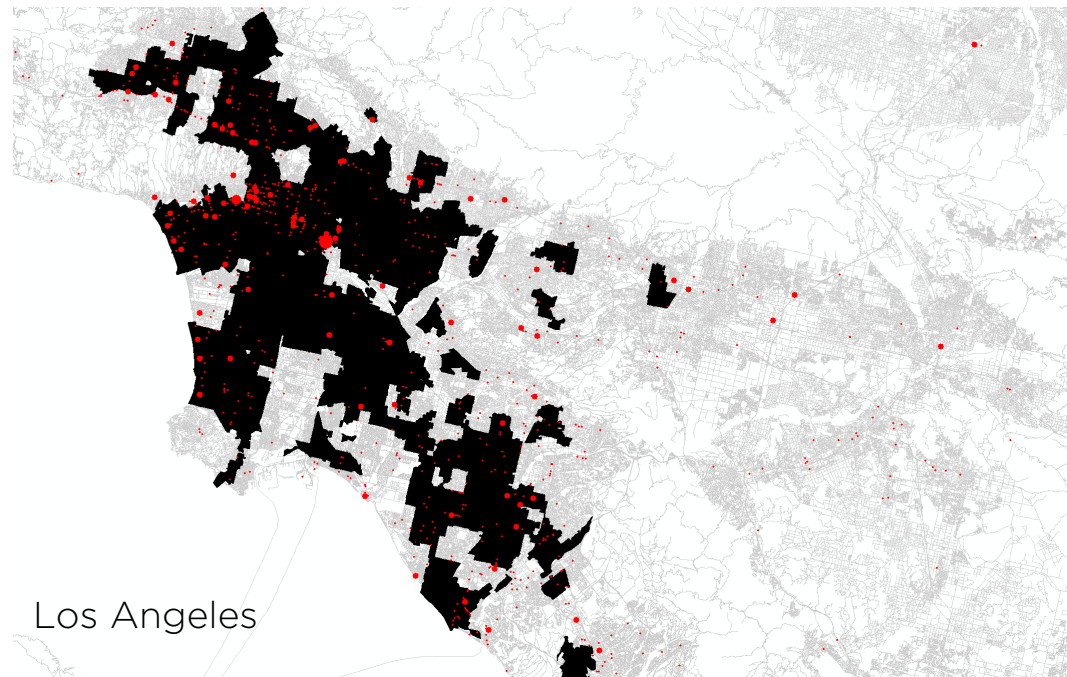
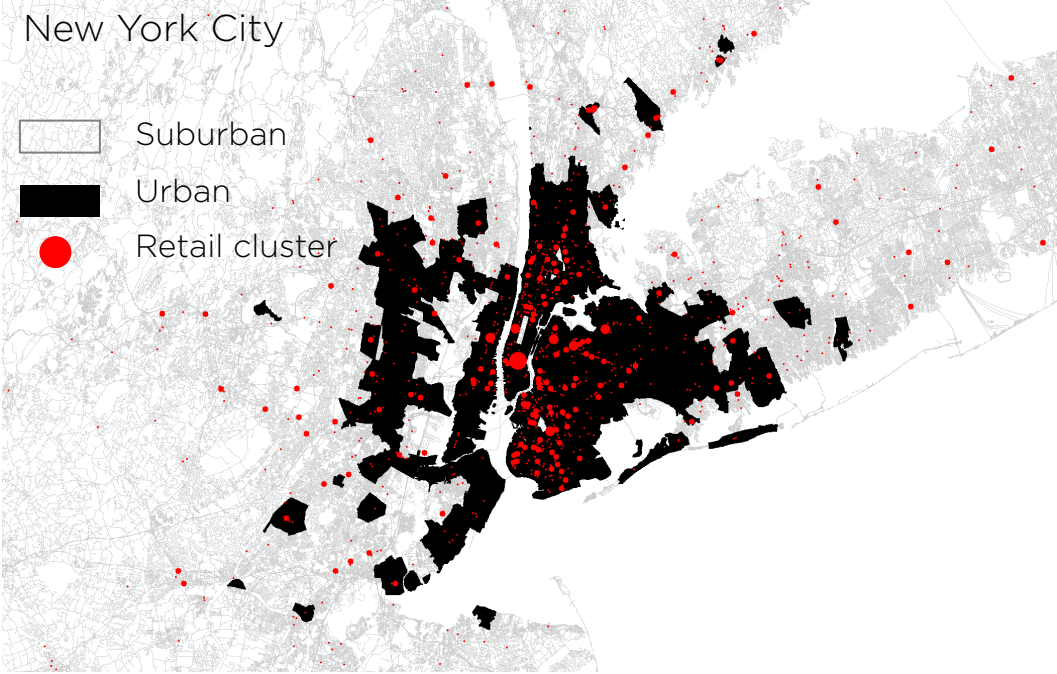
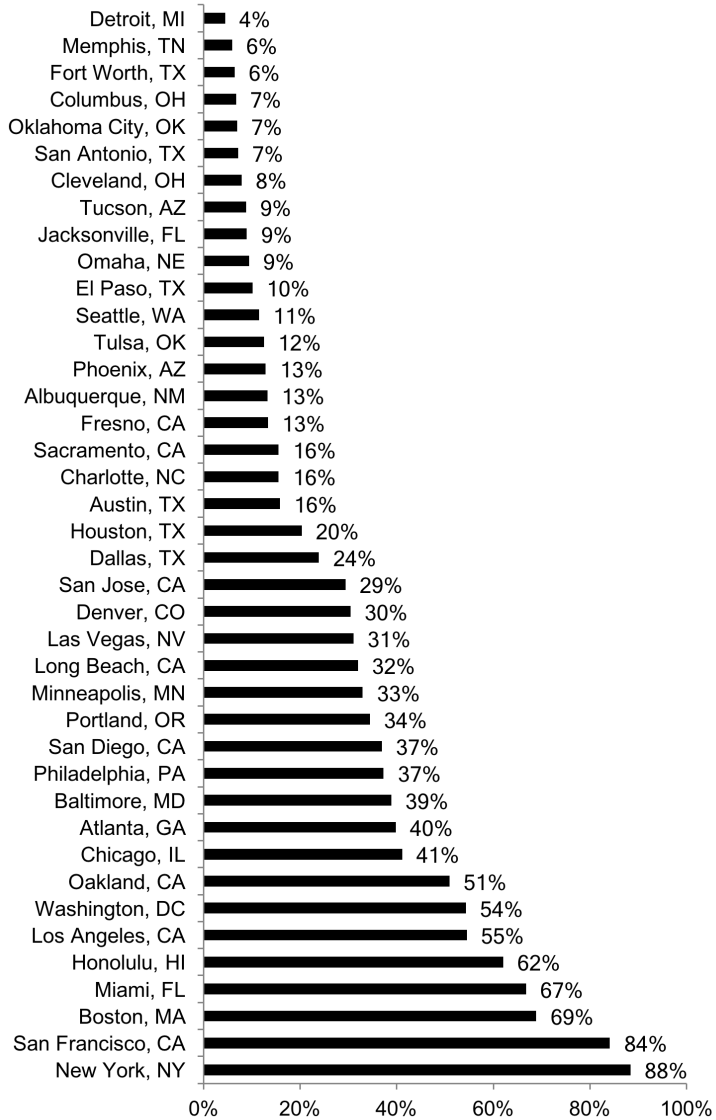
Jobs



Residents



% population within 1KM of a retail cluster of >25 stores walking distance



Towards Amenity Oriented Development (AOD)

Comparison of urban form and population density metrics across cities that provide a high (top) and a low (bottom) share of populations with walking access to retail clusters.

		Population within 1000m of a retail cluster	Population 2010	Land Area (km ²)	Residential Density	FAR	Built Coverage	
Highest	1	New York City, NY	88%	8,175,133	783.0	10,890 km ²	1.66	35.38%
	2	San Francisco, CA	84%	805,235	121.5	7,174 km ²	0.43	27.42%
	3	Boston, MA	69%	617,594	125.4	2,700 km ²	0.71	16.14%
	4	Miami, FL	67%	399,457	93.2	4,866 km ²	-	-
	5	Honolulu, HI	62%	337,256	156.7	2,236 km ²	1.50	14.16%
	6	Los Angeles, CA	55%	3,792,621	1,214.0	3,275 km ²	1.40	18.67%
	7	Washington, DC	54%	681,170	158.1	4,308 km ²	0.83	16.47%
	8	Oakland, CA	51%	390,724	144.8	2,901 km ²	0.69	17.04%
	9	Chicago, IL	41%	2,695,598	589.6	4,572 km ²	-	14.15%
	10	Atlanta, GA	40%	417,735	344.9	1211.17 km ²	-	-
Mean		61%	1,831,252	373.1	4,413.4 km²	1.03	19.93%	
Lowest	31	Omaha, NE	9%	383,964	329.2	1166.35 km ²	-	-
	32	Jacksonville, FL	9%	822,050	1,934.7	425 km ²	0.05	1.23%
	33	Tucson, AZ	9%	520,116	611.7	868 km ²	0.21	6.52%
	34	Cleveland, OH	8%	396,815	201.2	1,972 km ²	-	-
	35	San Antonio, TX	7%	1,469,845	1,193.7	1,147 km ²	-	-
	36	Oklahoma City, OK	7%	579,999	1,556.9	360 km ²	-	-
	37	Columbus, OH	7%	787,033	562.5	1,399 km ²	-	-
	38	Fort Worth, TX	6%	854,113	886.3	842 km ²	-	-
	39	Memphis, TN	6%	646,889	816.0	770 km ²	0.26	6.42%
	40	Detroit, MI	4%	713,777	359.4	1,900 km ²	0.25	14.78%
Mean		7%	717,460	845.2	1,084.9 km²	0.19	7.24%	

Key user inputs for Reach accessibility:

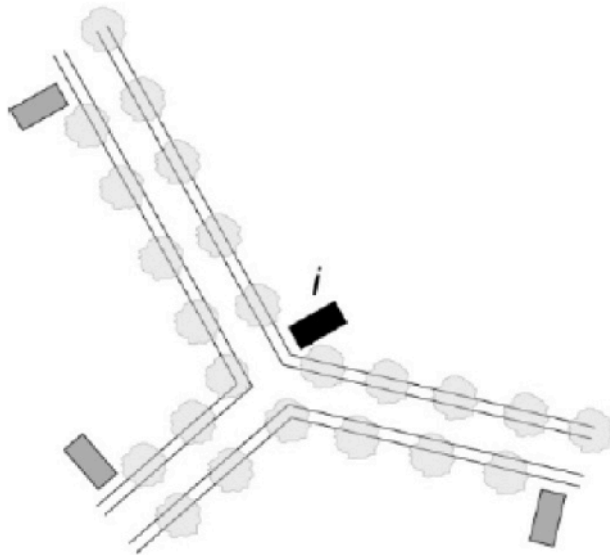
1. Origin points
2. Destination points
3. Optionally weights for destinations (e.g. jobs field for census tracts)
4. Search radius (along the network, e.g. 400m)

Gravity Index

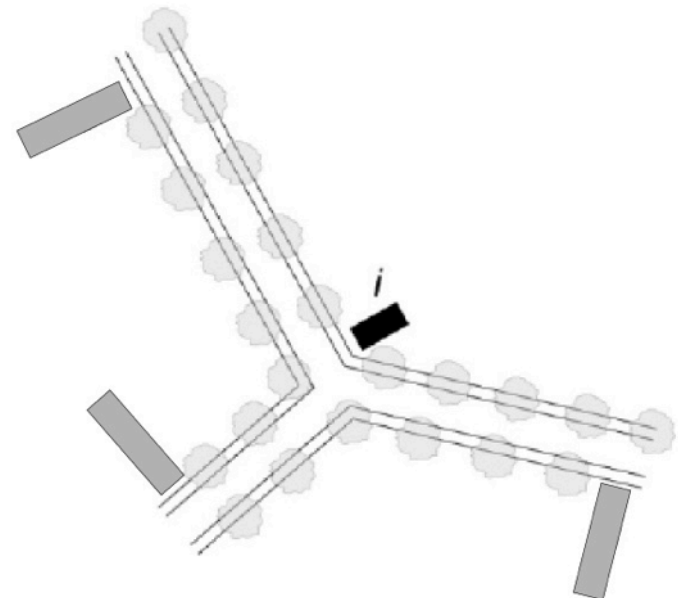
Accessibility is proportional to the attractiveness & inversely proportional to the distance of reaching surrounding destinations j (Hansen 1959)

$$Gravity[i]^r = \sum_{j \in G - \{i\}, d[i,j] \leq r} \frac{W[j]^\alpha}{e^{\beta \cdot d[i,j]}}$$

