

Passive Data for the NCSTM & Applications for Charlotte

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November 5, 2019

Projects

- NCSTM4 for P6
 - New Base Year: 2017
 - General Population & Truck-Specific Big Data
 - New data-driven, pivot point model architecture
 - Updated Passenger & Freight Models
 - NHB trips linked to HB trips
 - New visitor trips & Long-distance in GISDK
- Charlotte Big Data Analytics
 - General and Truck OD flows for the region
 - Metrolina zone system & times-of-day
 - Corridor specific ODs for I-77 and NC49



Data Acquired for NCSTM

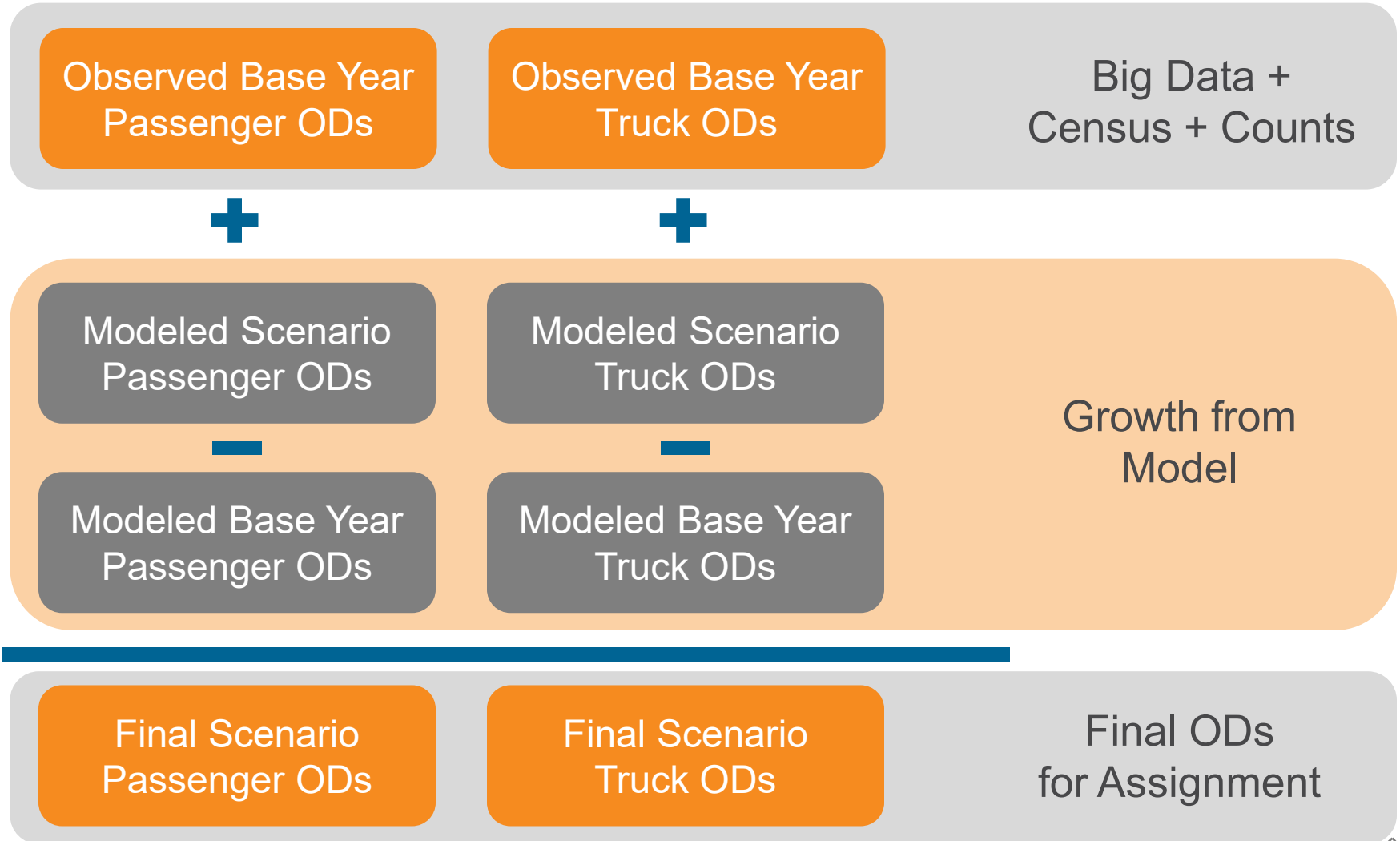
- NCSTM Passive Data
 - LBS data (from Safegraph)
 - 10-15% of devices on any given day and roughly half of all devices over the course of a month
 - May 6-12, 2018: 683,832,200 sightings from 2,555,873 devices
 - Truck GPS data from ATRI
 - Approaching 25% of all trucks
- Origin-Destination (OD) flows in new NCSTM zone system
- Truck ODs, trace data for Triad & Metrolina



One Day of LBS Data

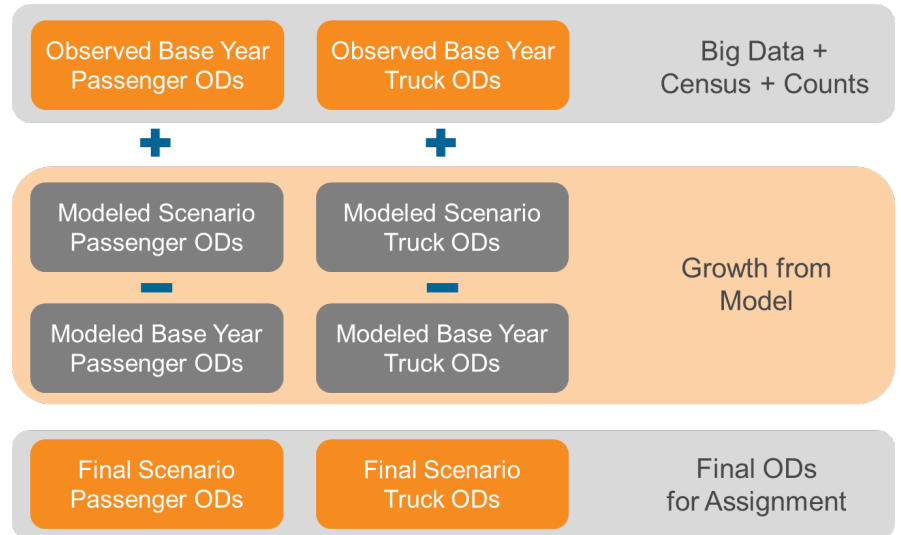


Data-Driven Pivoting



Data-Driven Pivoting

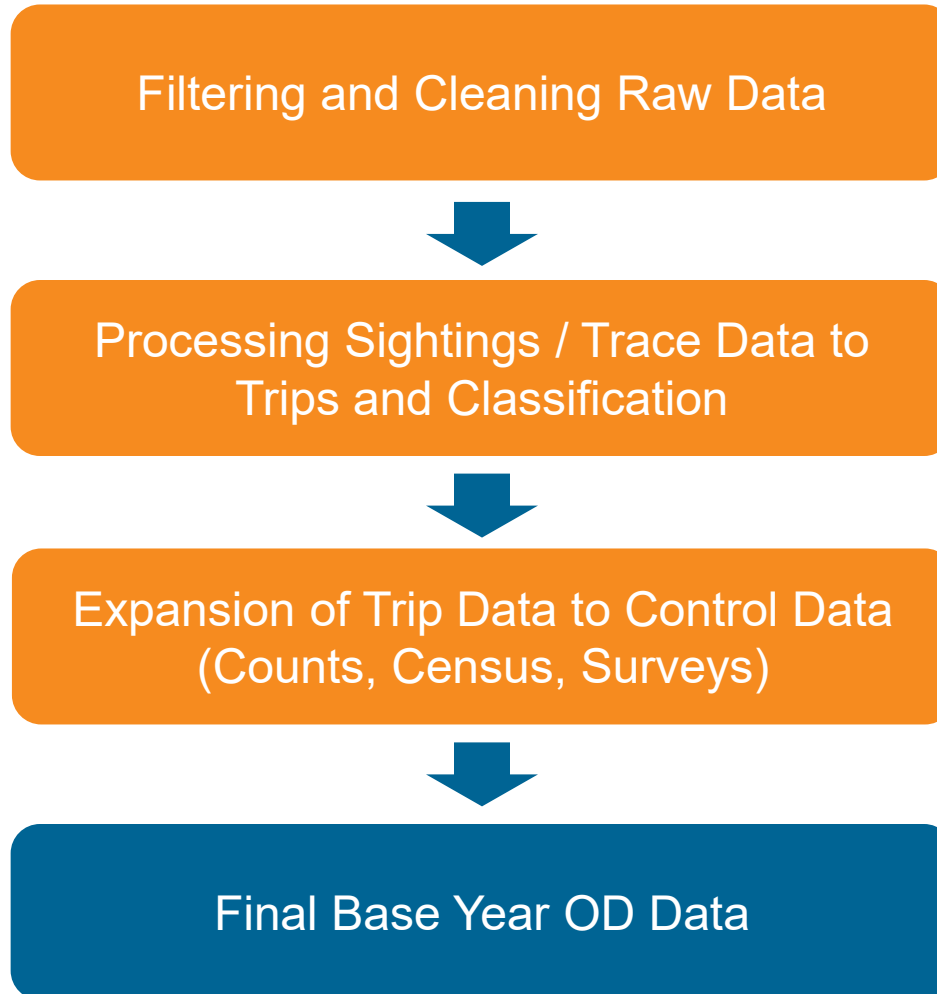
- Not done in past because no good OD data
- Allows base year updates without demand model recalibration
- Encourages shift in focus of model validation to dynamics / sensitivity and response properties
- Produces more accurate ODs than any “pure” model