LESS GRAVITY

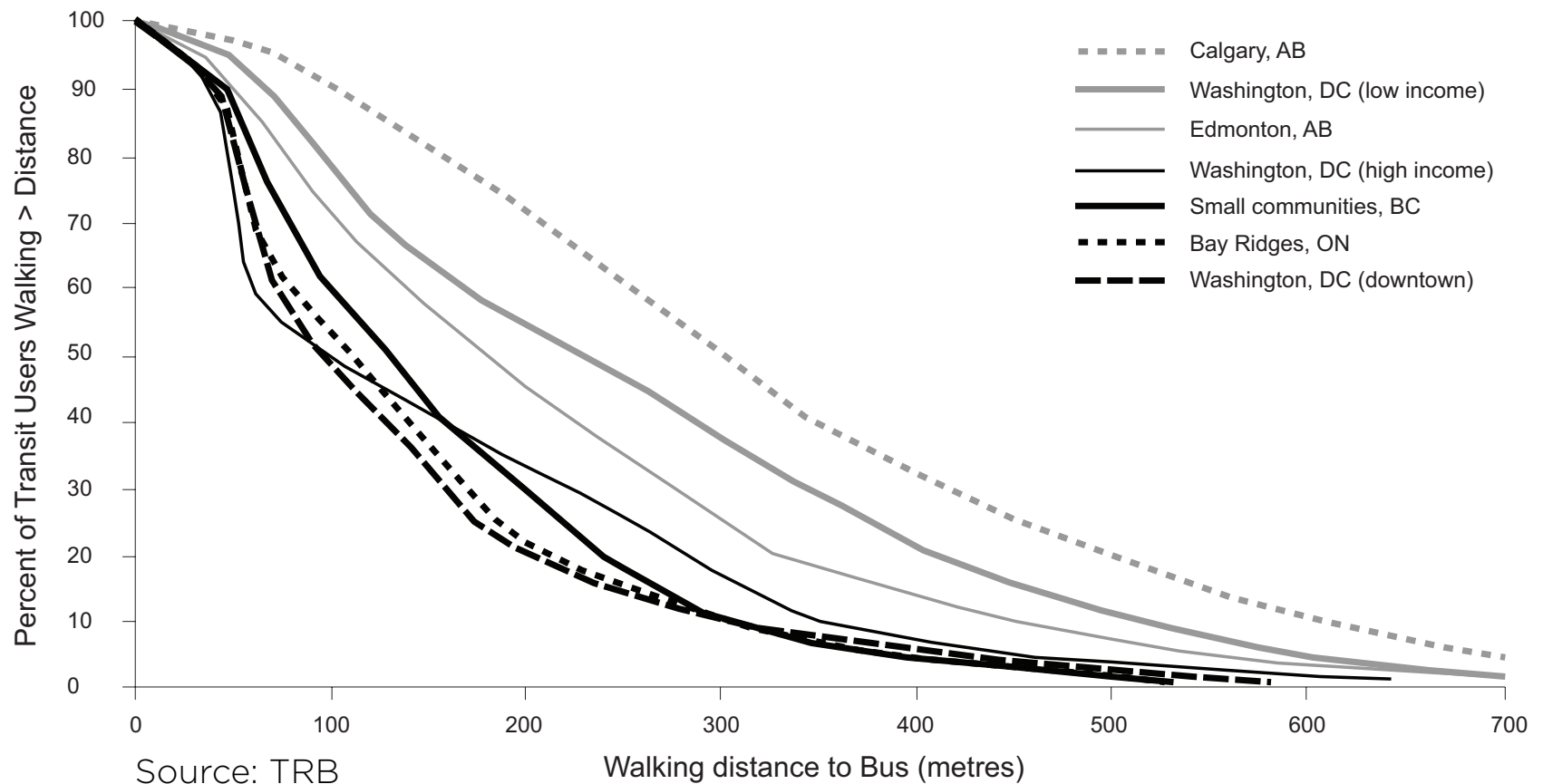


MORE GRAVITY



Walking distance to bus stops in different cities

% transit users



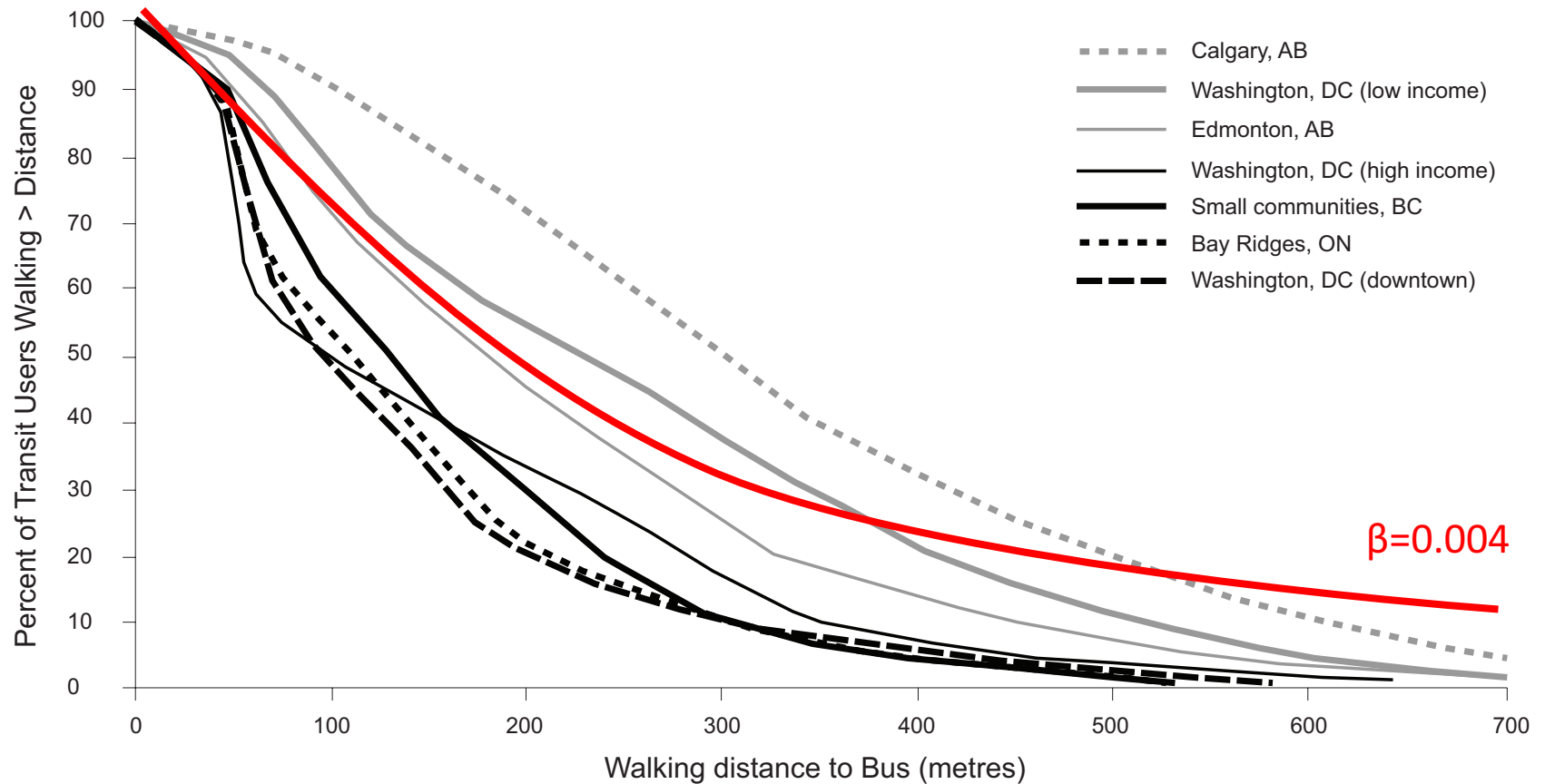
Walking distance to bus stops in different cities

% transit users

$$Gravity_{ij} = \sum_{j=1}^n \frac{1}{e^{\beta \cdot dist[i,j]}}$$

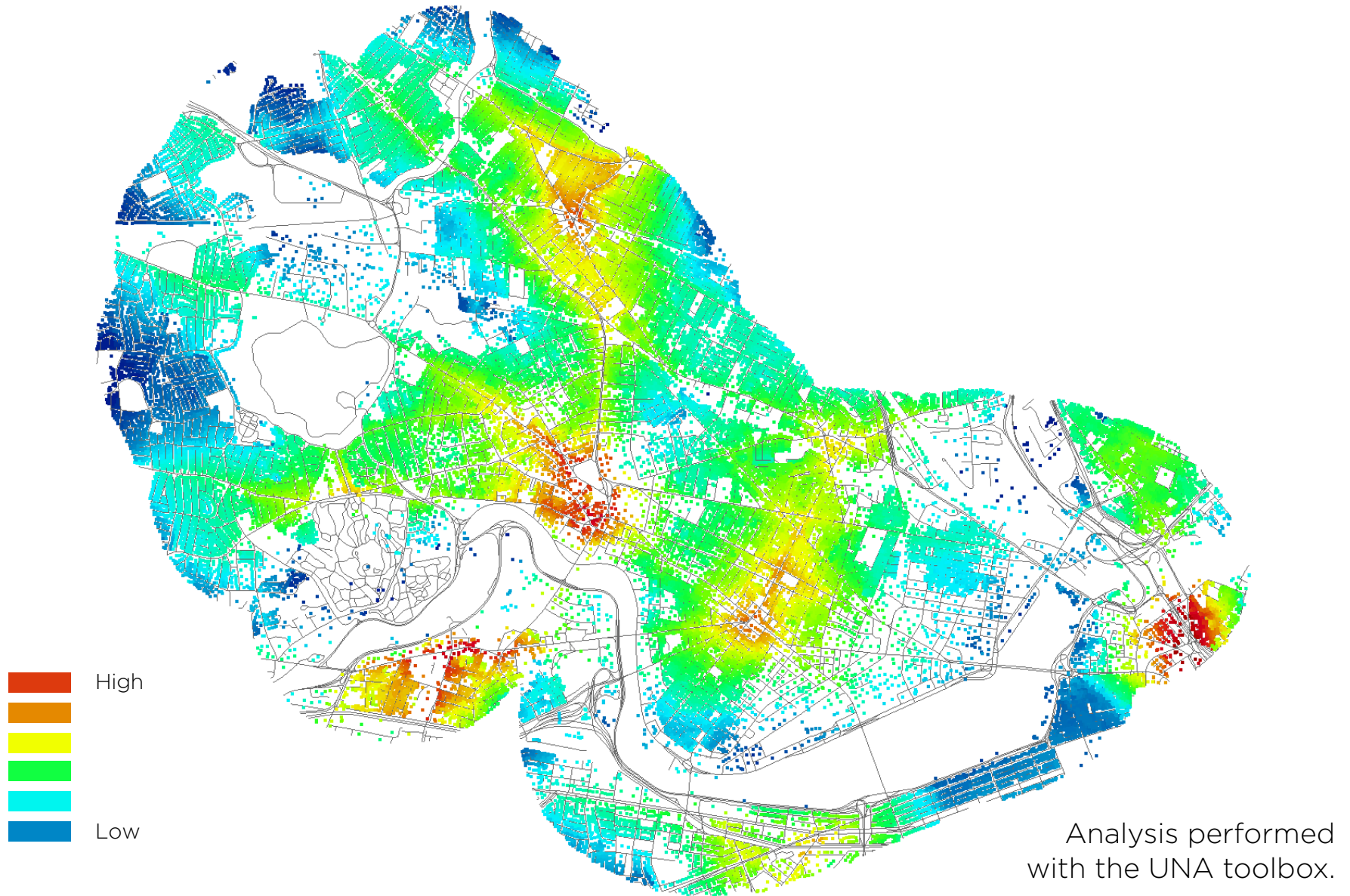
NB! Beta depends on distance units (e.g. meters, feet)

$$\beta = 0.004$$



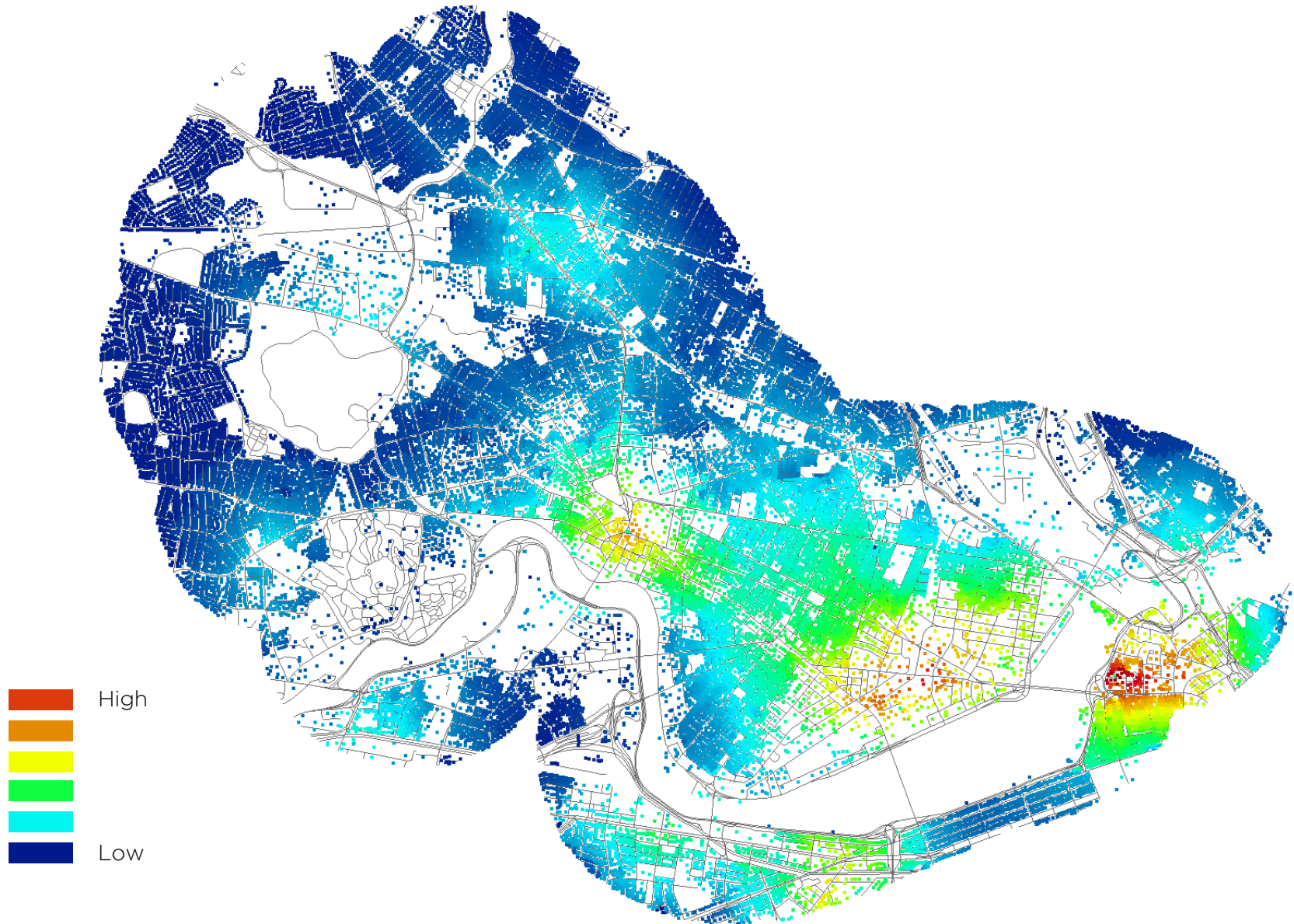
Gravity access from buildings to public transit in Cambridge, MA

T-stops and bus stops (T = 5x bus). Search radius= 1,000m; beta= 0.002



Gravity access from buildings to jobs in Cambridge, MA

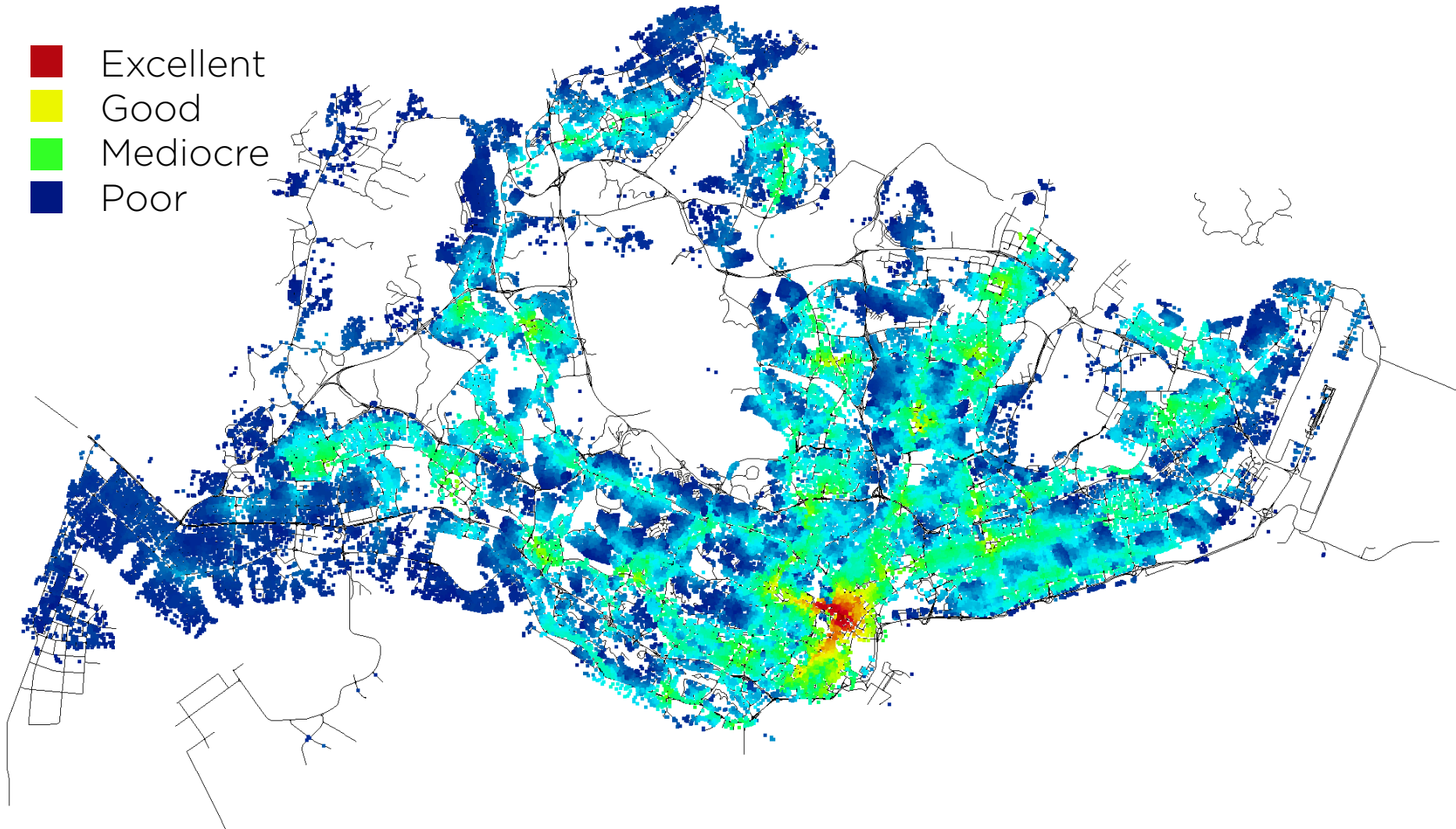
Search radius= 1,000m; beta= 0.002



Example: Public transit accessibility in SG from each building

Gravity access

- Excellent
- Good
- Mediocre
- Poor



Key user inputs for Gravity accessibility:

1. Origin points
2. Destination points
3. Optionally weights for destination points (e.g. jobs field for census tracts)
4. Search radius (along the network, e.g. 400m)
5. Beta value for the decay effect*

i.e. use the following beta values if drawing units are:

“meters” 0.002

“feet” 0.000663

“kilometers” 2.175

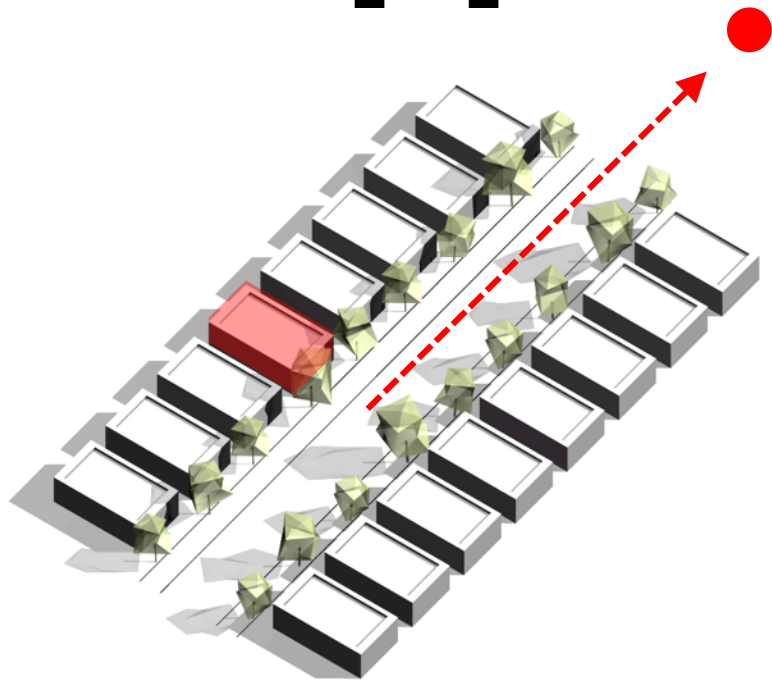
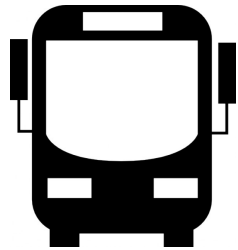
“miles” 3.501.

How can accessibility be improved?

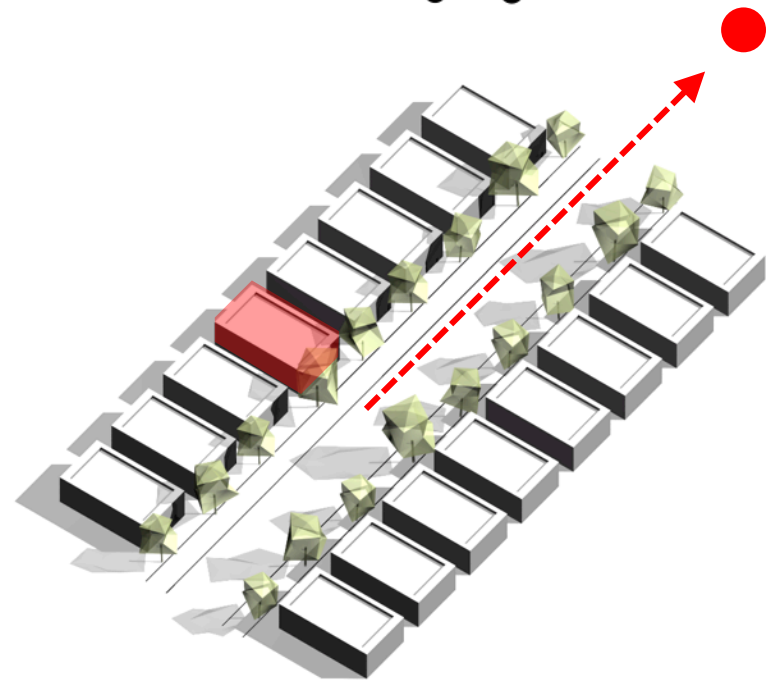
a. Facilitate transportation to destinations

All else being constant

Less impedance
+ accessibility



More impedance
- accessibility

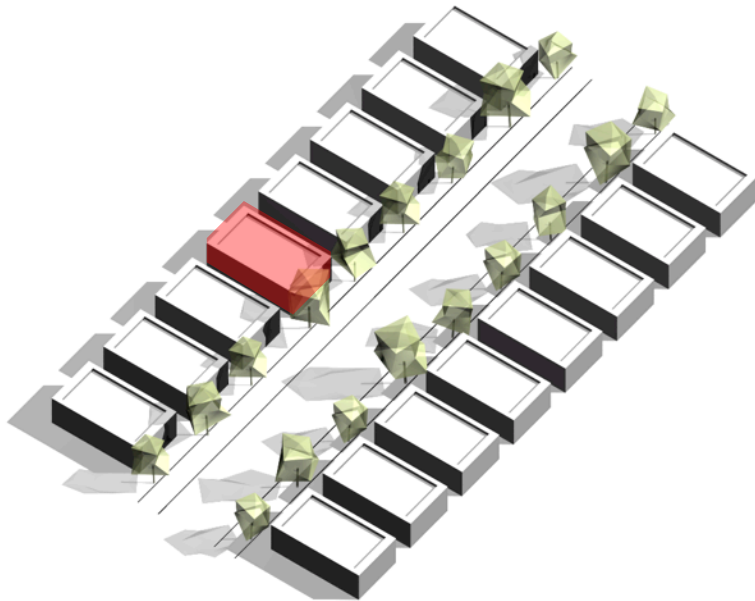


How can accessibility be improved?

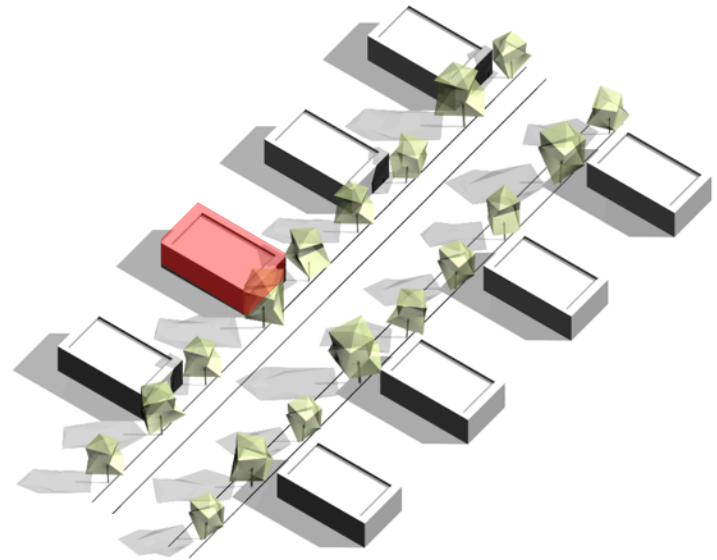
Increase the density of destinations around a location

All else being constant

Denser destinations
+ accessibility



Sparser destinations
- accessibility

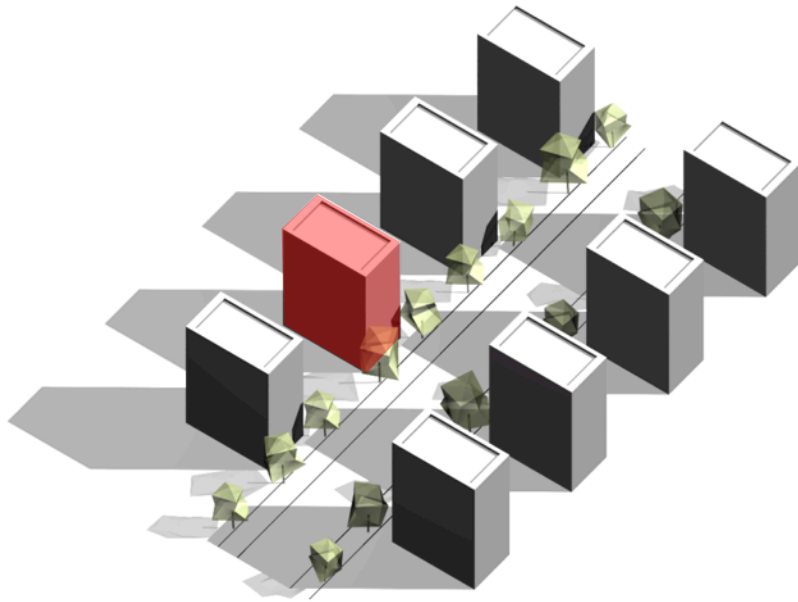


How can accessibility be improved?

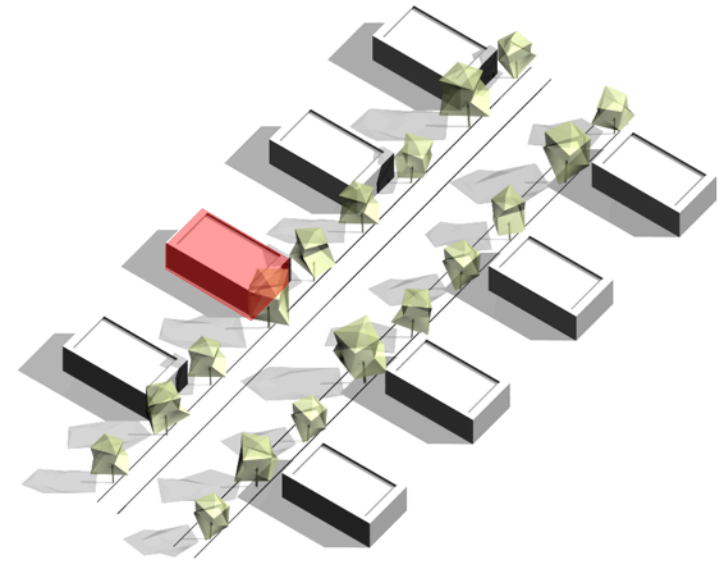
Increase capacity (or attractiveness) of destinations

All else being constant

Bigger destinations
+ accessibility



Smaller destinations
- accessibility

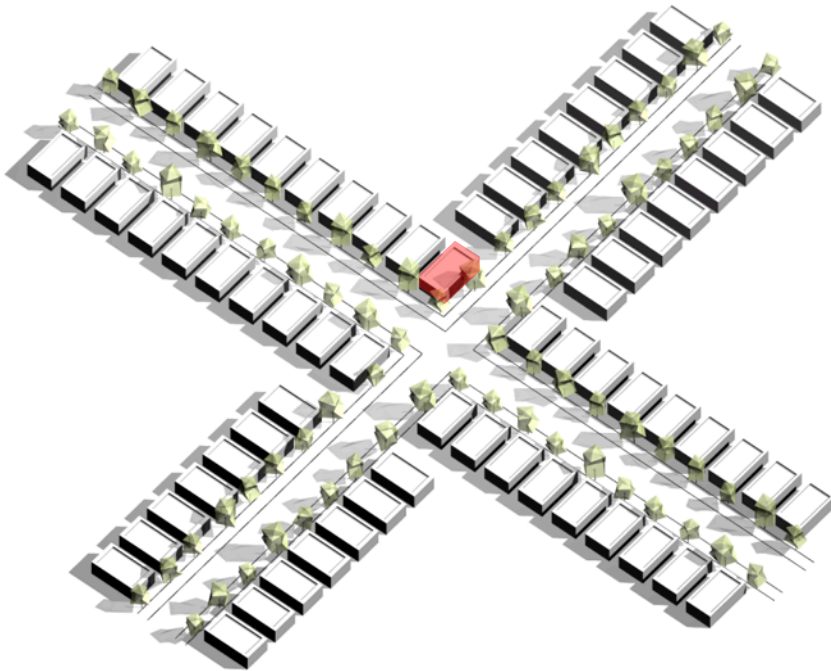


How can accessibility be improved?

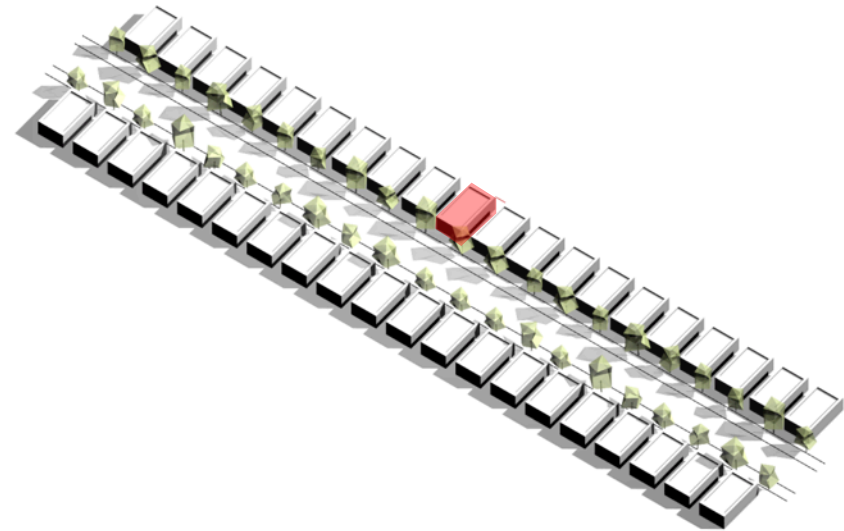
Improve spatial connectivity to destinations