Data Processing & Expansion

Stages of Data Development



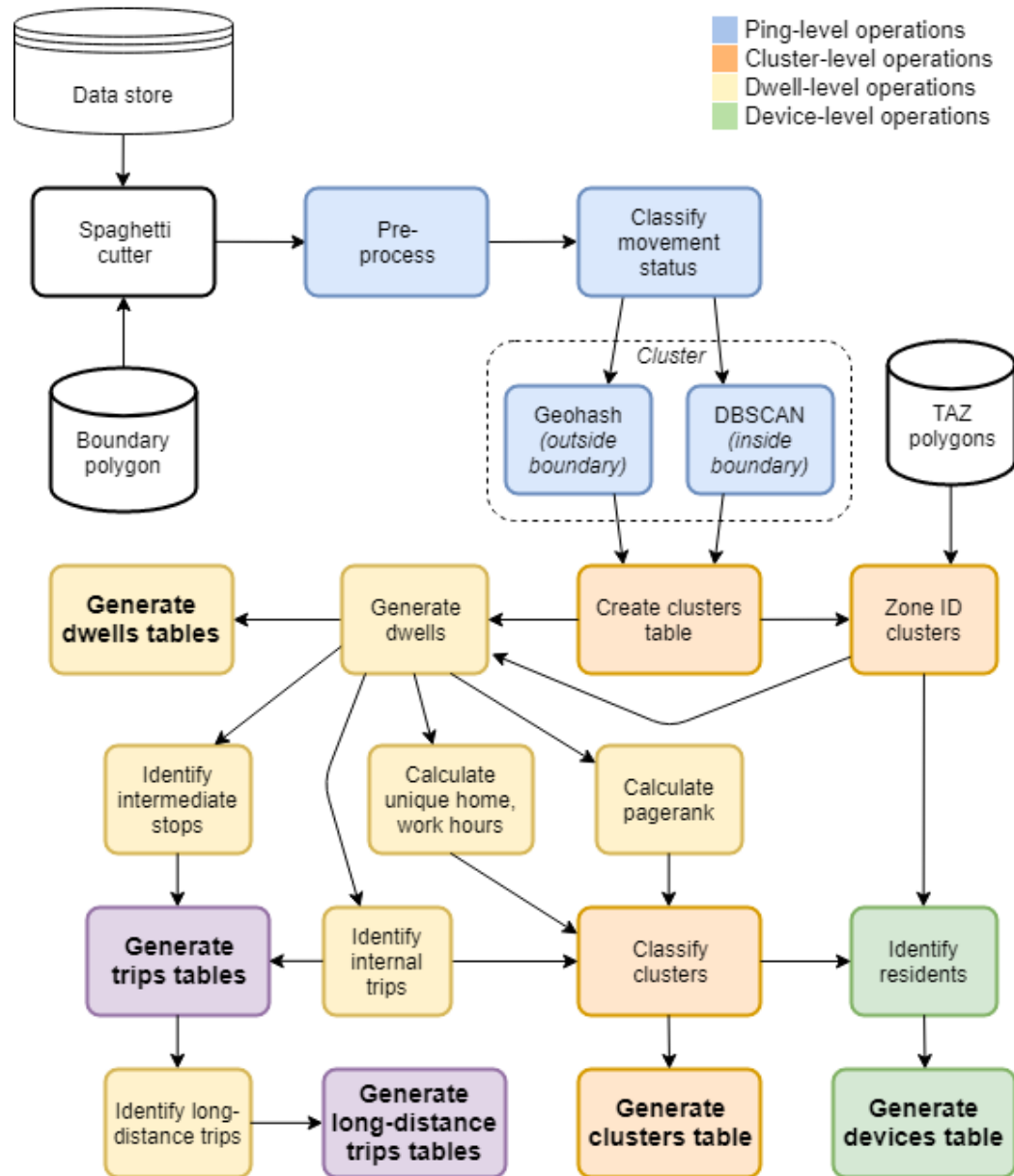
Data Filtering

- With big data, logically trivial queries can be computationally intense
- Filtering for study area and time period
 - North Carolina, October 2018
 - “Cookie cutting” vs. “Spaghetti cutting”
- Filtering devices for data quality
 - Minority of devices contain vast majority of information (sightings, trips)
 - At the scale of big data, better to have less, good data than more, bad data



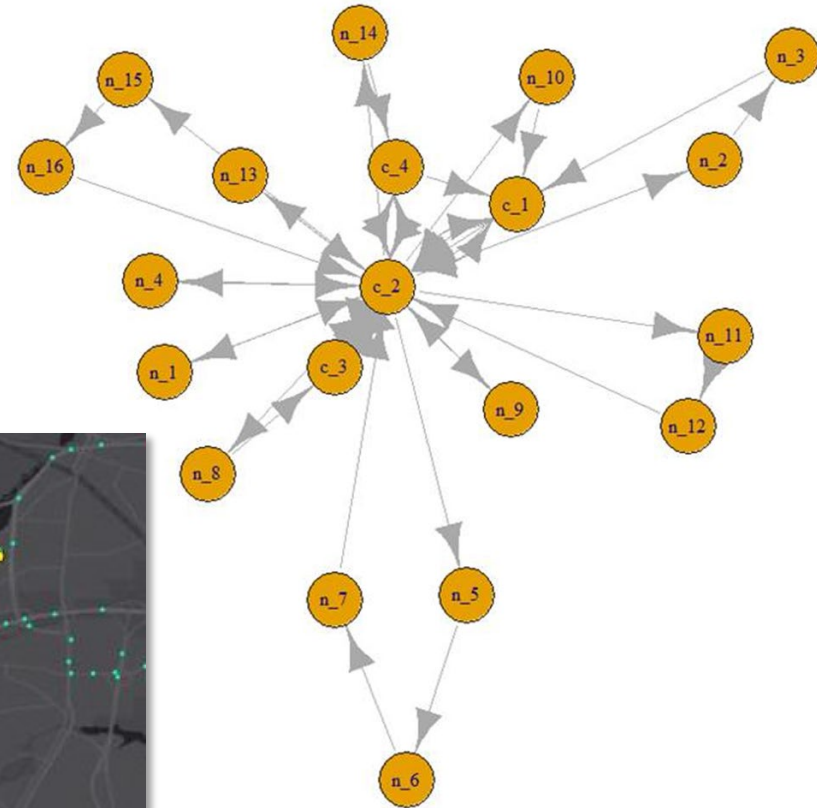
Data Processing

- Identifying stops
 - Best methods depend on data density
- With LBS, density based clustering allowing for noise is often best, but can sometimes augmented with heading, etc.

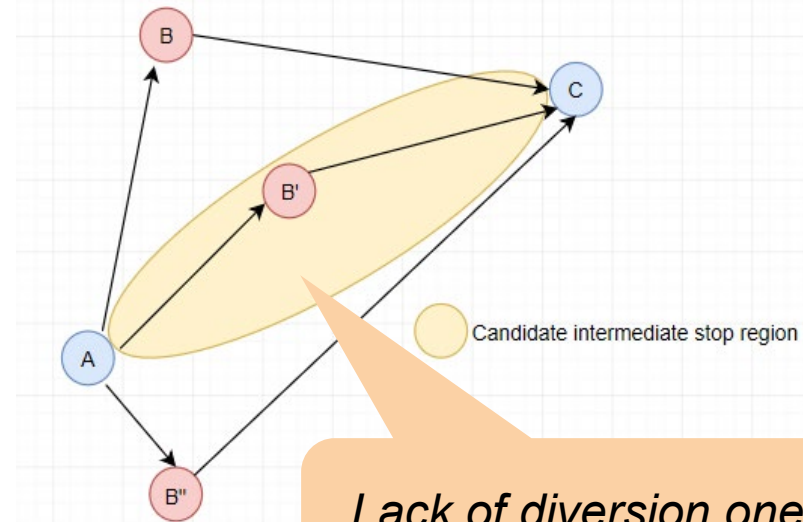
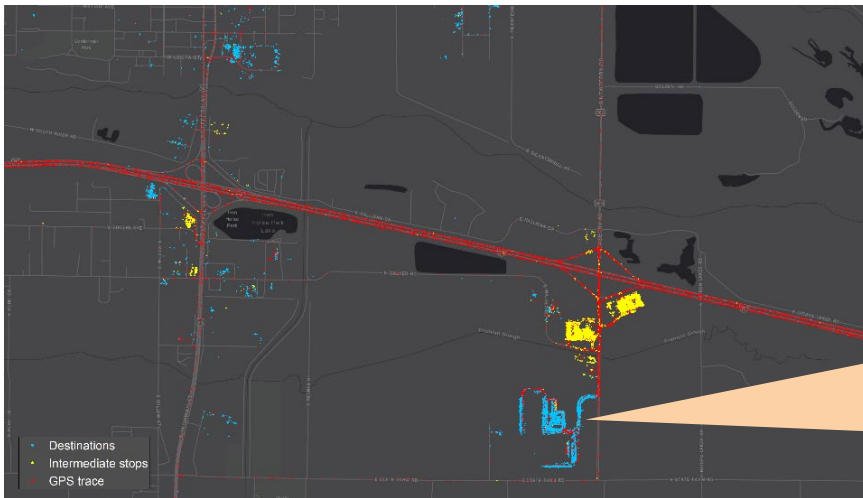


Graph Theory for Residence, Work Imputation

Topological centrality as primary indicator, overruling secondary – higher confidence, multi-point fusion