All else being constant

More connectivity
+ accessibility



Less connectivity
- accessibility

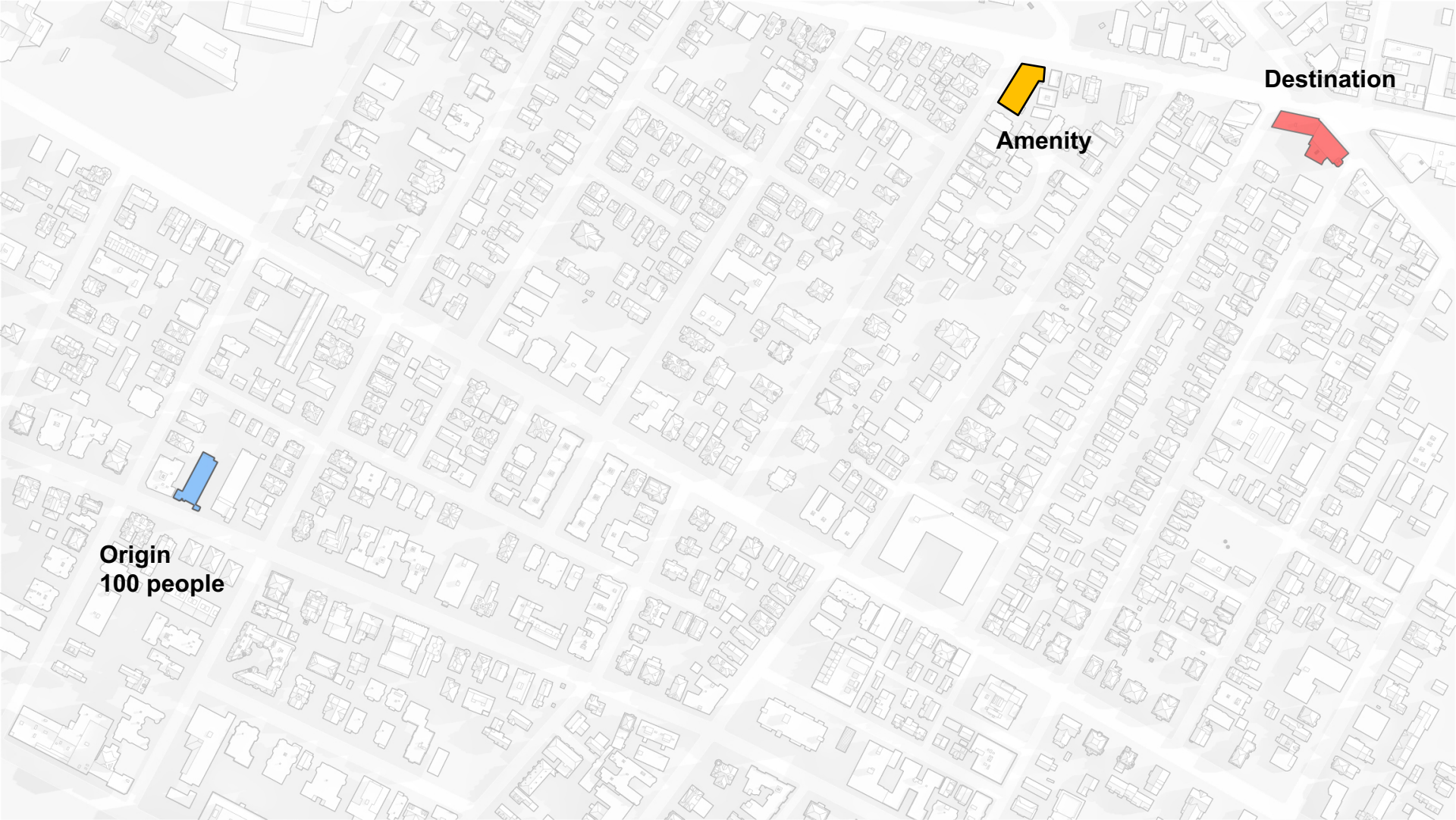


2. Mobile Origin Spatial Accessibility Estimation



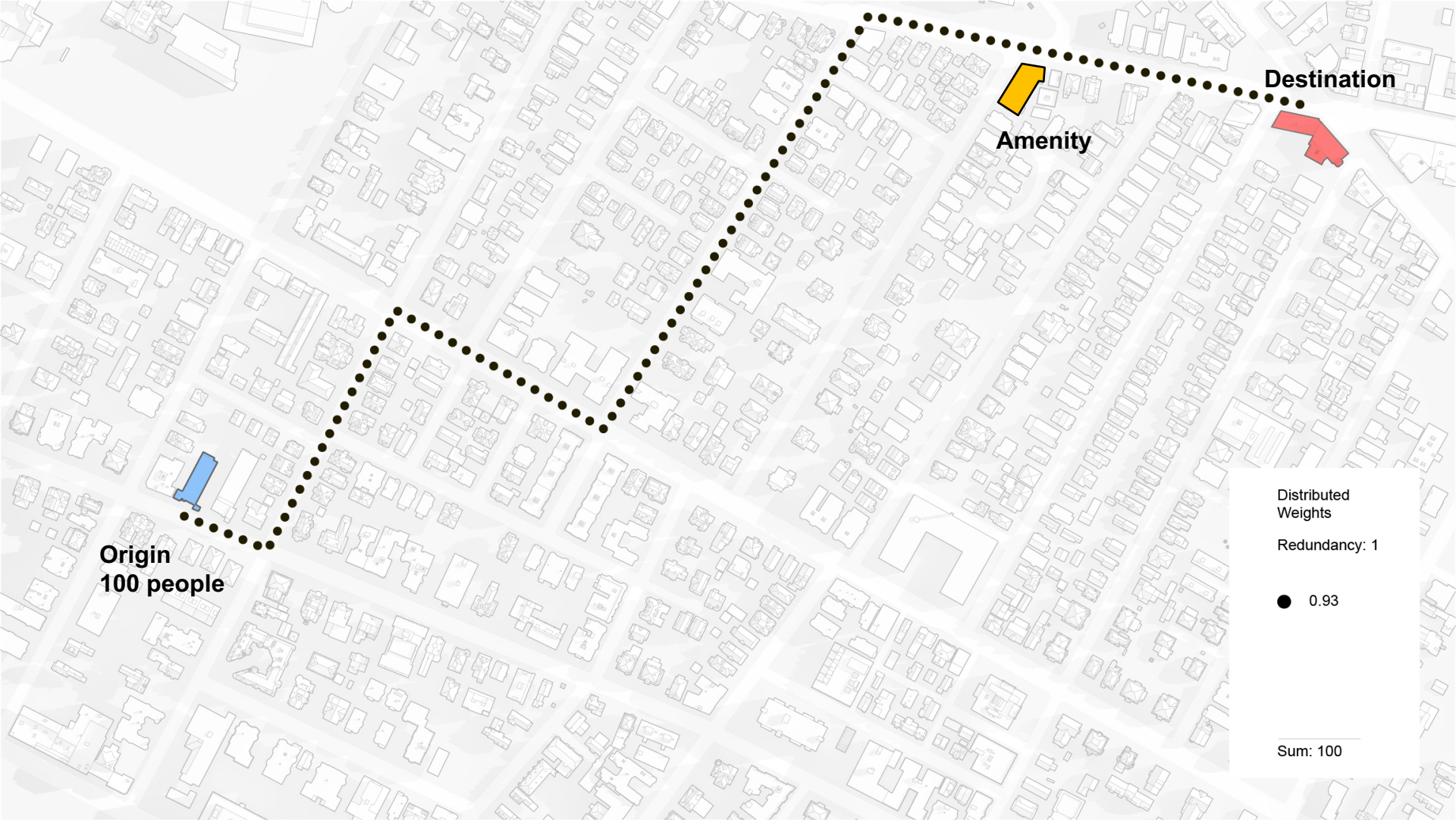
Distribute Origin Weights

Spatial origins and Destinations



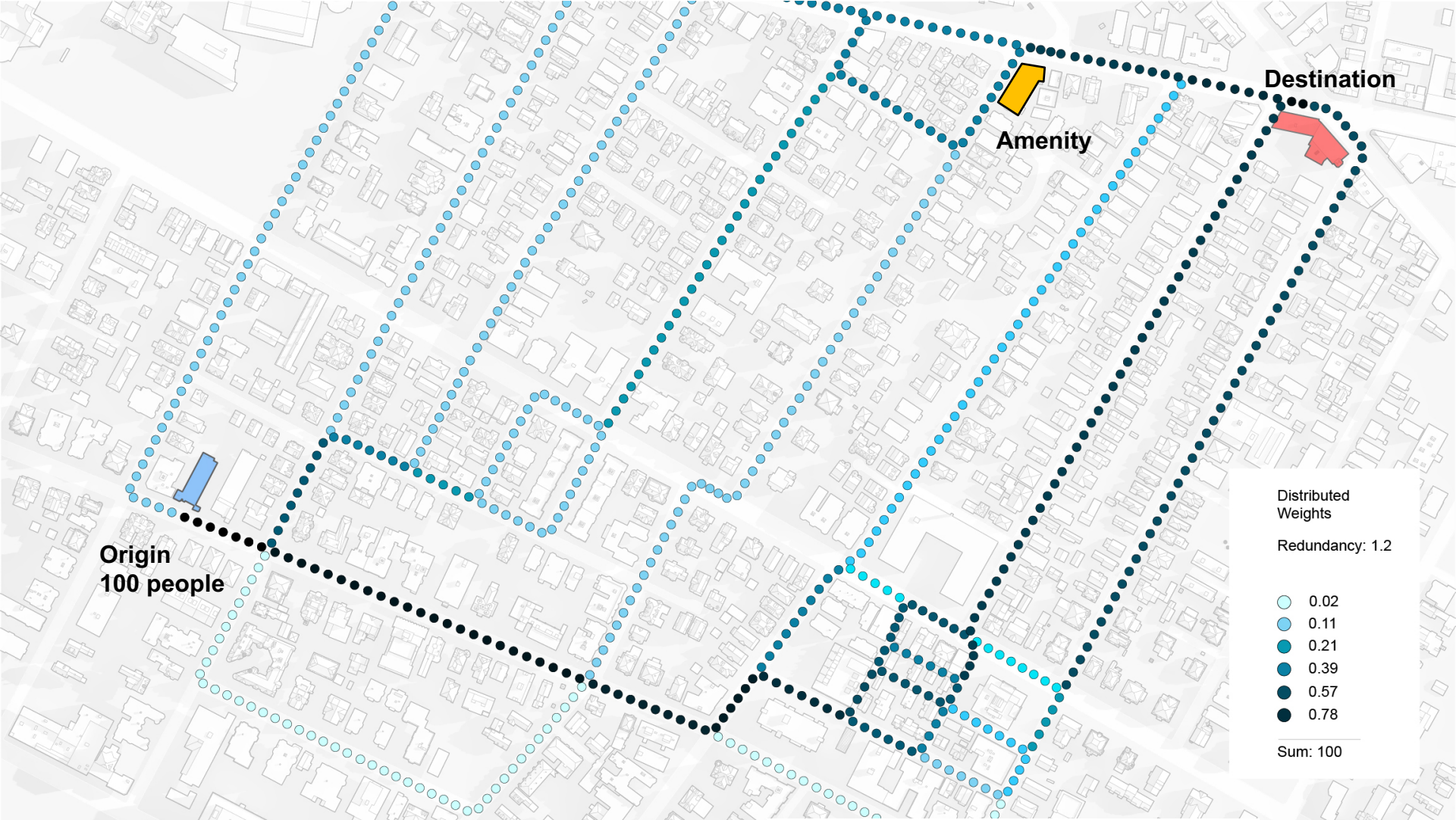
Shortest route

Spacing synthetic points along the shortest route between the O and D at 10m intervals. Overall origin weight remains the same.



All plausible routes

Up to 20% longer than shortest route



Key user inputs for Distributing Weights :

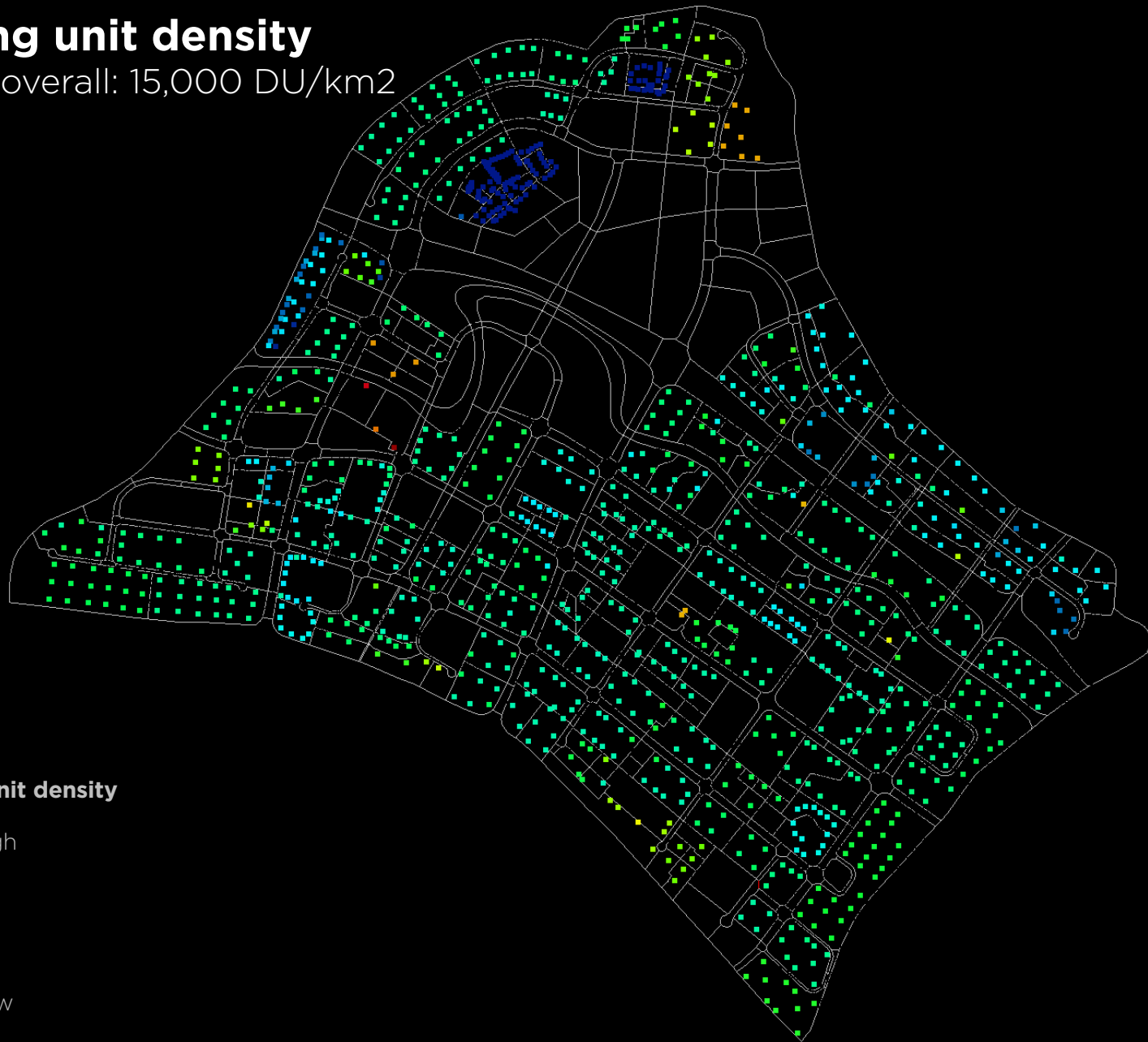
1. Origin points.
2. Destination points.
3. Optionally **weights for origin points** (e.g. people in buildings).
4. Observer points, that can count passersby but do not send out or receive any trips themselves.
5. Nearest, All, Search radius (determines which destinations are used).

Example 1: Planning Commercial Centers in Singapore

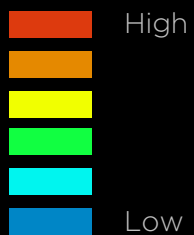
Sevtsuk, A., Kalvo, R. (2017). Patronage of urban commercial clusters: a network-based extension of the Huff model for balancing location and size. *Environment and Planning B: Urban Analytics and City Science*. Issue 0(0). pp. 1-21. [PDF](#)