Filtering Intermediate Stops on Long Trips



Lack of diversion one distinguishing mark

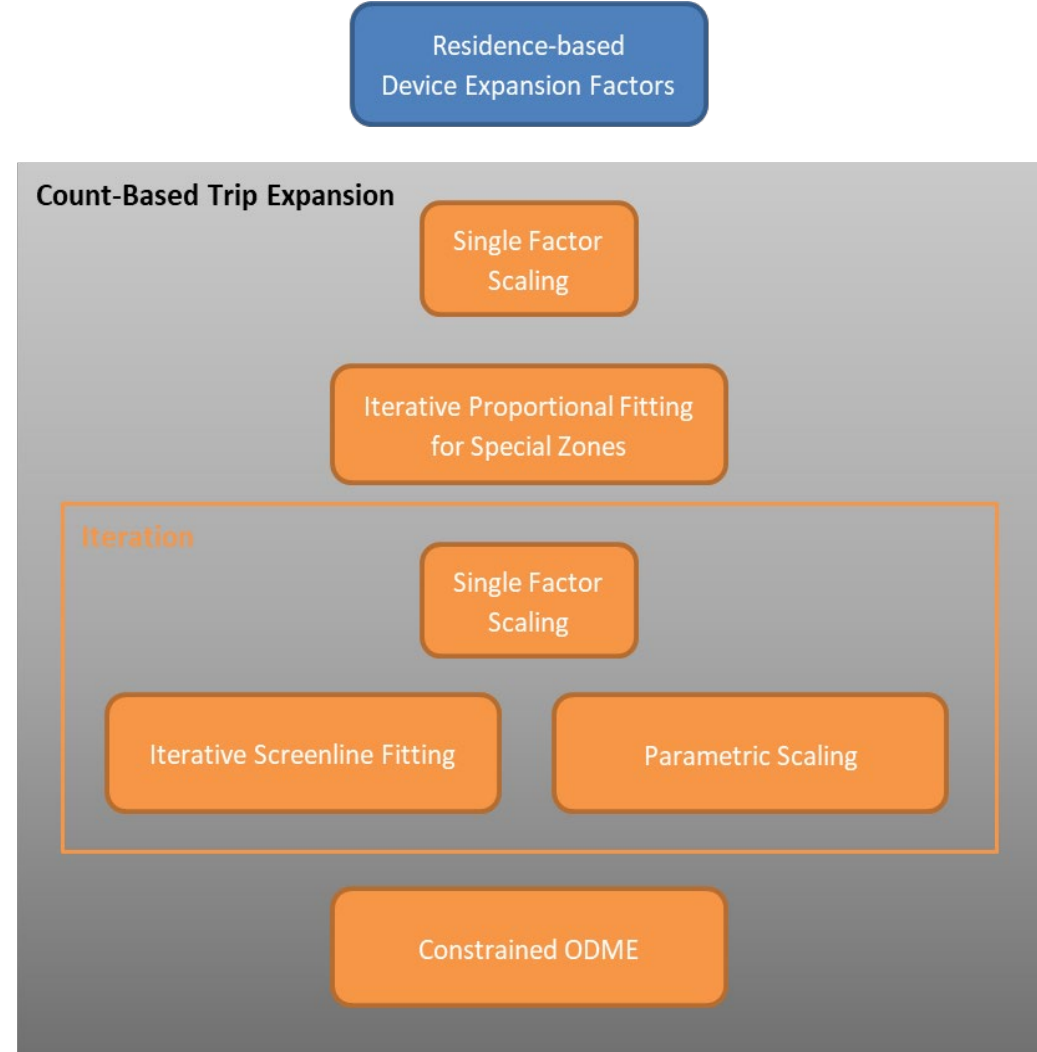
Geofencing around gas stations / truck stops, etc.

Filtering stops for fuel, food, etc., necessary for understanding actual long-distance OD demand for both passenger and freight flows



Data Expansion

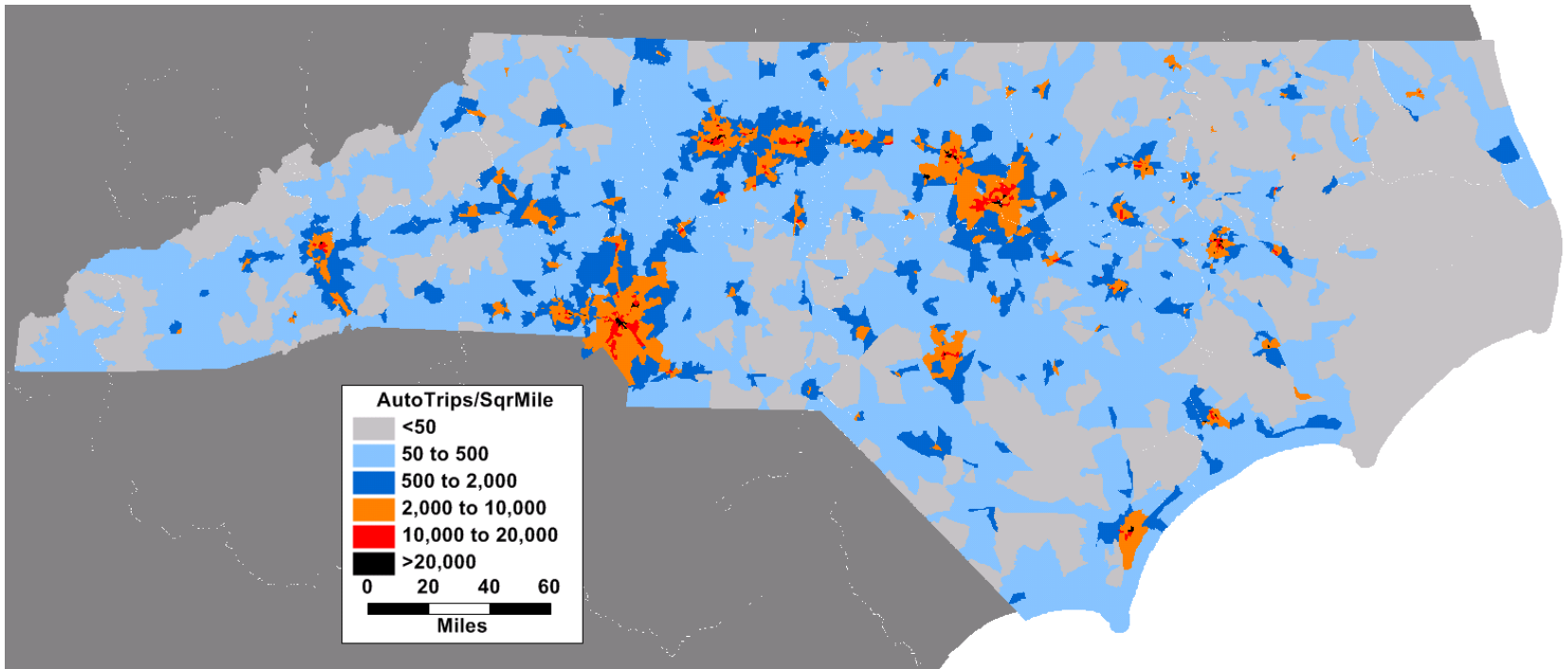
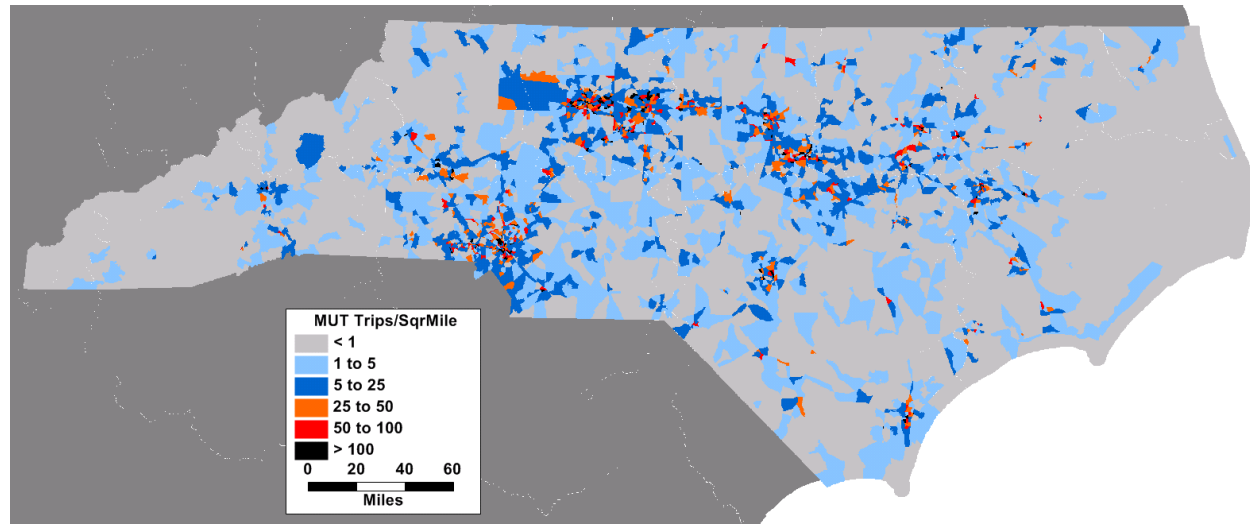
- Multi-step, ensemble method
- Starting with Census-based
- Followed by count-based



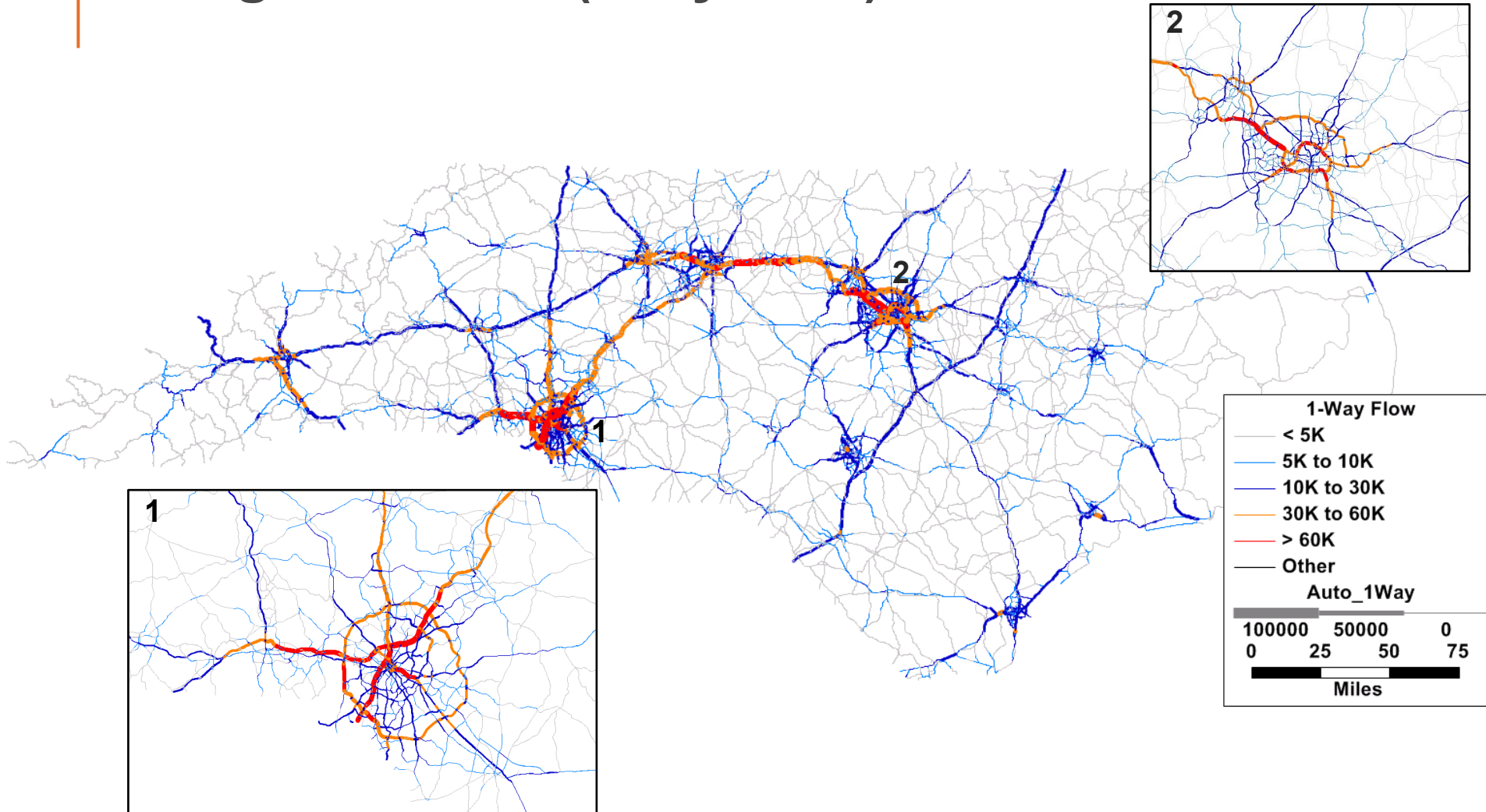


Results & Visualization

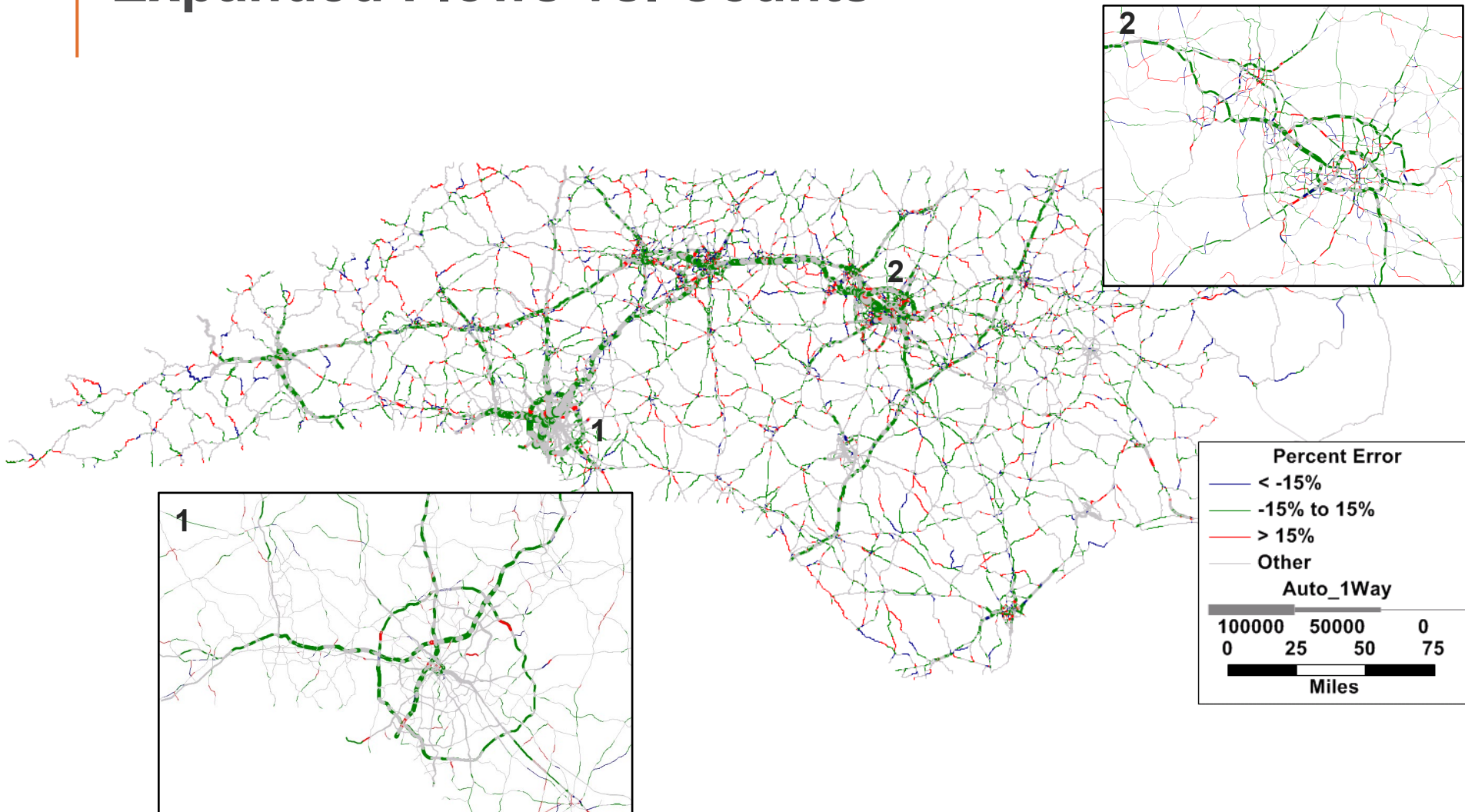
Auto & Truck Expansion



Assigned Flows (daily total)



Expanded Flows vs. Counts



Expansion Validation

- Substantially better fit to counts than previous versions

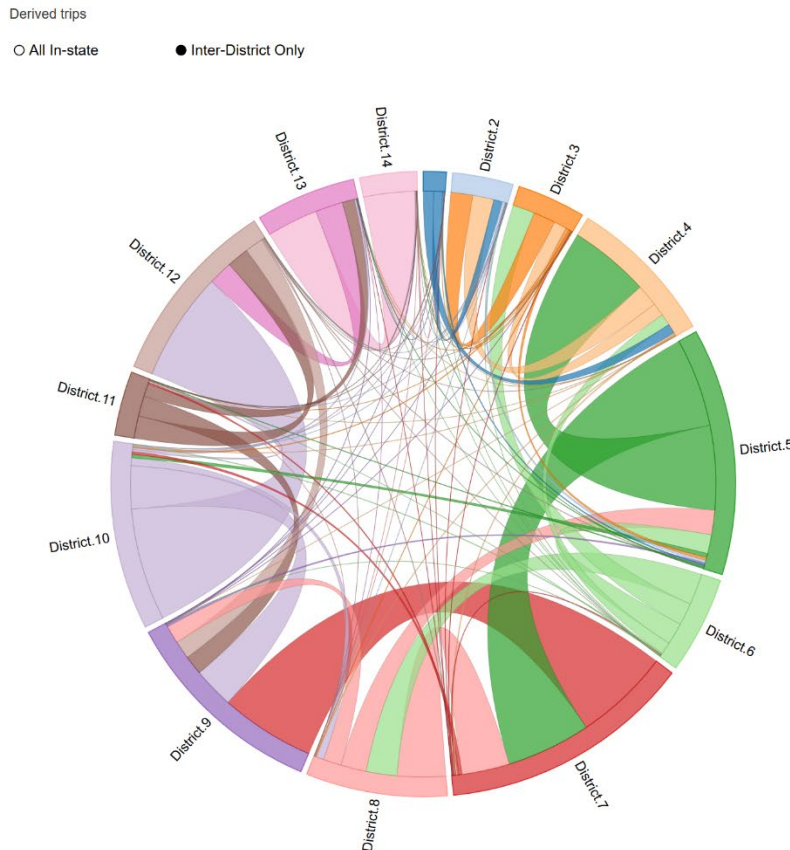
Volume Group	Number of Counts	Overall %RMSE	MU Truck %RMSE
<10K	5153	41.5%	99.6%
10K to 20K	2669	24.2%	62.6%
20K to 40K	1184	16.0%	37.8%
40K to 60K	259	10.4%	24.9%
>60K	175	7.2%	15.5%
Total	9440	23.8%	56.4%