Dwelling unit density

Punggol overall: 15,000 DU/km²



Dwelling unit density



MRT, LRT and bus stop locations

Punggol

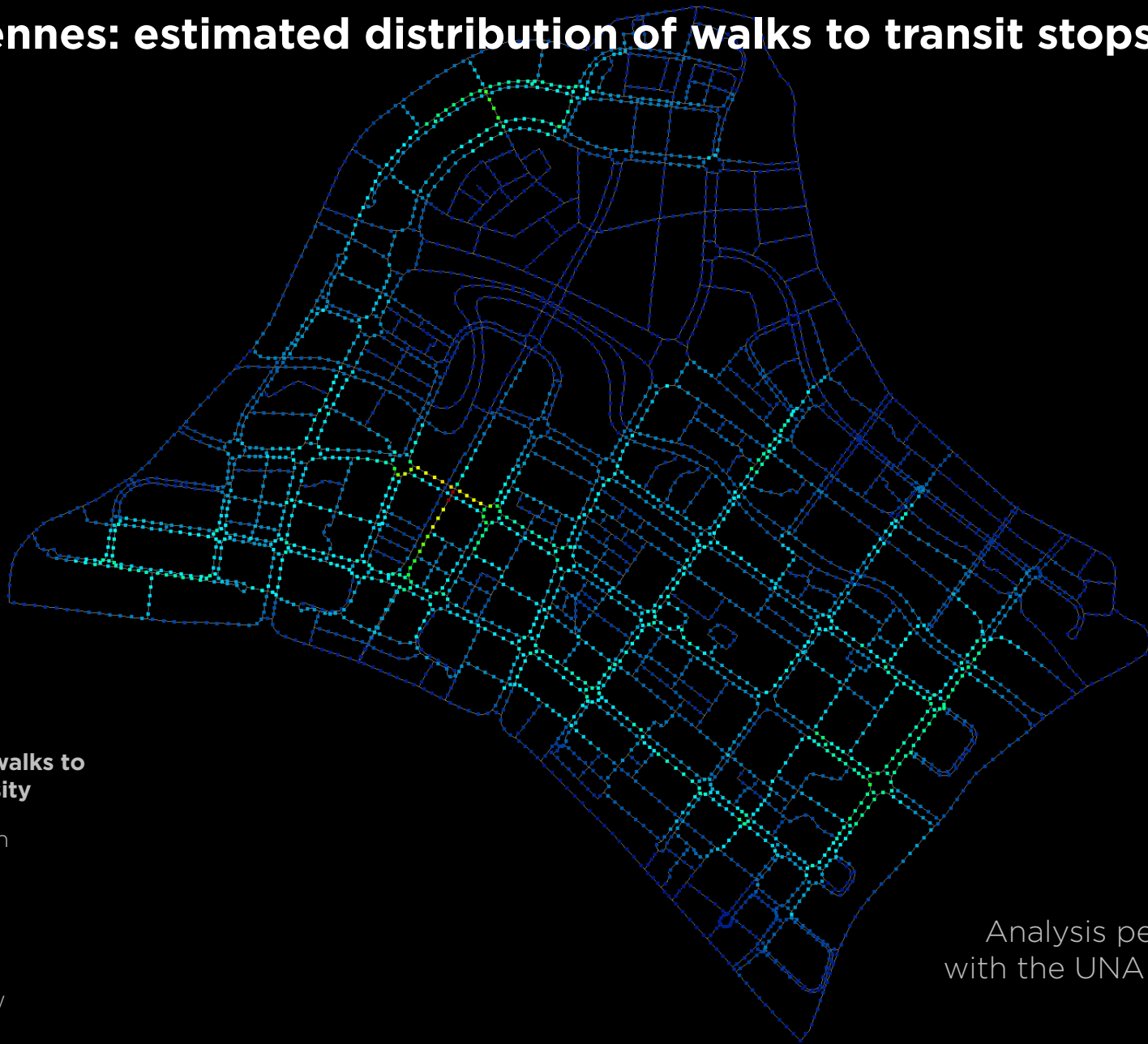


Transit stations

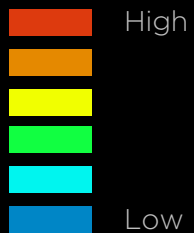
- Metro
- Light-rail
- Bus

Betweenness: estimated distribution of walks to transit stops

Punggol



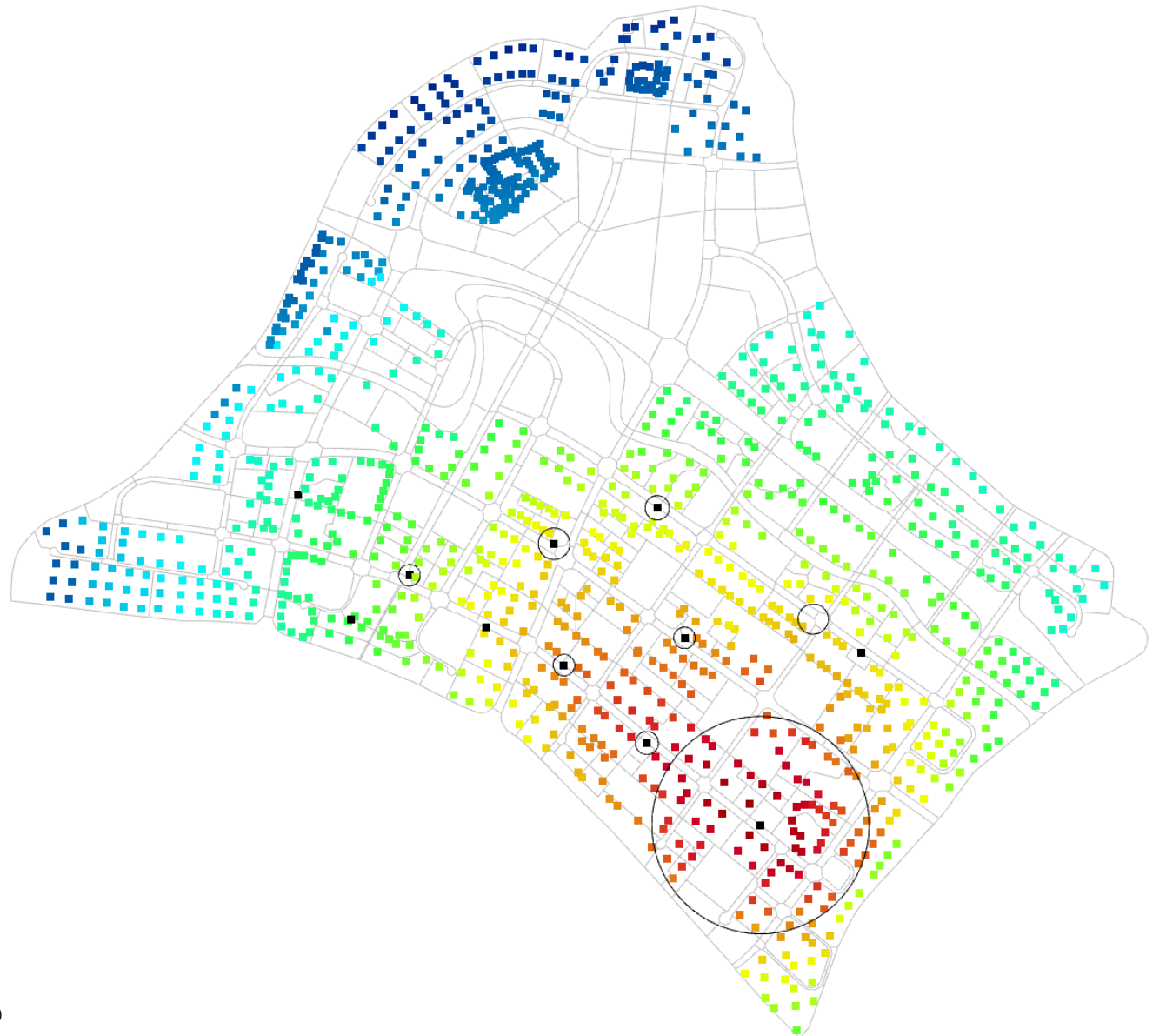
Estimated walks to
transit density



Analysis performed
with the UNA toolbox.

Gravity access from homes to retail centers

Weighted by store size. Radius= 3,000m; beta= 0.001



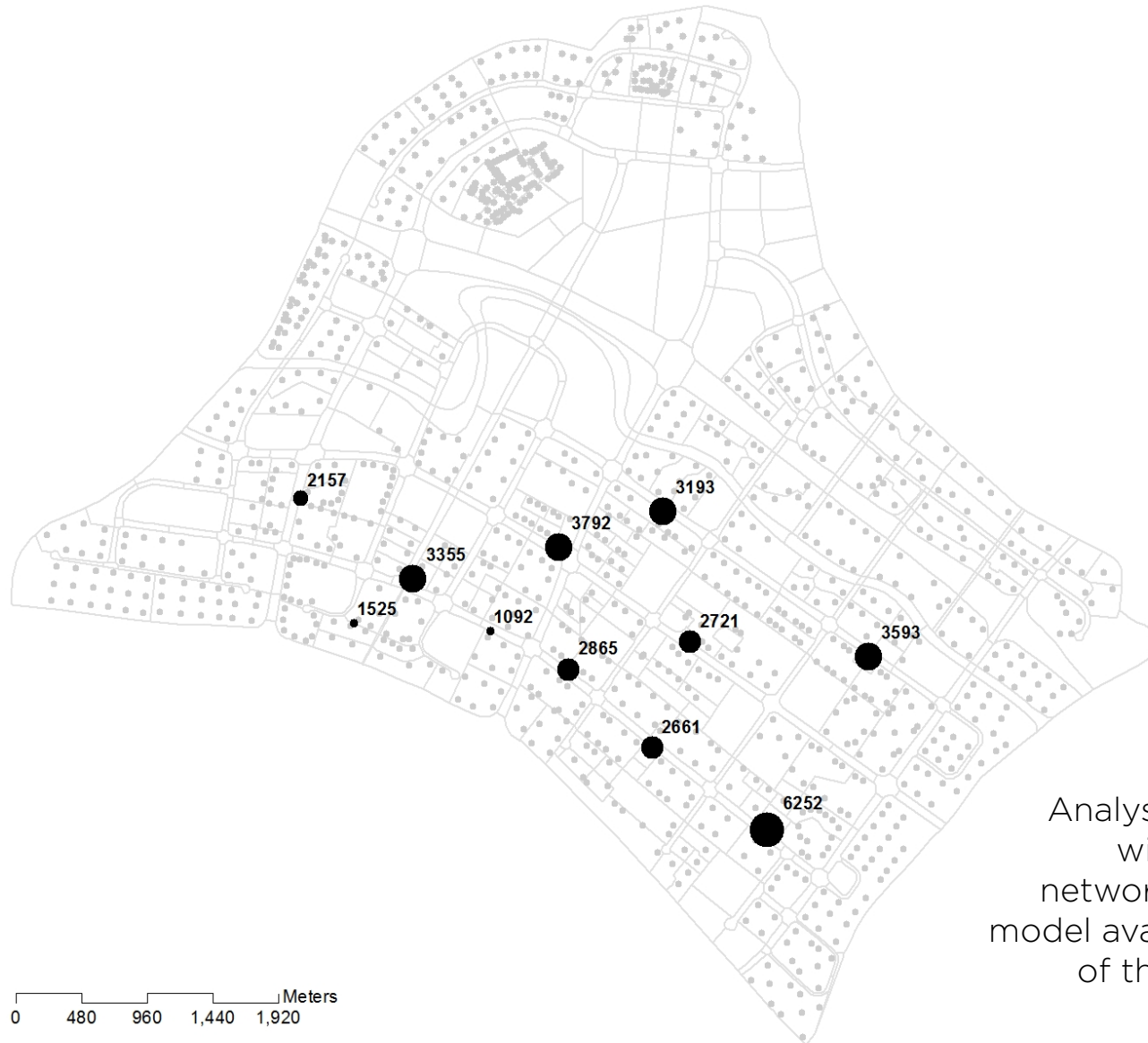
Gravity access from metro walk routes to retail centers

Weighted by store size. Radius= 3,000m; beta= 0.001



Estimated center patronage assuming trips start from homes.

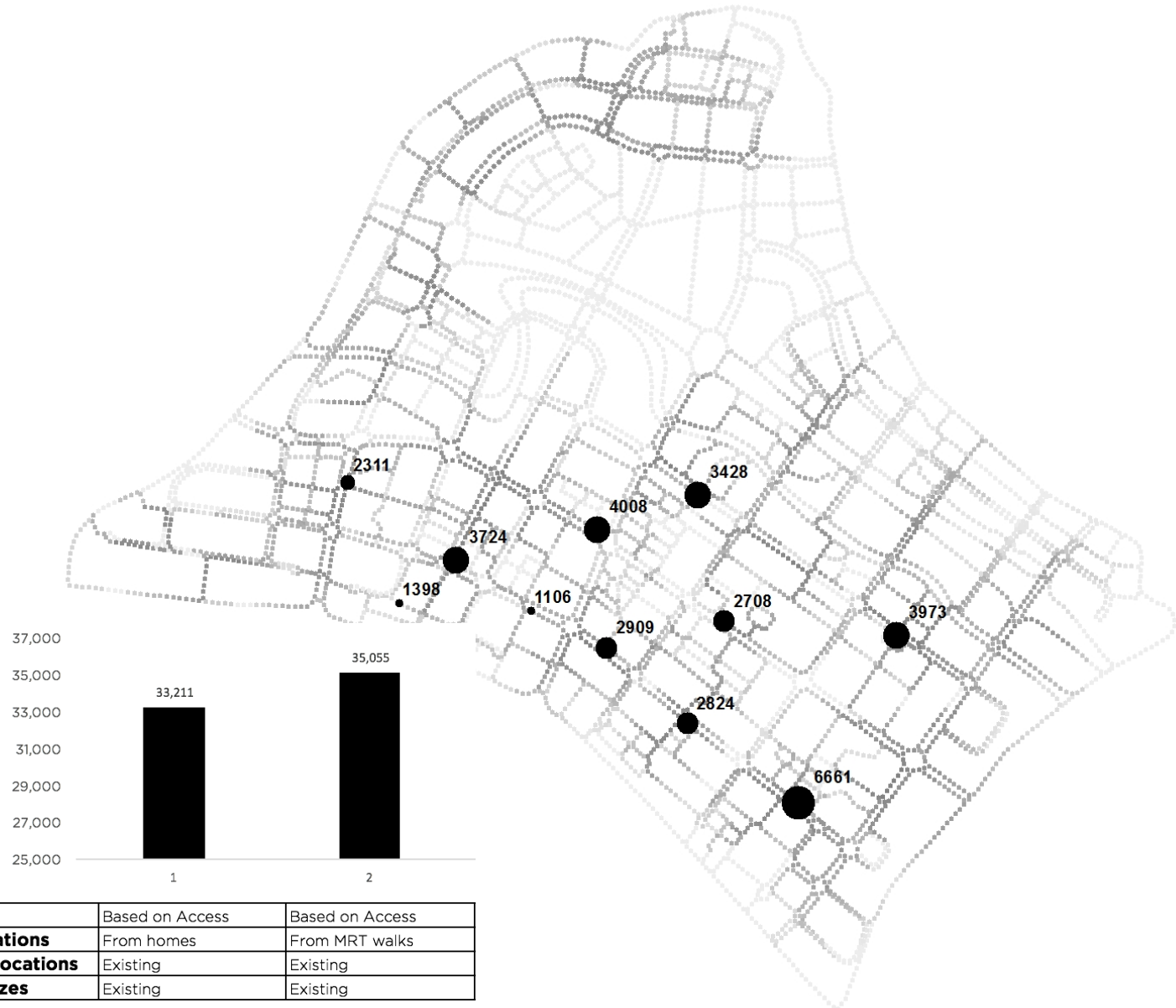
Total visits in town 33,211.



Analysis performed with the spatial network-based Huff model available as part of the Rhino UNA toolbox.

Estimated center patronage assuming trips start from metro walk routes.

Total visits in town 35,055.



Estimated center patronage assuming trips start from MRT walk routes.

Total patronage in town= 35,055 households.

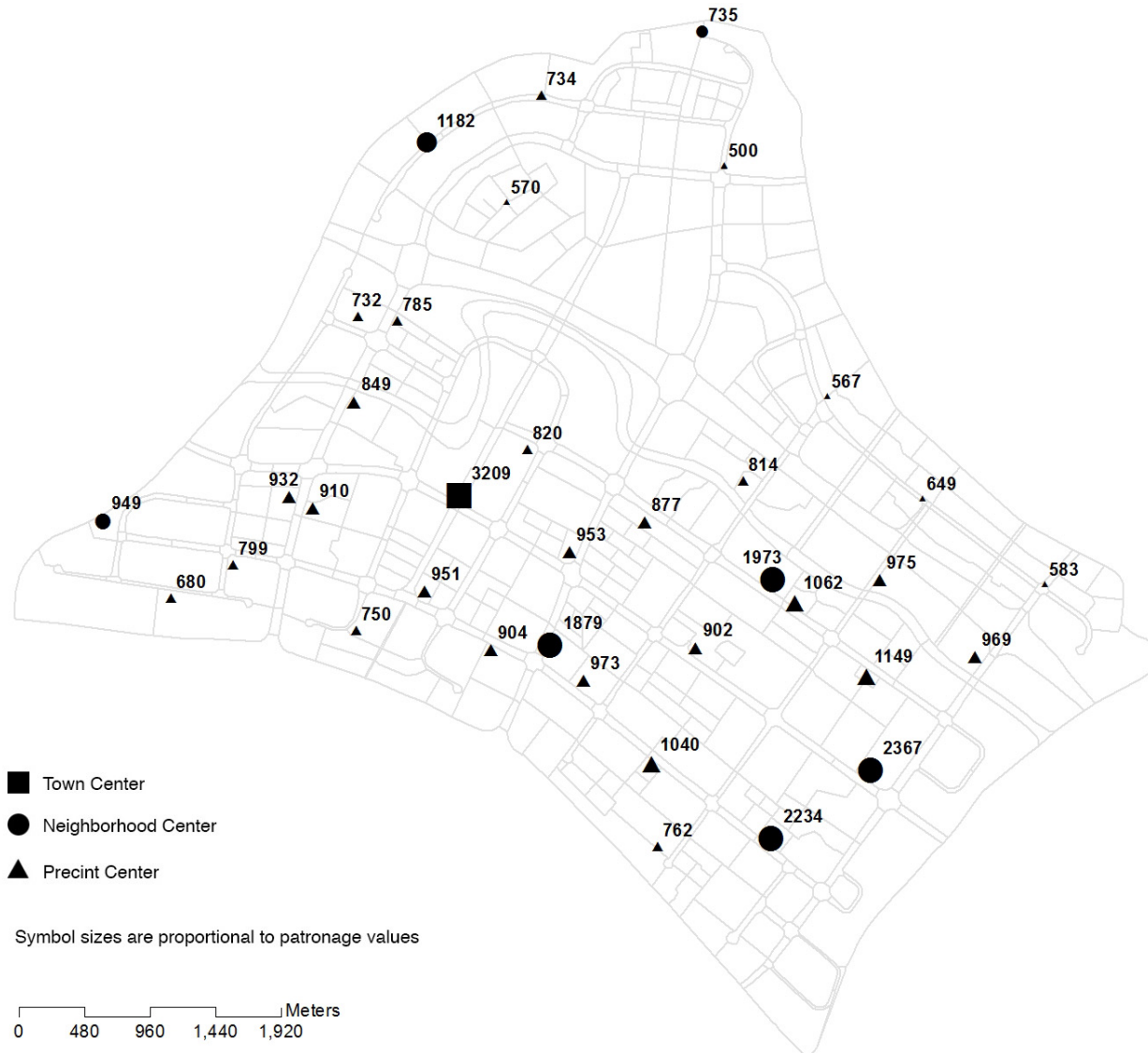


Changing our assumption about where trips originate from changes accessibility results and alters how many people we expect to actually patronize urban amenities...