Interstates & Freeways	Counts	Observed VMT	Model VMT	% Deviation
I-240	19	341,810	346,197	1.3%
I-26	27	1,694,770	1,671,445	-1.4%
I-277	19	302,789	282,958	-6.5%
I-40	346	15,617,968	15,821,143	1.3%
I-440	26	1,039,616	1,010,675	-2.8%
I-485	55	3,675,899	3,674,848	0.0%
I-540	26	1,497,812	1,554,591	3.8%
I-73	19	461,074	455,194	-1.3%
I-74	50	724,192	759,087	4.8%
I-77	71	2,955,802	2,998,491	1.4%
I-795	18	362,627	367,907	1.5%
I-85	211	8,277,974	8,314,057	0.4%
I-95	110	5,351,000	5,333,463	-0.3%
NC-147	32	442,181	474,416	7.3%
NC-295	7	285,268	285,358	0.0%
NC-54	7	59,746	50,736	-15.1%
NC-540	36	327,524	337,163	2.9%
NC-67	5	144,265	163,550	13.4%
SR-1728	8	125,152	118,016	-5.7%
SR-2085	5	109,624	87,190	-20.5%
SR-2254	10	149,049	154,311	3.5%
US-1	44	655,022	661,208	0.9%
US-17	21	279,752	295,607	5.7%
US-19	18	410,828	413,659	0.7%
US-29	23	425,601	409,414	-3.8%
US-311	33	523,278	565,107	8.0%
US-321	25	503,847	516,793	2.6%
US-421	26	299,205	293,225	-2.0%
US-52	53	886,225	904,412	2.1%
US-64	46	991,176	958,956	-3.3%
US-70	15	198,917	216,689	8.9%
US-74	30	320,525	318,832	-0.5%
Total	1474	49,908,476	50,263,374	0.7%



Inter-District OD Flows

Derived trips, by Origins and Destinations



Charlotte Out-of-Home Activity



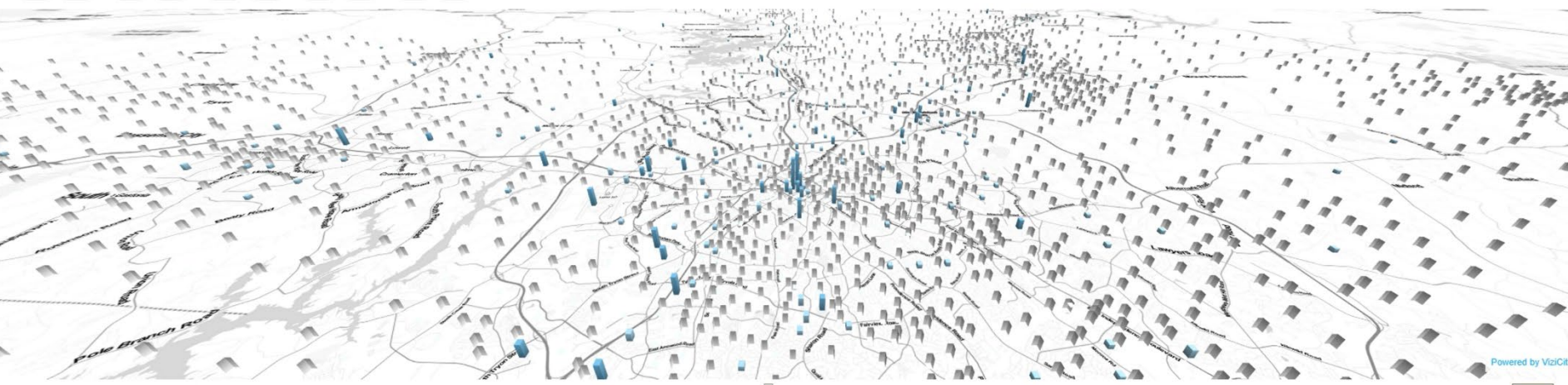
PERSONS NOT AT HOME 3 am

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles

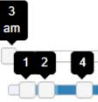


Powered by Viz/Cities

N/A



Opacity: 100



Cycle Through Day

Redraw every 1 sec



Charlotte Out-of-Home Activity



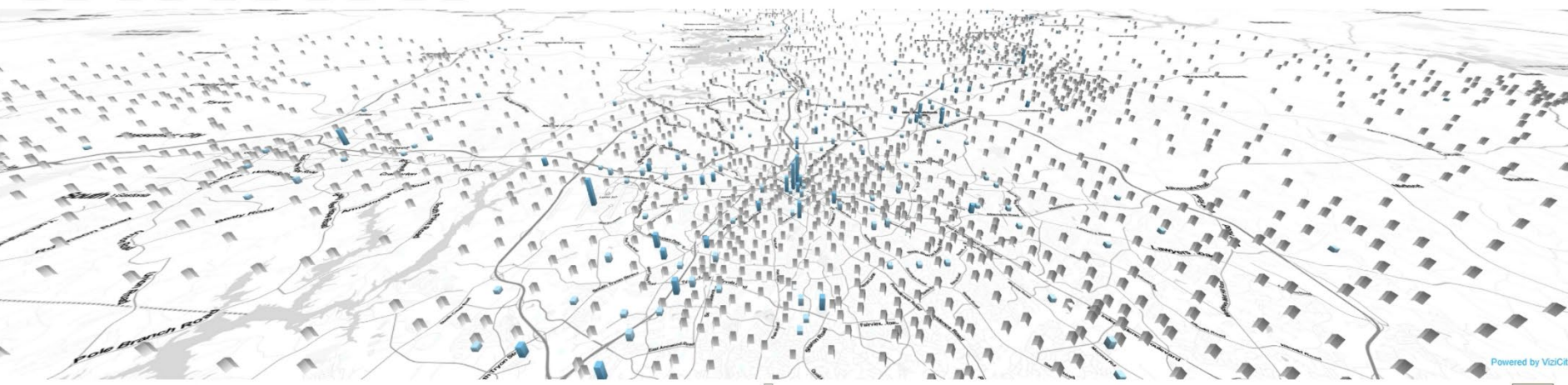
PERSONS NOT AT HOME 4 am

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Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



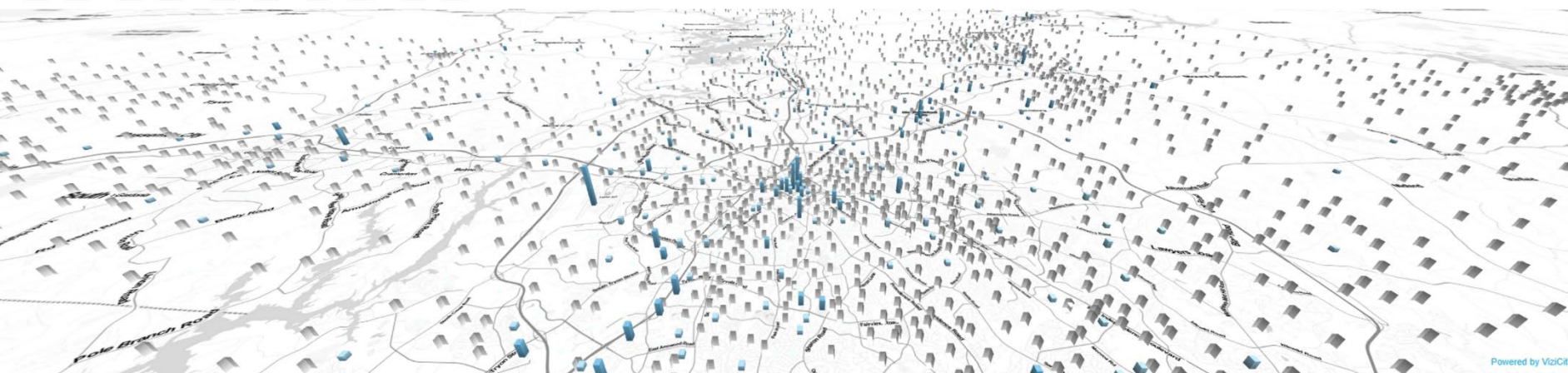
PERSONS NOT AT HOME 5 am

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Controls Centroids

Classification

Quartiles

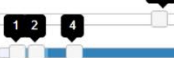


Powered by Viz/Cities



Opacity: 100

N/A



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



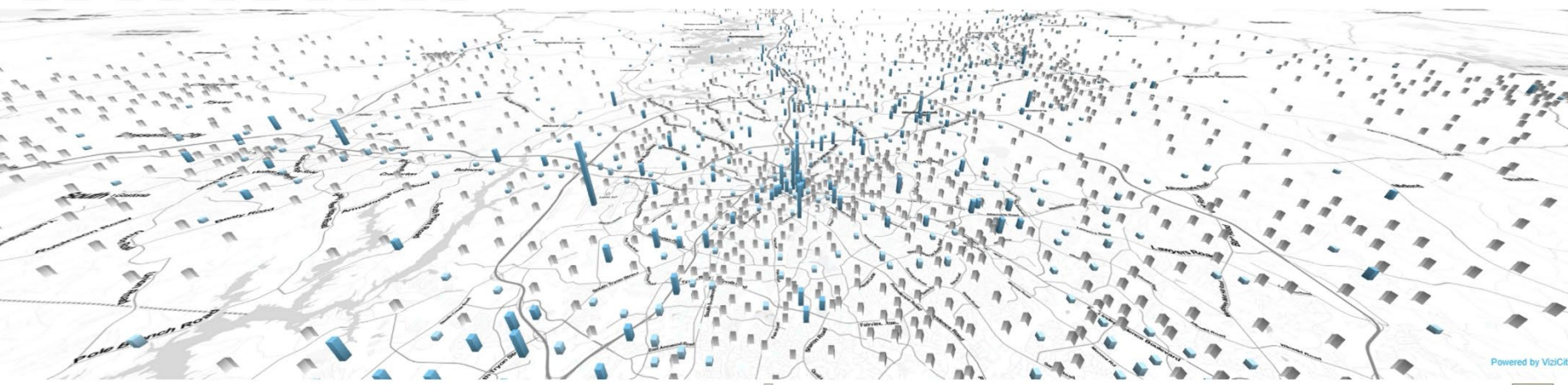
PERSONS NOT AT HOME 6 am

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Controls Centroids

Classification

Quartiles



Powered by VizCites

N/A



Opacity: 100



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



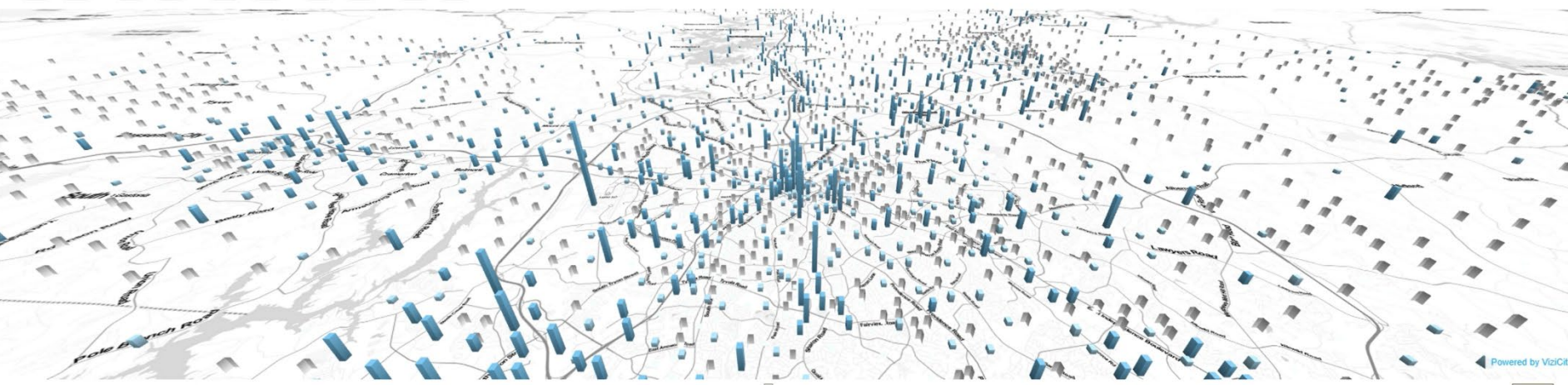
PERSONS NOT AT HOME 7 am

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100



7 am

Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



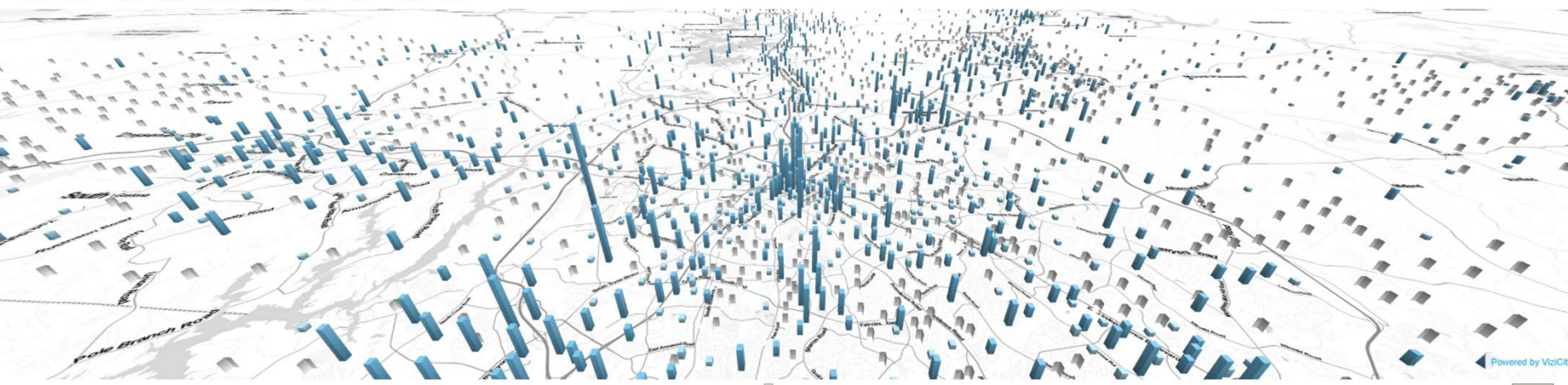
PERSONS NOT AT HOME 8 am

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by VizCities

N/A



Opacity: 100



8 am

Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



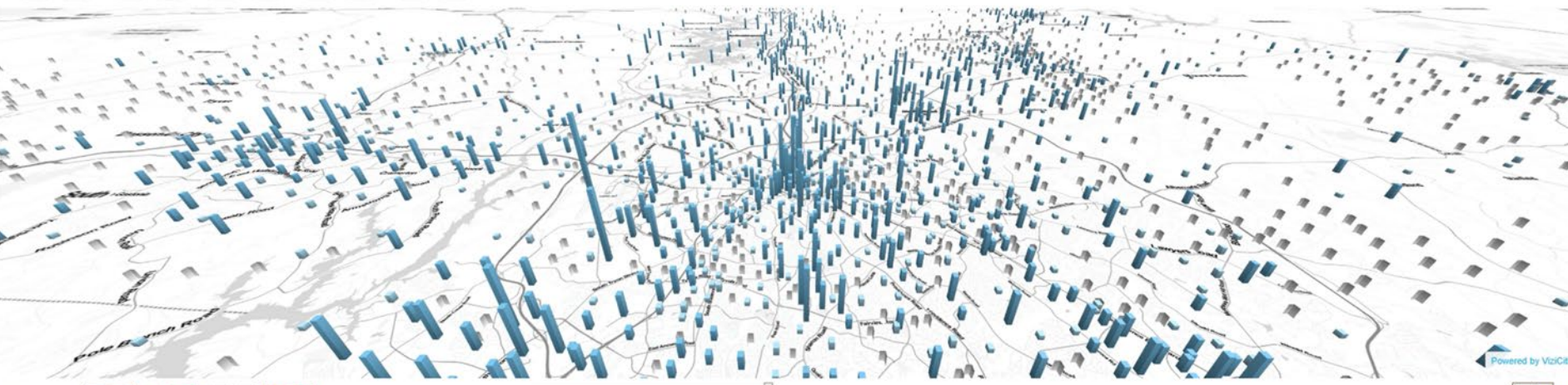
PERSONS NOT AT HOME 9 am

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by VizCiti

N/A



Opacity: 100

9 am



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



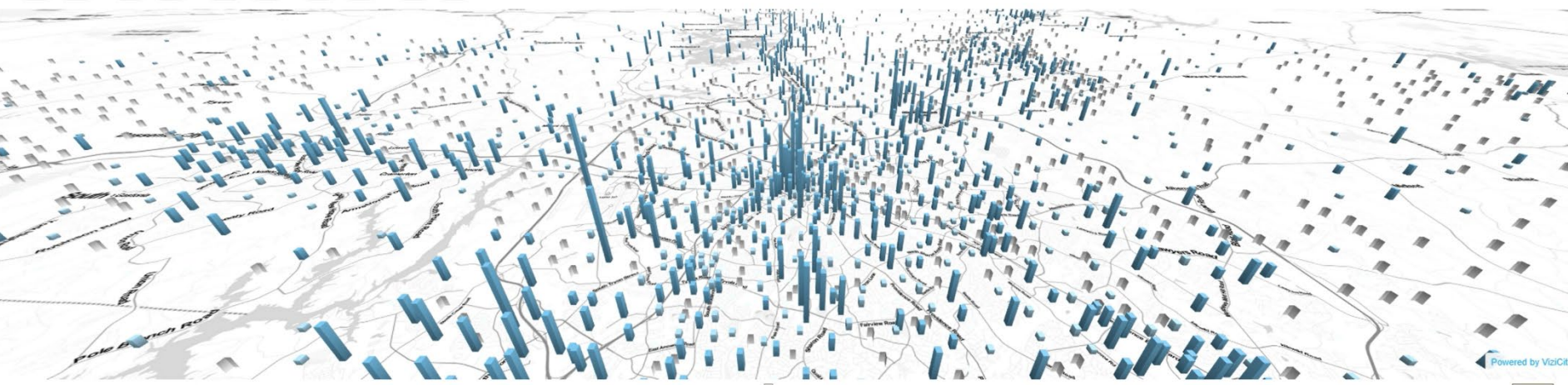
PERSONS NOT AT HOME 10 am

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Controls Centroids

Classification

Quartiles



Powered by VizCities

N/A



Opacity: 100

10 am



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



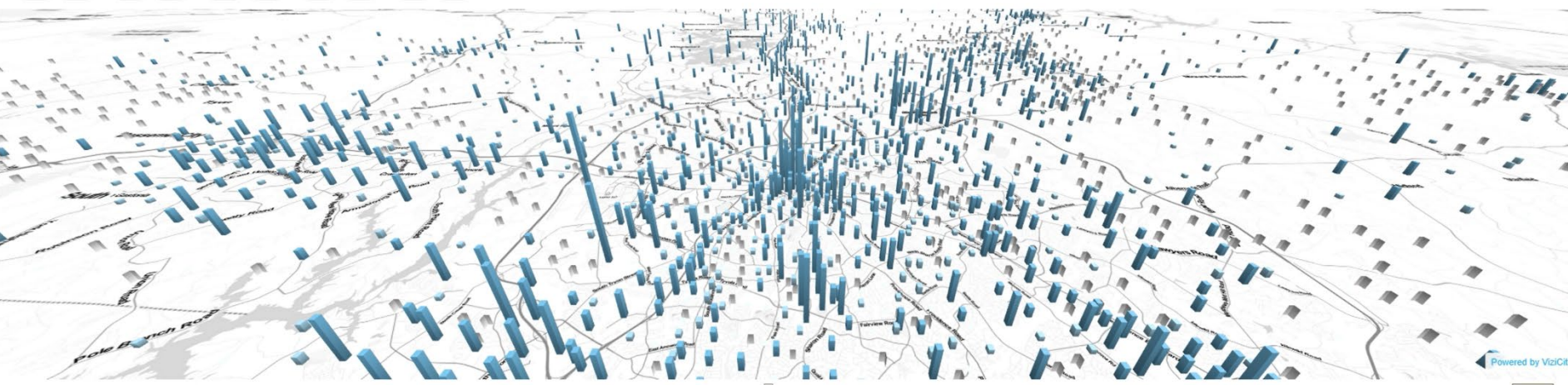
PERSONS NOT AT HOME 11 am

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Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100