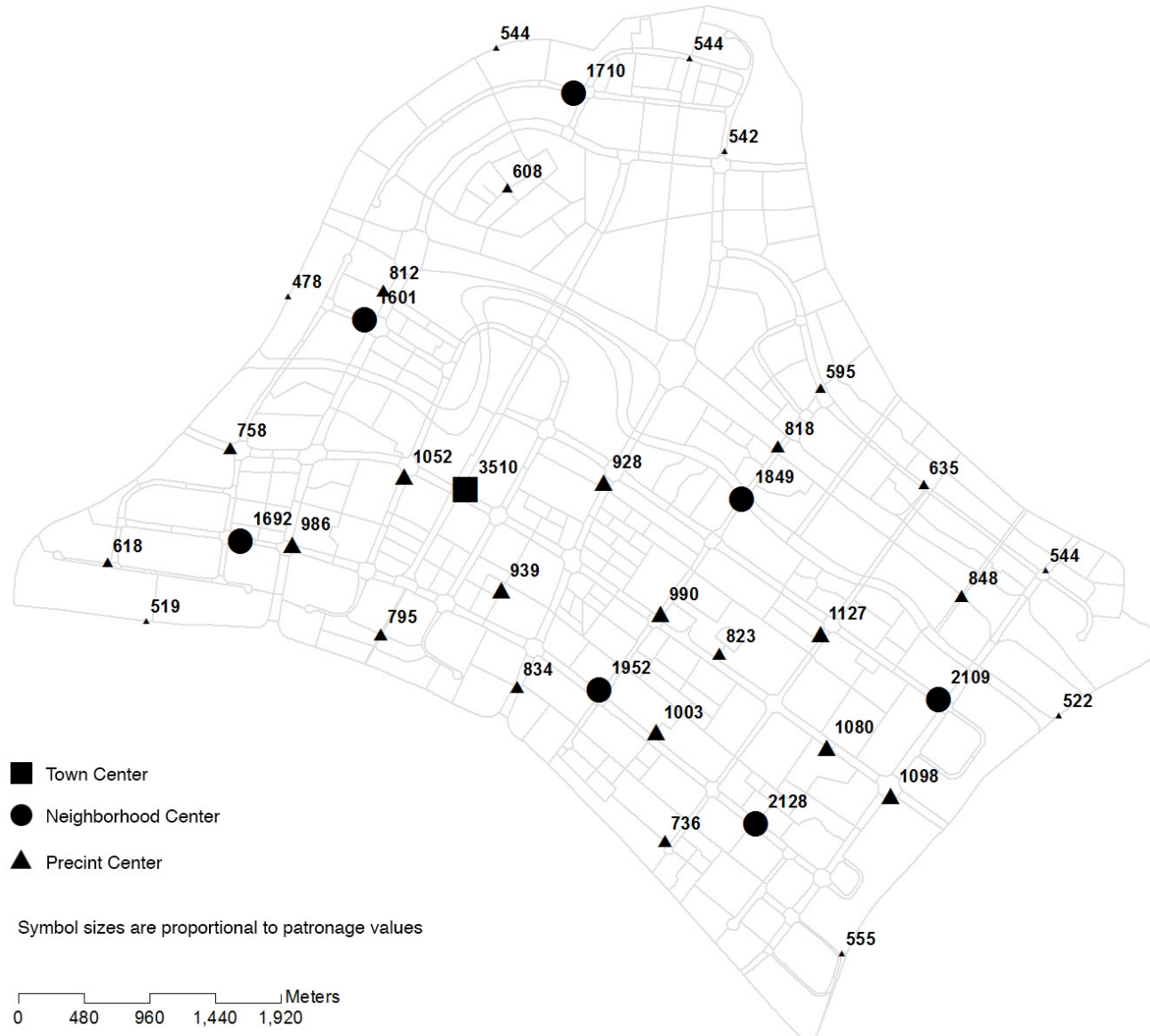
Estimate of retail patronage, where existing and future commercial clusters are located according to HDB's current plans. Total quantum of commercial space is 136,500m².

Total patronage in town: 38,243 households.



Estimate of retail patronage, where the same number of commercial centres are located deliberately closer to MRT walk routes and their sizes reallocated so as to maximize access. Total quantum of commercial stays the same at 136,500m².

Estimated patronage across all clusters is 41,254 households.



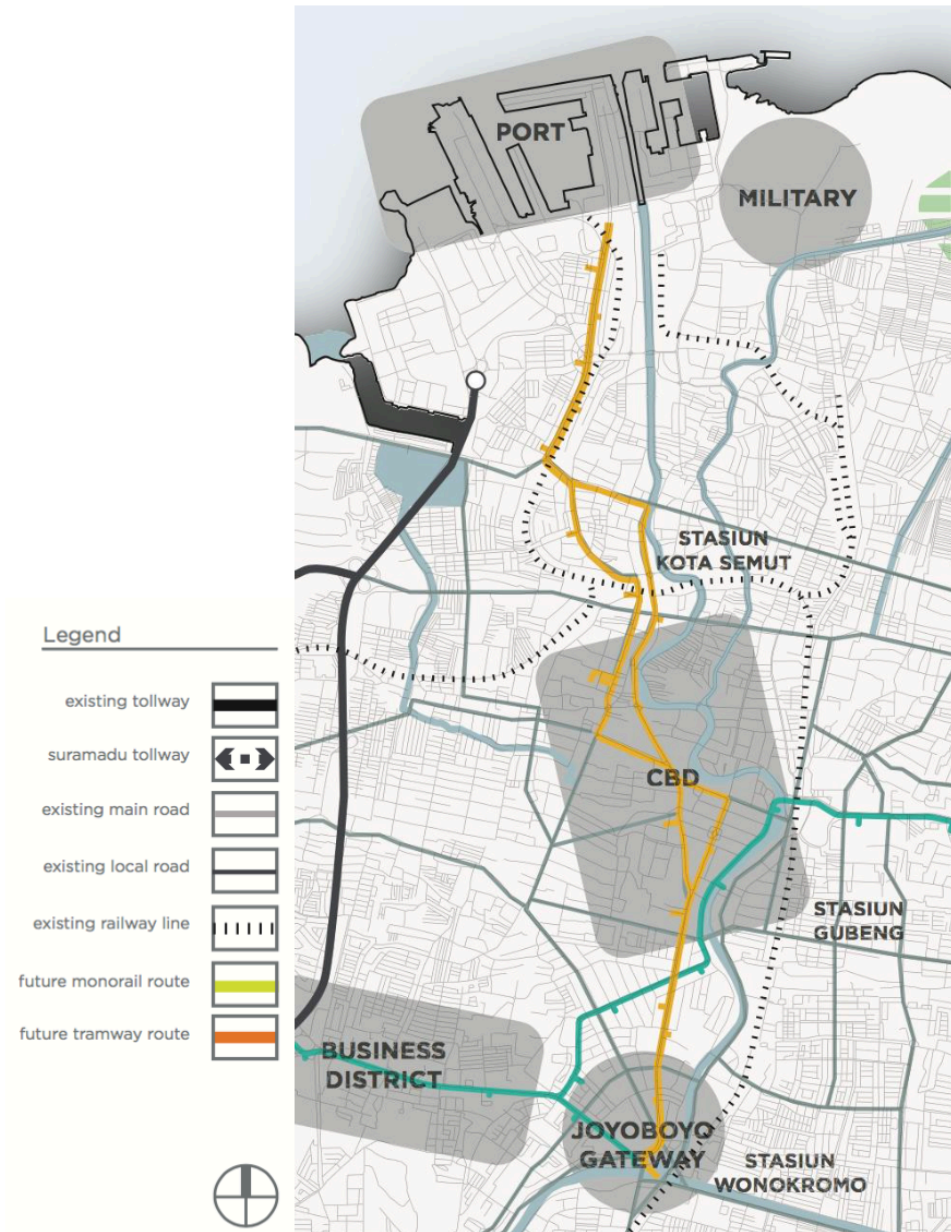


Example 2

City Form Lab & Hansen Partnership. (2015). Surabaya Urban Corridor Development Program. The World Bank. [PDF](#)

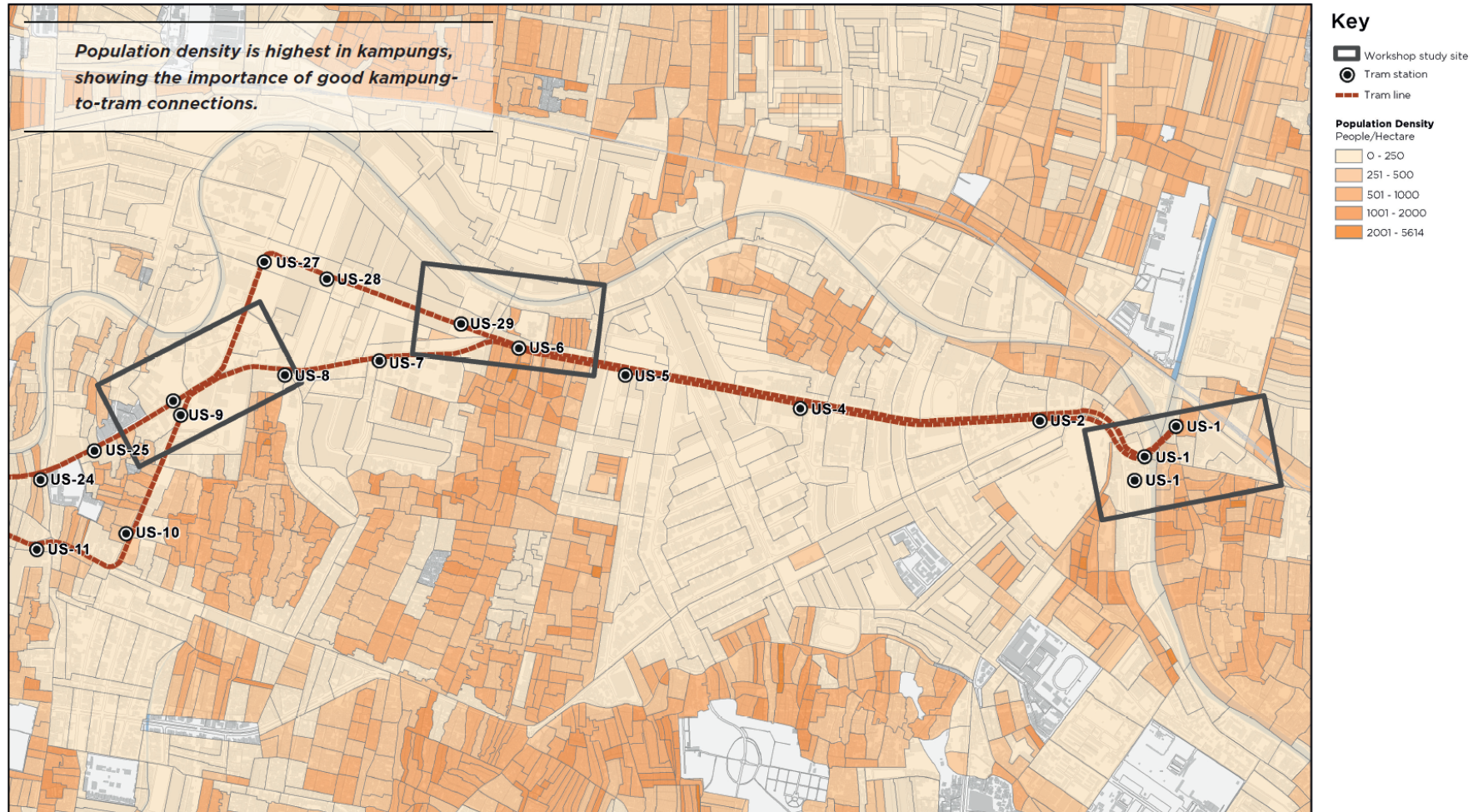
Surabaya Tram Corridor

Context



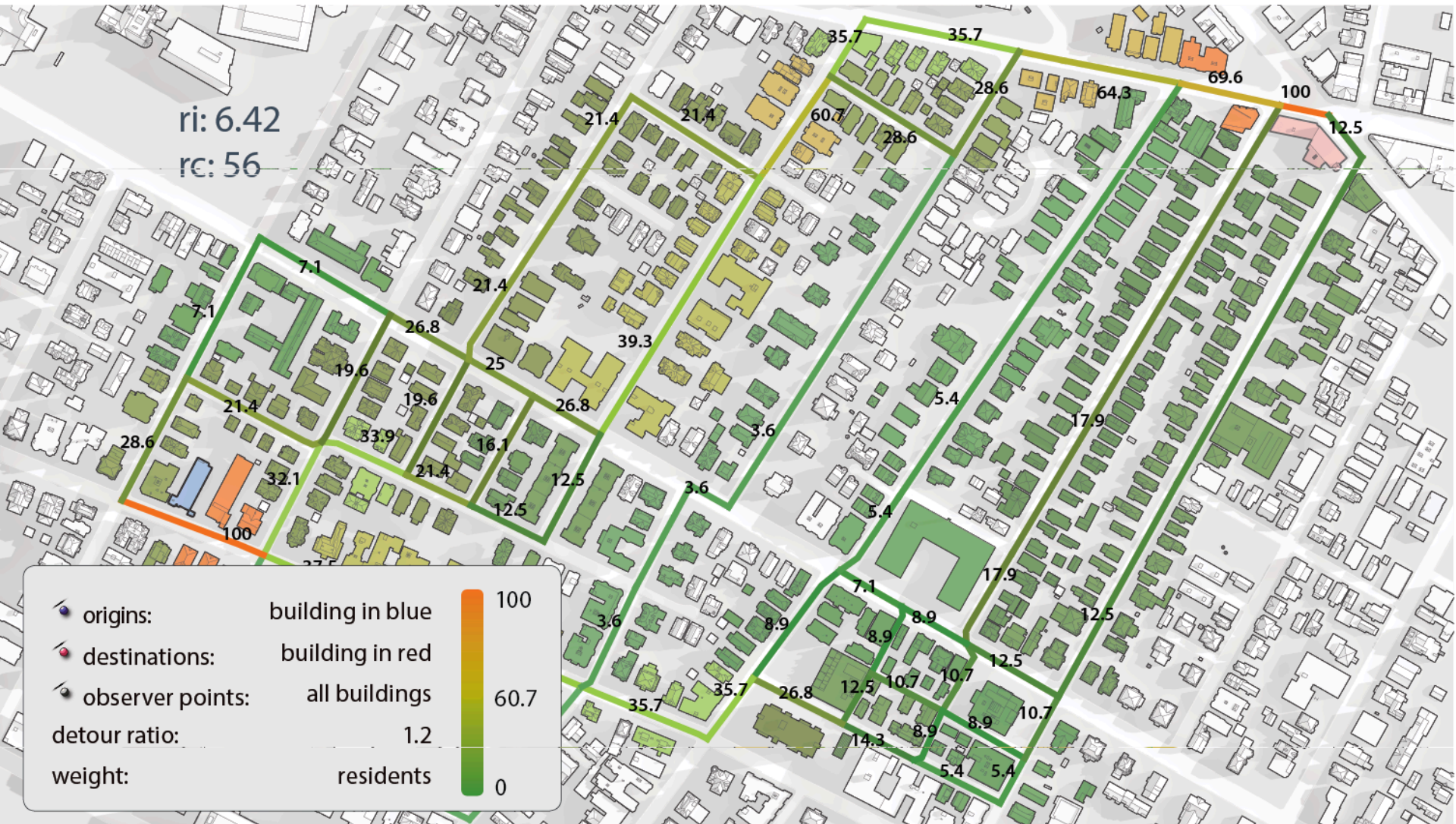
Population density at RT level

South Surabaya



Estimating foot-traffic from origins to destinations

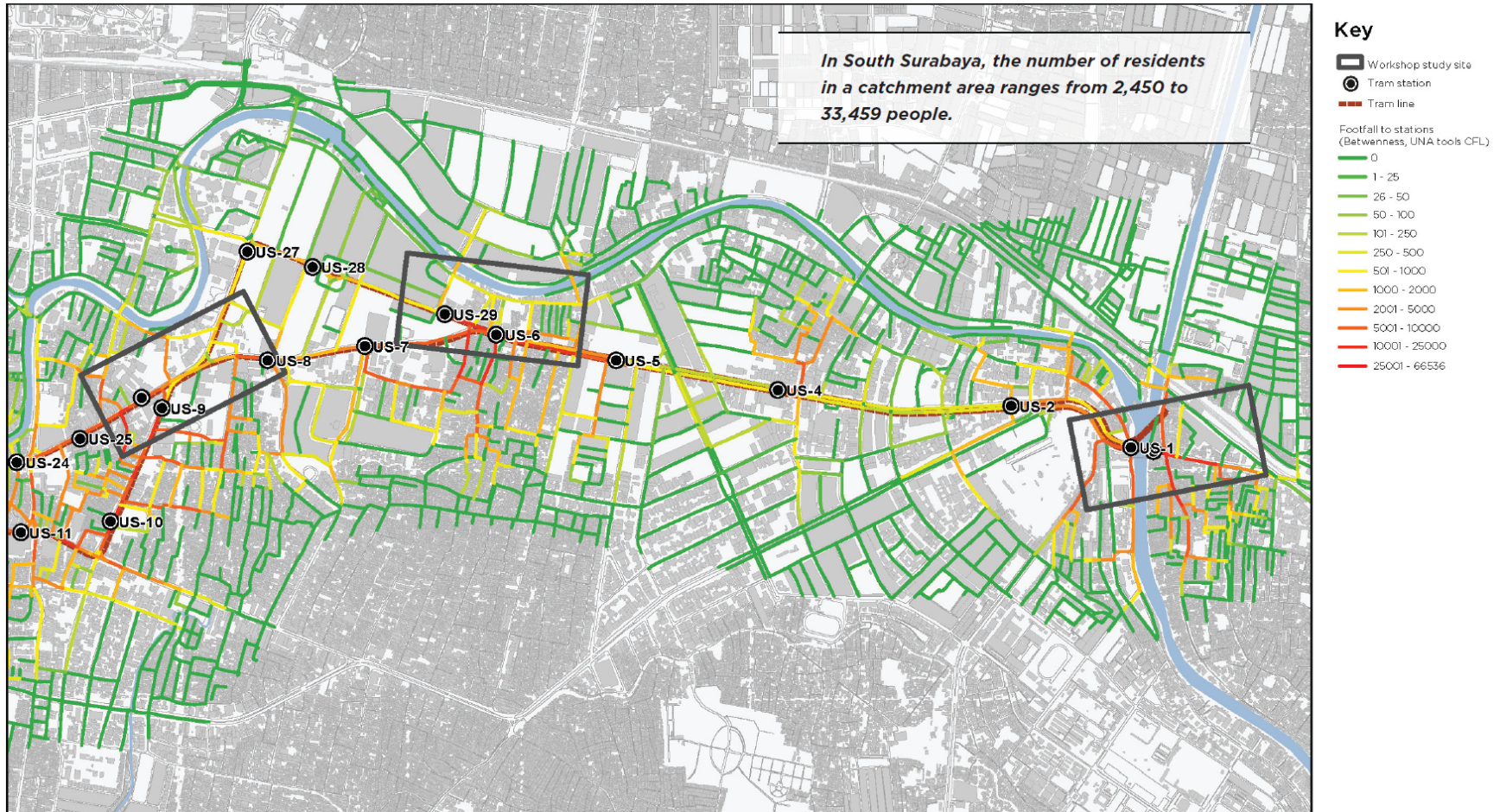
Betweenness analysis, UNA Toolbox



Predicted footfall from homes to MRT stations

to stations up to 800m away

269 km of paths!