11 am



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



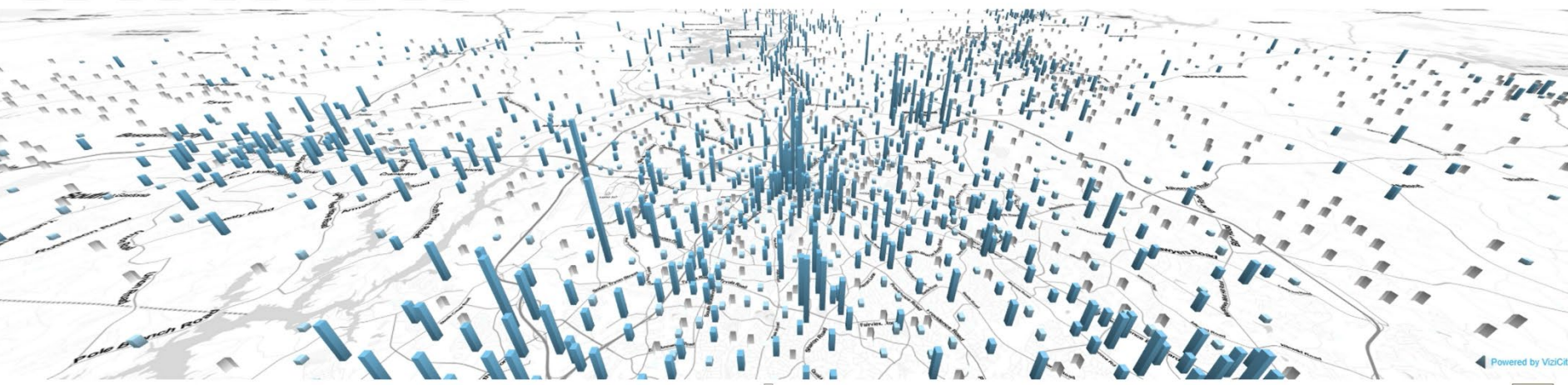
PERSONS NOT AT HOME 12 pm

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100

12 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



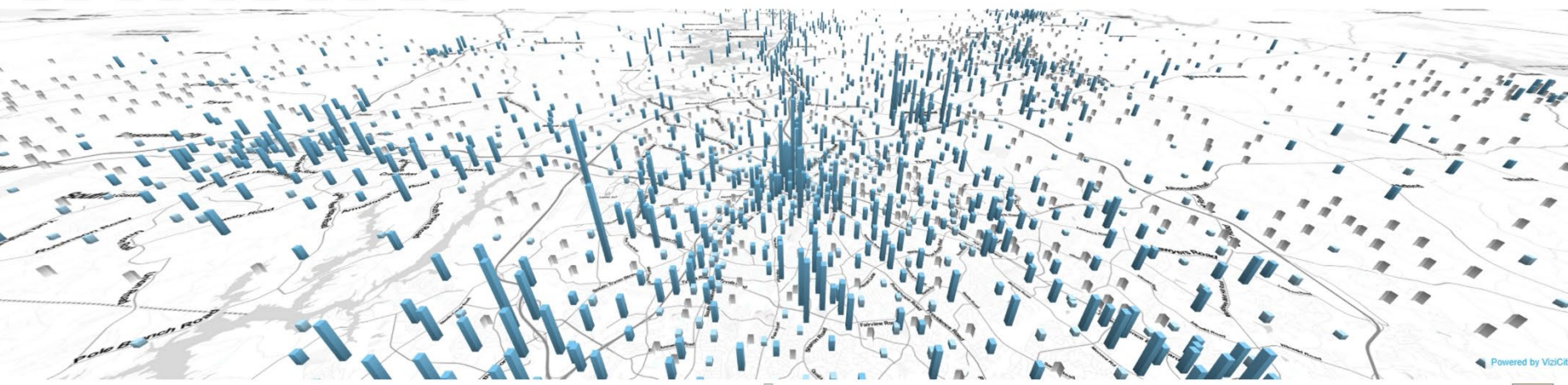
PERSONS NOT AT HOME 1 pm

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by VizCities

N/A



Opacity: 100

1 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



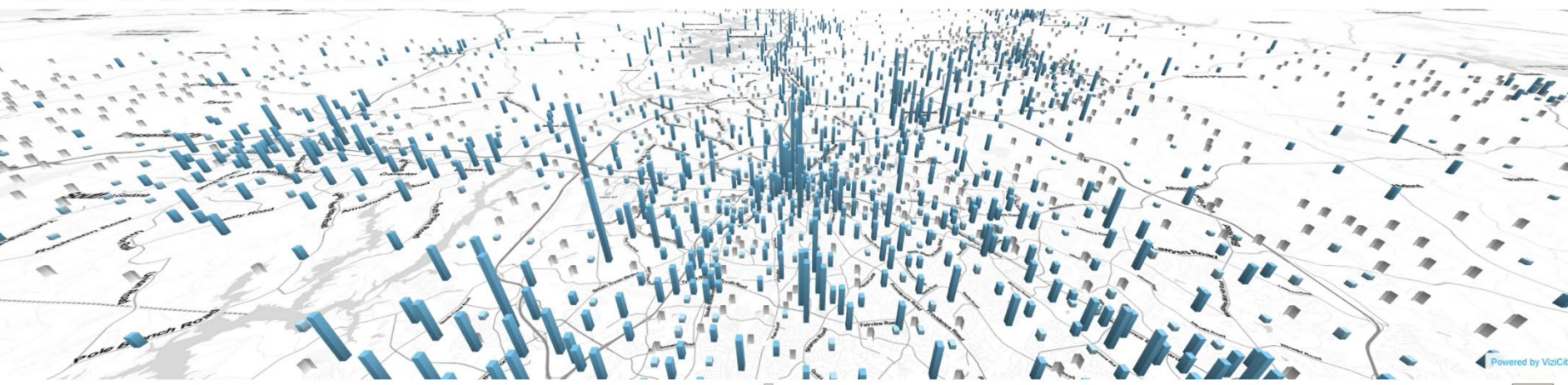
PERSONS NOT AT HOME 2 pm

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by VizCites

N/A



Opacity: 100

2 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



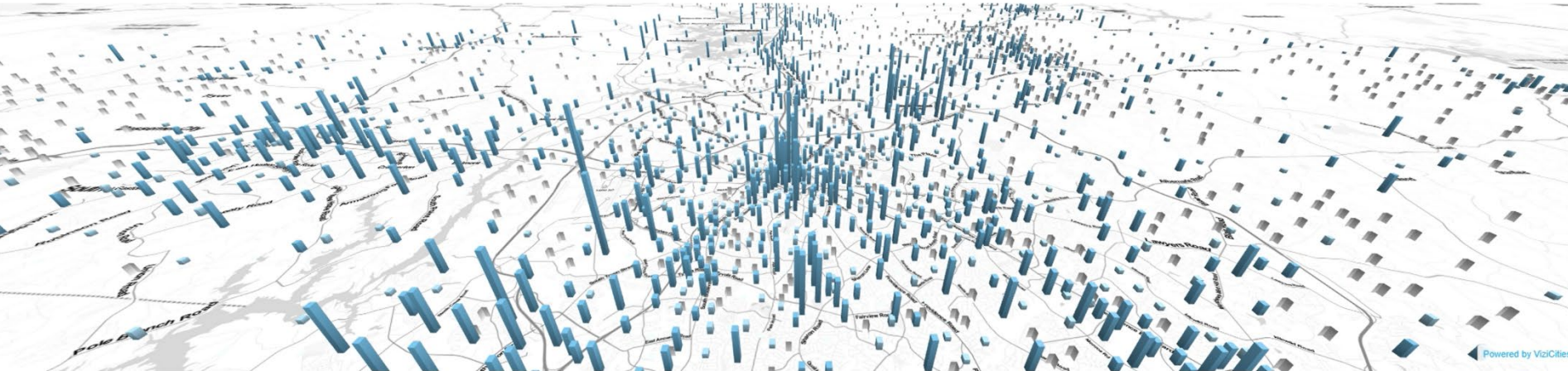
PERSONS NOT AT HOME 3 pm

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Controls Centroids

Classification

Quartiles



Powered by VizCities



Opacity: 100

N/A



3 pm

Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



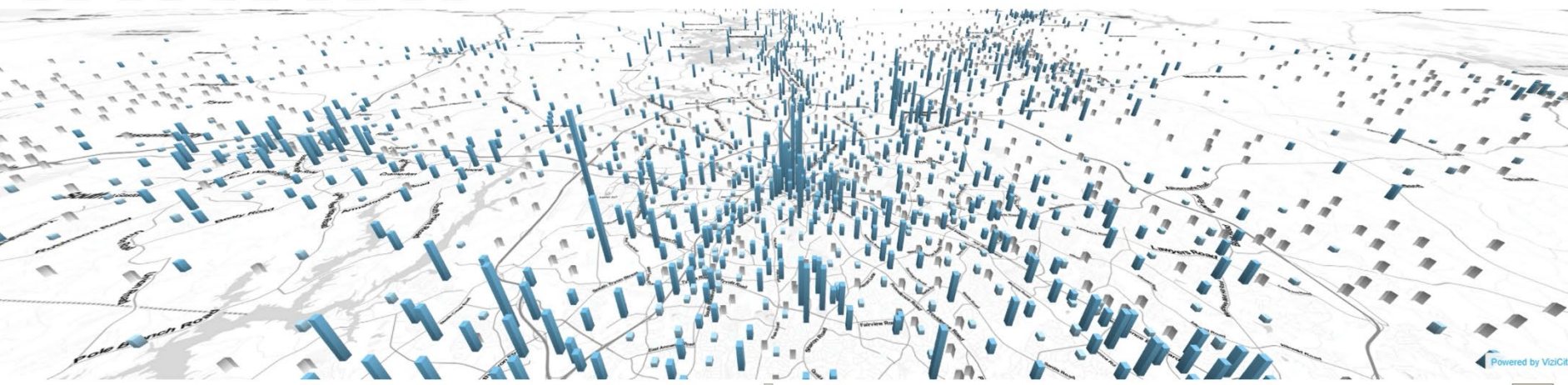
PERSONS NOT AT HOME 4 pm