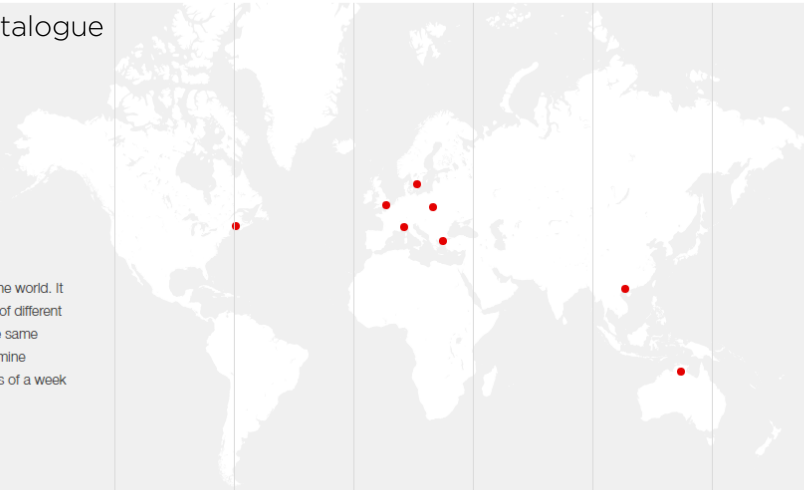


http://cityform.mit.edu/street-catalogue

Street catalogue

The catalogue provides a visual and numeric reference to streets around the world. It allows users to compare the accessibility and connectivity measurements of different streets with time-lapse videos and corresponding pedestrian counts of the same streets. Videos captured during different times of the day allow you to examine temporal changes in the character of a street between times of a day, days of a week or times of the year. [Read more](#)

Submit street >



Case ID	Country	City	Street name	Date & Time	Weekday	Footfall per hour	Betweenness	Access to Businesses	Access to Transit	Access to Floor Area
	Country	City		From To	min max	min max	min max	min max	min max	min max
#1	USA	New York	10th Avenue	15/03/2014	Sun Weekday	1108 Footfall per hour	621 Betweenness	597 Businesses	Transit	2447604 Floor Area
#2	Australia	Melbourne	Swanston Street	30/03/2015	Mon Weekday	2223 Footfall per hour	239 Betweenness	1071 Businesses	24 Transit	124000 Floor Area
#3	USA	New York	Hudson Street	15/03/2015	Sun Weekday	680 Footfall per hour	1288 Betweenness	801 Businesses	Transit	1768651 Floor Area
#5	China	Shanghai	Lujiazui Pedestrian Bridge	02/04/2015	Thu Weekday	1500 Footfall per hour	18 Betweenness	343 Businesses	13 Transit	Floor Area

Brattle Street, Cambridge MA

Brattle St at Harvard Square has a number of a popular shopping destinations, street cafes and restaurant. The time-lapse is captured at about 50 meters from the nearest Harvard Square subway entrance. The space in front of the camera contains a large sidewalk with ample seating areas, which also functions as a public plaza for street musicians and people-watchers.

15:50

14/09/2015

Mon

Weekday

904

Footfall per hour

783

Betweenness

647

Businesses

19.2

Transit

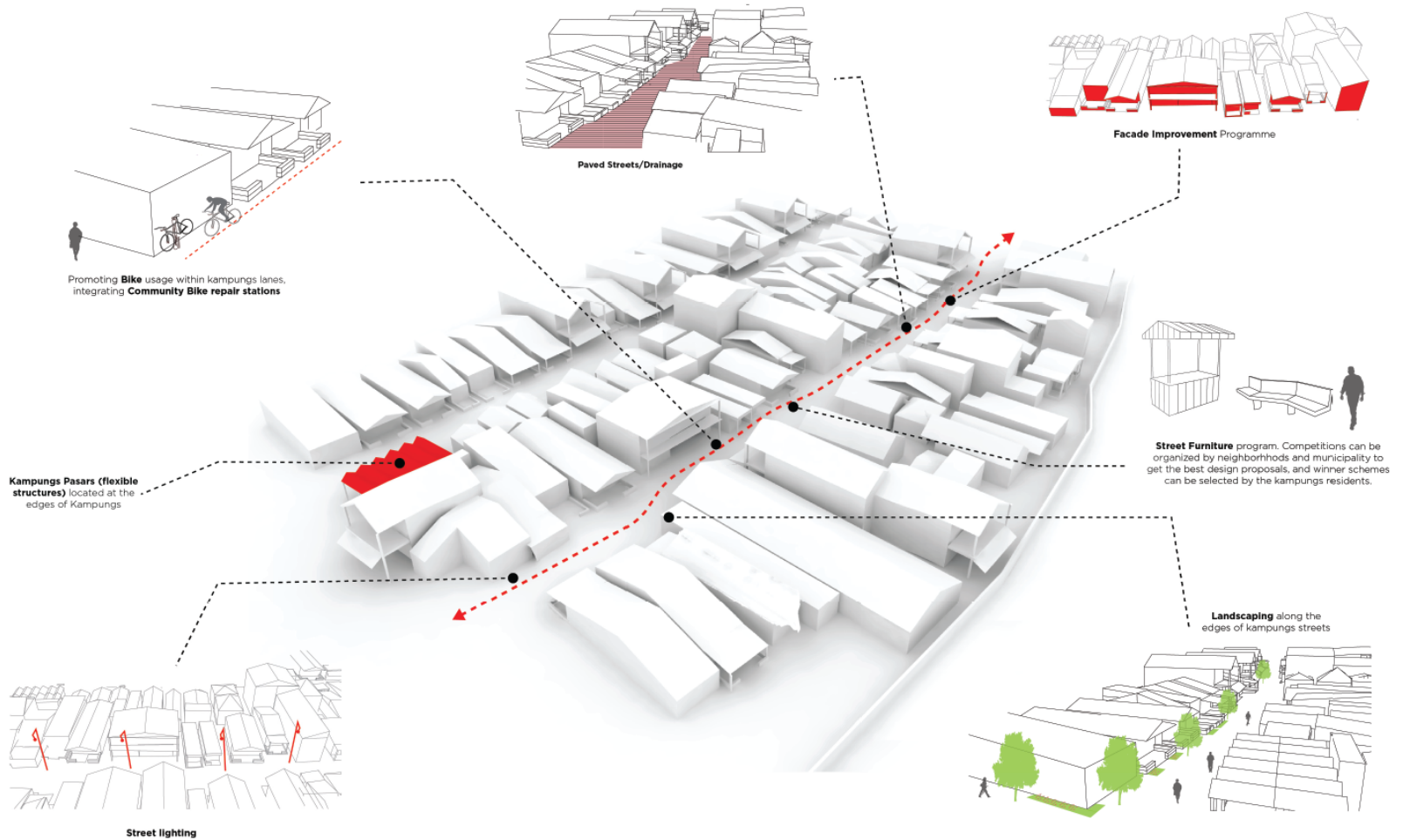
251571

Floor Area



Upgrade important kampung lanes leading to MRT stations

Drainage, lighting, landscaping, activity generating uses, bike-lanes, furniture...

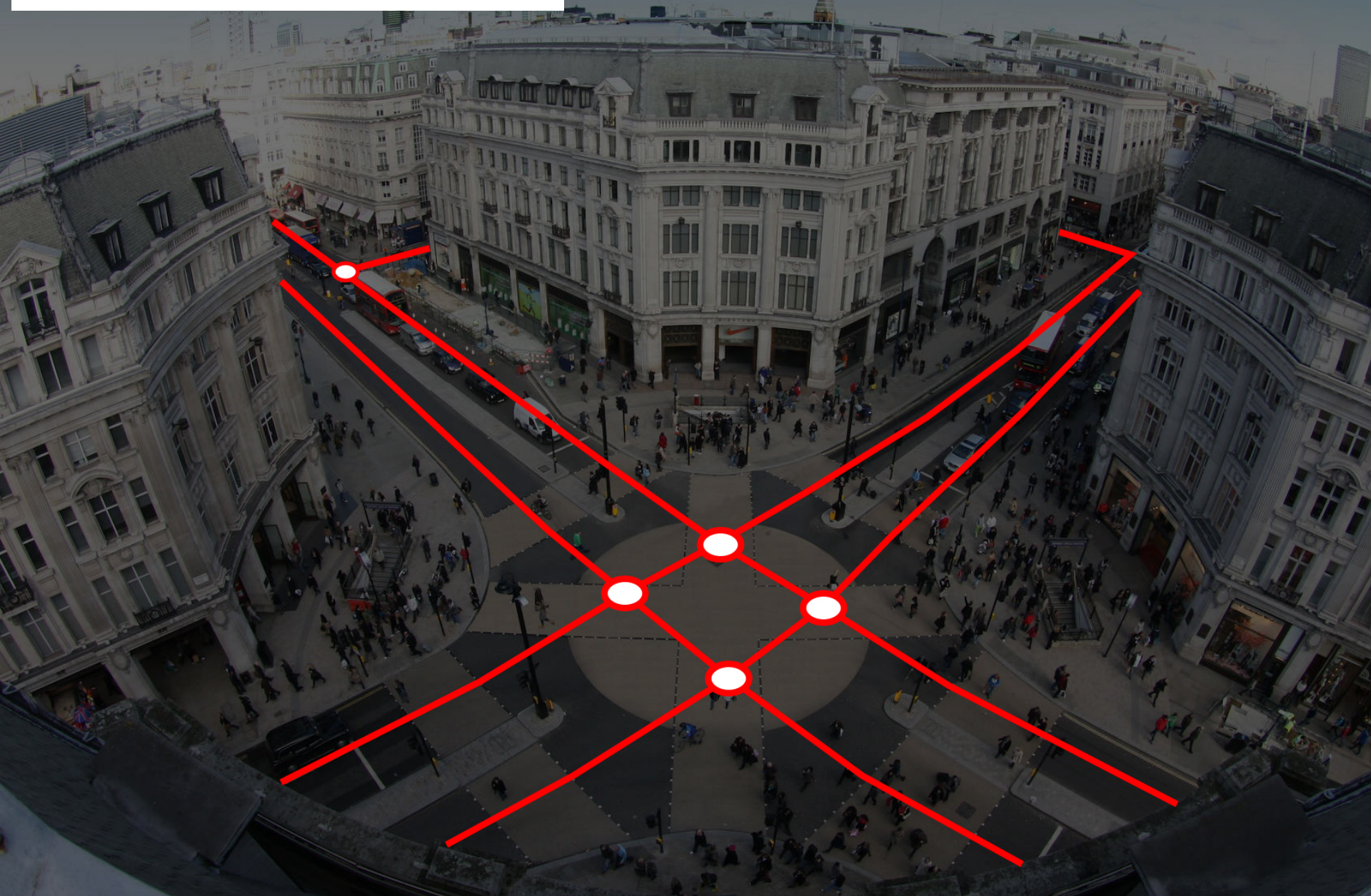


Data...

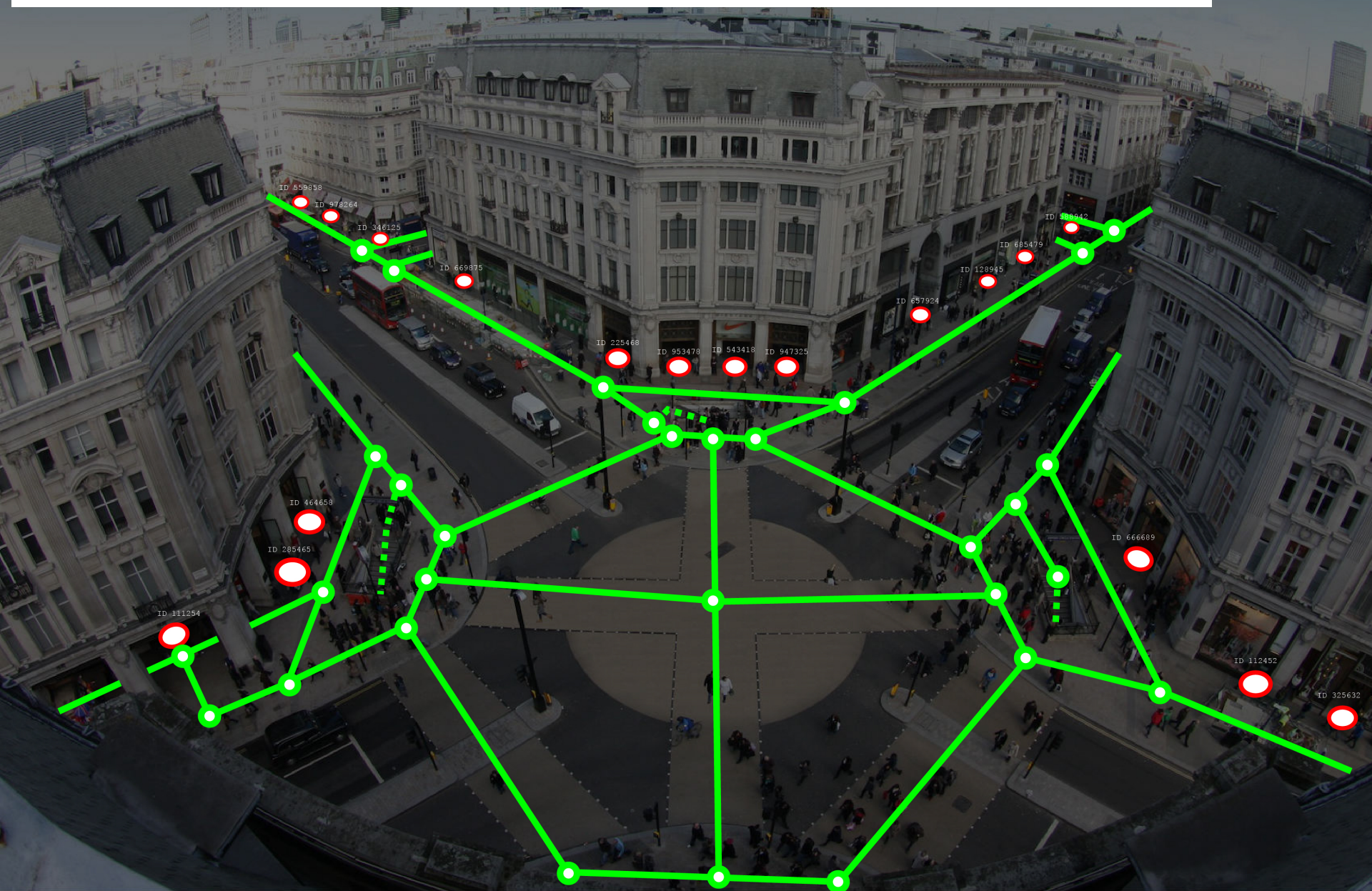
Complex built environment around the last mile



Data we have: road networks



Data we should have: pedestrian networks and building entrances



Category counts:

391 pedestrians

- 342 walking
- 38 standing
- 3 baby strollers
- 8 running

7 cyclists

14 passenger cars

- 1 truck**
- 4 buses**



Governments maintain good databases on vehicular roads

e.g. US Census TIGER roads data

United States Census Bureau

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 - Block Assignment Files
 - Name Lookup Tables
 - Tallies
 - LandView

TIGER/Line® Shapefiles and TIGER/Line® Files

- Format
 - Shapefile - 2007 to Present
 - TIGER/Line ASCII format - 2006 and earlier
 - Census 2000 available in both formats
- The core TIGER/Line Files and Shapefiles do not include demographic data, but they do contain geographic entity codes (GEOIDs) that can be linked to the Census Bureau's demographic data, available on [American FactFinder](#).
- [How Do I Choose Which Vintage to Use?](#) [PDF]
- [Note on Special Characters Not Displaying Correctly](#)
- [Working with TIGER/Line Shapefiles How-To Guides](#)
- Geography Change & Errata
 - [Geographic Boundary Change Notes](#)
 - [Geography Notes and Errata from the 2010 Census](#) [PDF]
 - [Substantial County Changes](#)



2017	2016	2015	2014	2013	113th CD	2012	2011	2010	2009	2008	2007	2006SE	Census 2000	1992
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2017 TIGER/Line Shapefiles

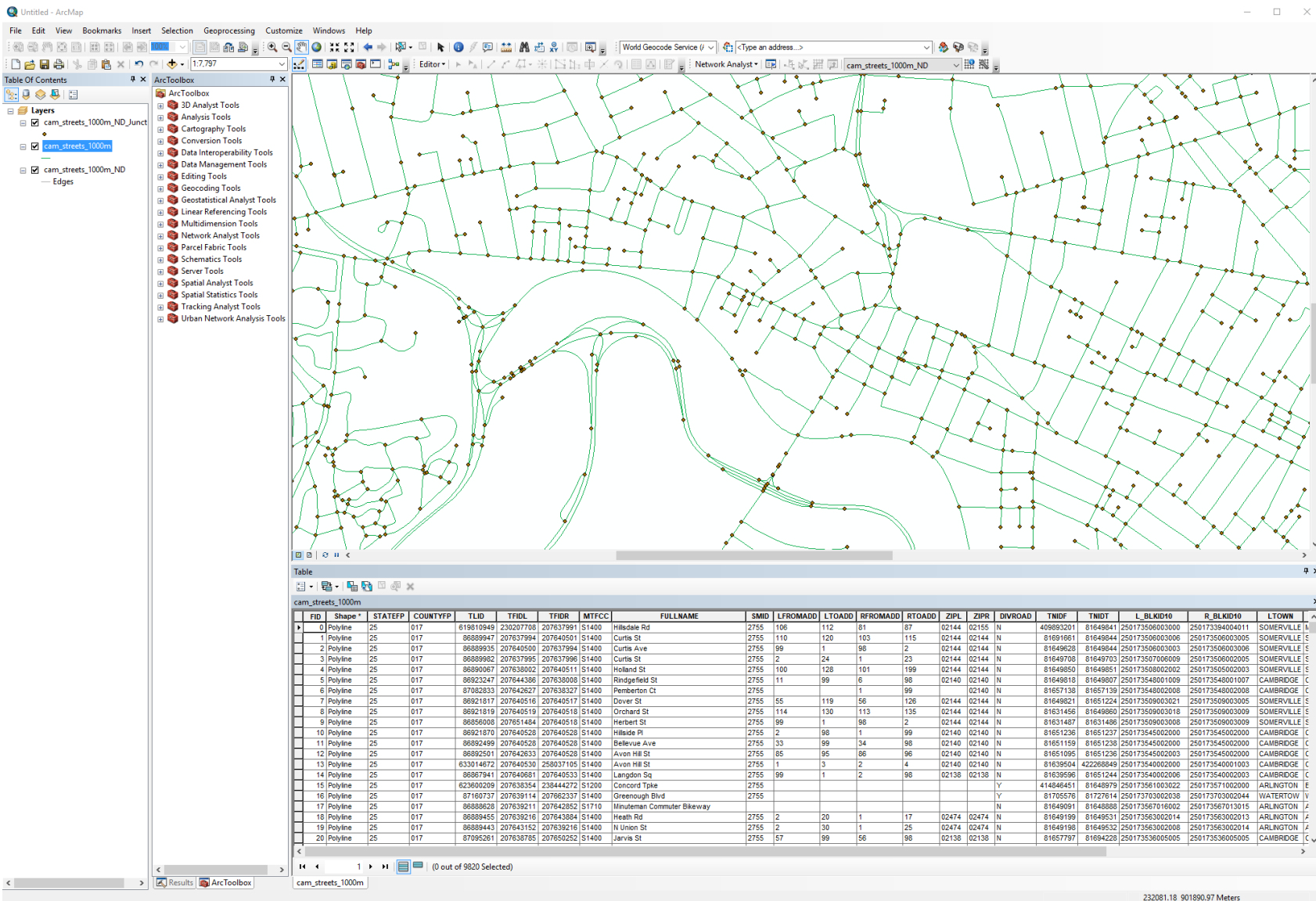
All legal boundaries and names are as of January 1, 2017. Released September 28, 2017.

- Download
- Technical Documentation
- File Availability
- User Notes

The boundaries shown are for Census Bureau statistical data collection and tabulation purposes only; their depiction and designation for statistical purposes does not constitute a determination of jurisdictional authority or rights of ownership or entitlement.

Legal Disclaimer: No warranty, expressed or implied, is made with regard to the accuracy of the data in the TIGER/Line Shapefiles, and no liability is assumed by the United States Government in general, or the Census Bureau specifically, as to the positional or attribute accuracy of the data. The boundary information in the TIGER/Line Shapefiles is for statistical data collection and tabulation purposes only. Their depiction and designation for statistical purposes does not constitute a determination of jurisdictional authority or rights of ownership or entitlement and they are not legal land descriptions.

E.g. US Census TIGER roads data



The lack of good data is a huge barrier to better walking infrastructure. Denver, a self-styled Vision Zero city, can't eliminate traffic deaths without a safe walking network. And the city can't improve its walking network if it doesn't know where the weaknesses are. And yet, no city department has an inventory of the city's sidewalks and crosswalks.

Streets Blog Denver

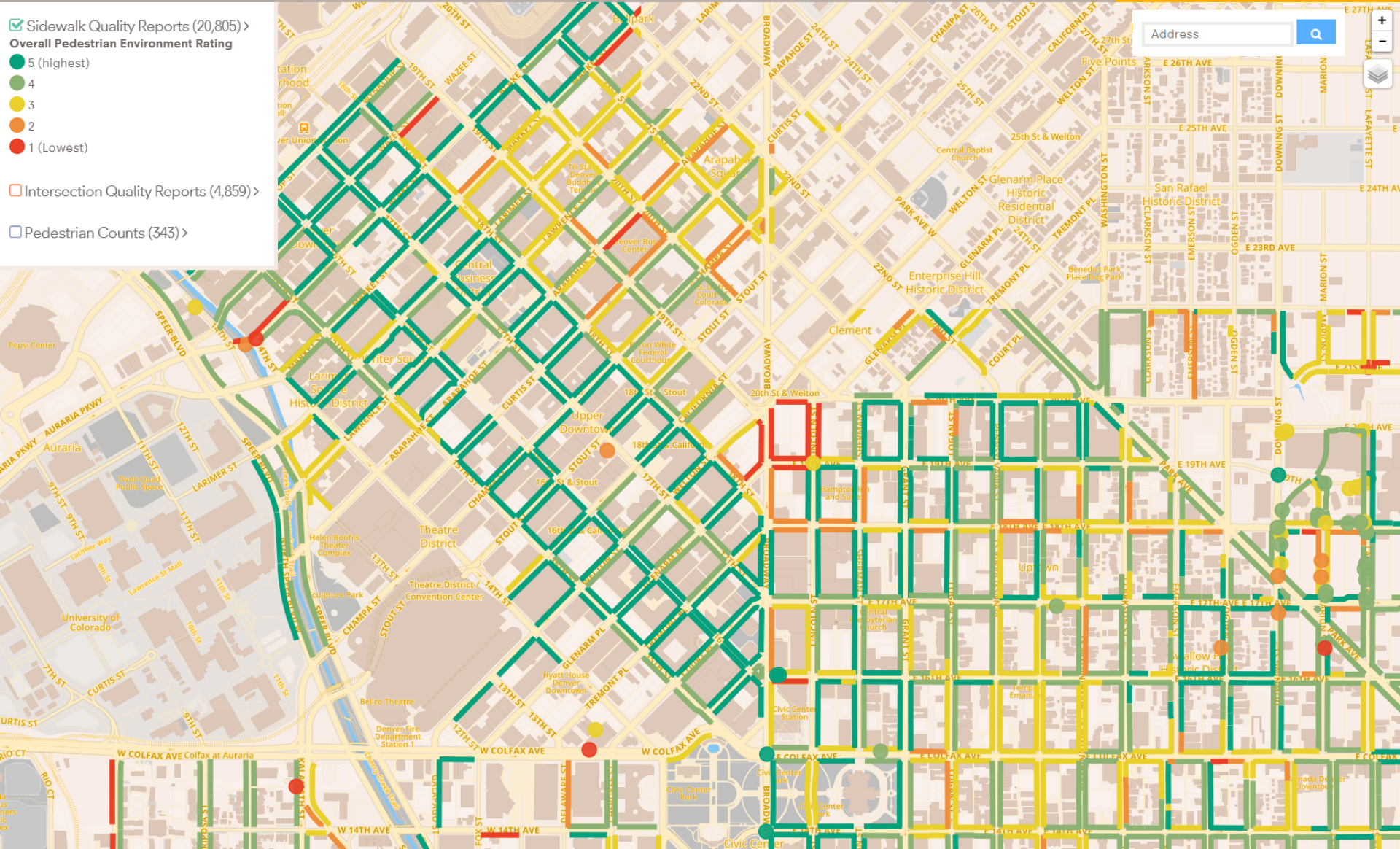
Crowd-sourcing sidewalk data

e.g. Walkscope in Denver



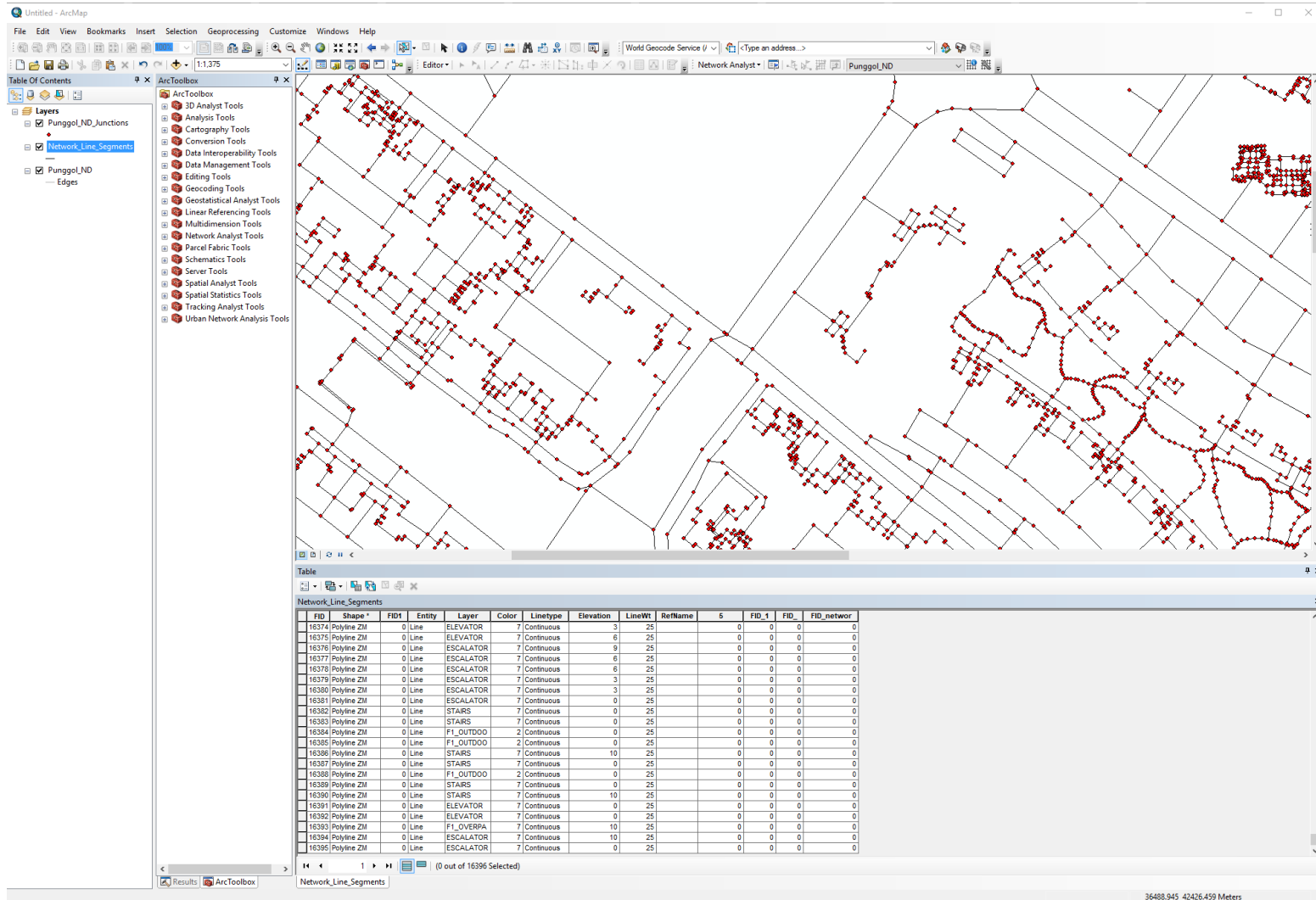
Map Reports Add Data About

- Sidewalk Quality Reports (20,805) >
- Overall Pedestrian Environment Rating**
- 5 (highest)
- 4
- 3
- 2
- 1 (Lowest)
- Intersection Quality Reports (4,859) >
- Pedestrian Counts (343) >



City governments should maintain equally good databases on pedestrian networks...

OECD ITF to develop standards and recommendations for cities around the world?



Conclusions

- It is customary to measure spatial accessibility from fixed locations (e.g. homes, jobs), but people don't necessarily start their trips from these locations.
- Changing our assumption about trip origins, changes our estimates of how frequently and by whom urban amenities can be accessed and are visited.
- When planning accessible environments, we need to not only think about motorized and mechanized transport infrastructure, but also focus on the scale of the *street* which everyone intuitively experiences.
- In order to describe accessibility on streets, we need data about sidewalks and pedestrian infrastructure.
- Could OECD help propose standards and urge cities to collect sidewalk data?
- In order for accessibility analytics to influence city design and planning, analytics needs to move from being retrospective and become projective, applied to synthetic and normative design solutions of the future, shaping decisions about potential built environments.

Thank you!

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Urban Network Analysis toolbox software (FREE)

The free Urban Network Analysis Toolbox can be downloaded for Rhino3D from <http://cityform.gsd.harvard.edu/projects/una-rhino-toolbox> and for ArcGIS from <http://cityform.gsd.harvard.edu/projects/urban-network-analysis>

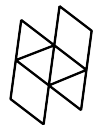
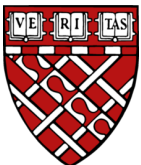
Related Articles

Sevtsuk, A., Mekonnen, M., 2012, “Urban Network Analysis Toolbox,” *International Journal of Geomatics and Spatial Analysis*, vol. 22, no. 2, pp. pp. 287–305. [PDF](#)

Sevtsuk, A. (2014). Location and Agglomeration: the Distribution of Retail and Food Businesses in Dense Urban Environments. *Journal of Planning Education and Research*, 34(4), 374–393. [Link](#)

Sevtsuk, A., Kalvo, R., & Ekmekci, O. (2016). Pedestrian accessibility in grid layouts: the role of block, plot and street dimensions. *Urban Morphology*, 20(2), pp. 89-106. [PDF](#)

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