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Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100

4 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



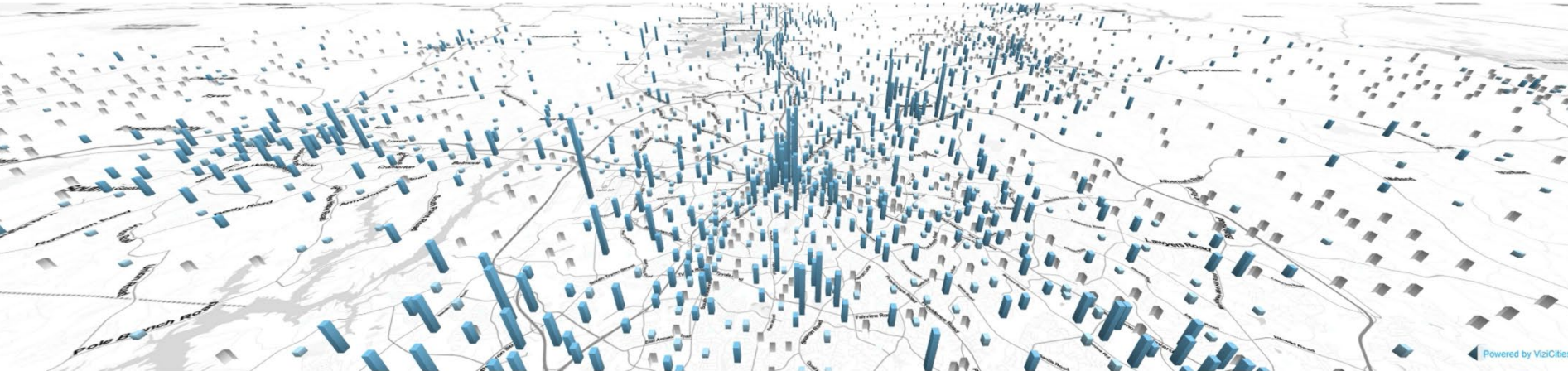
PERSONS NOT AT HOME 5 pm

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Controls Centroids

Classification

Quartiles



Powered by VizCites

N/A



Opacity: 100

5 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



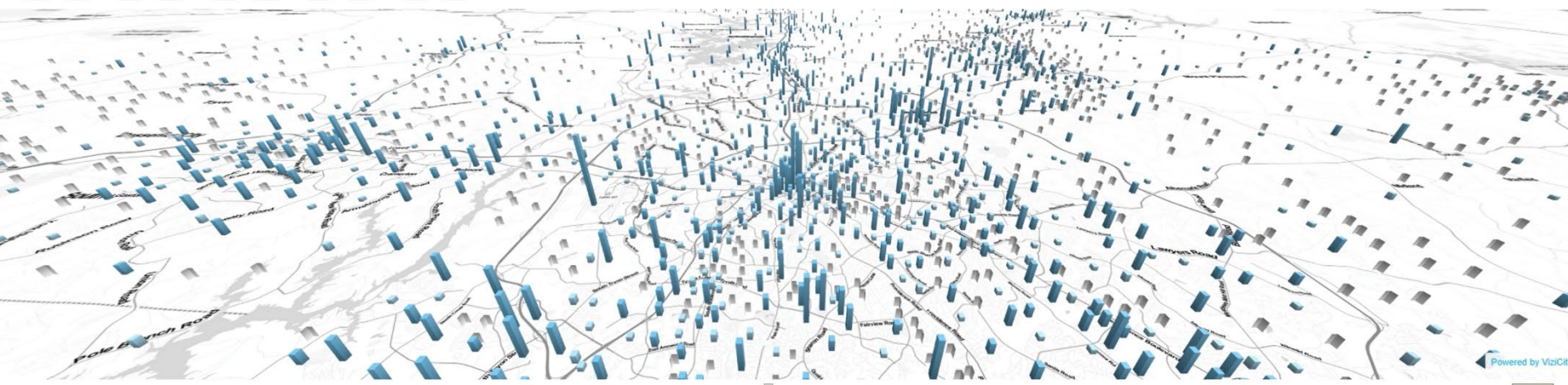
PERSONS NOT AT HOME 6 pm

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Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100

6 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



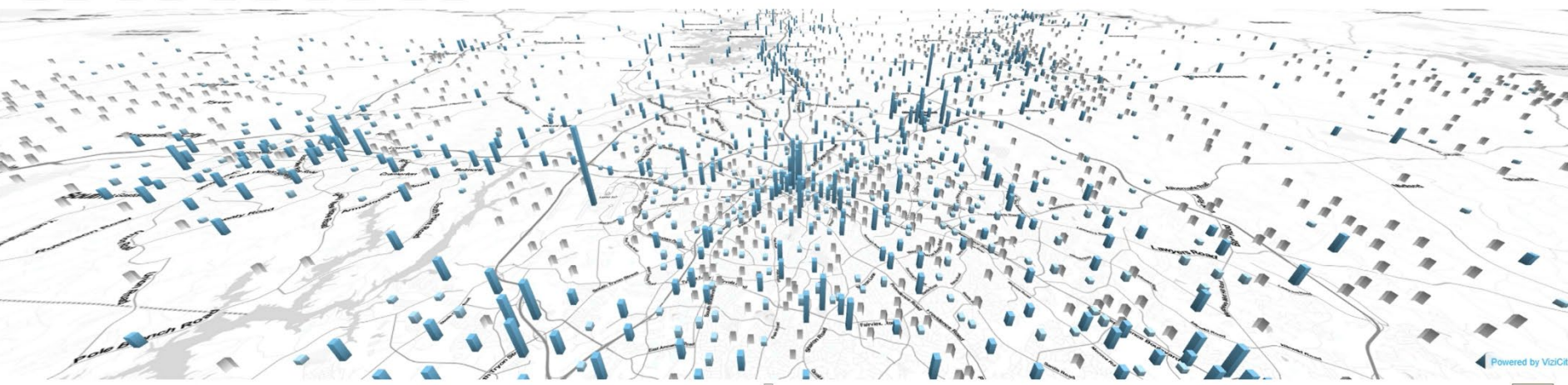
PERSONS NOT AT HOME 7 pm

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Controls Centroids

Classification

Quartiles



Powered by Viz|Cities



Opacity: 100

N/A



7 pm

Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



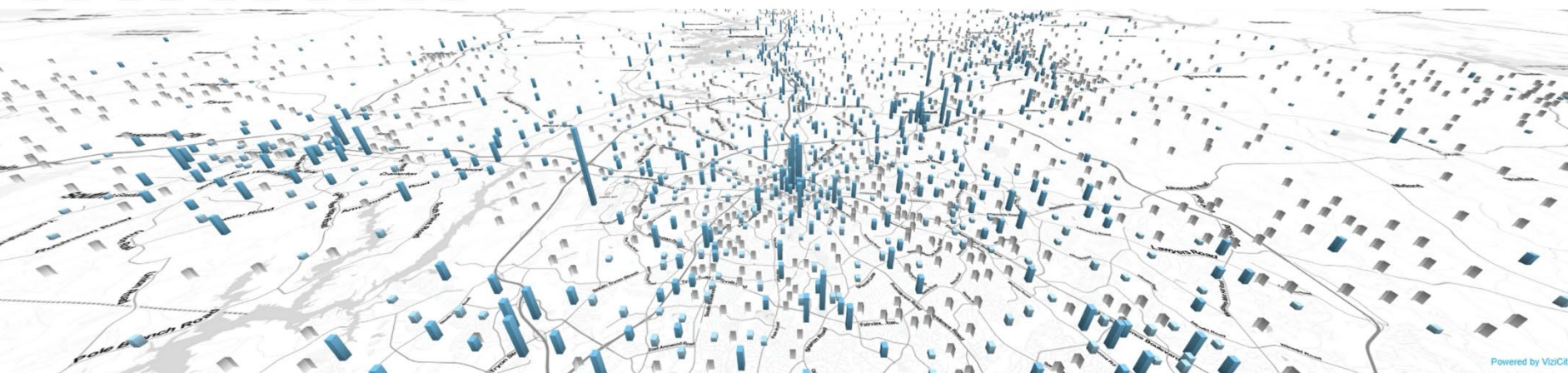
PERSONS NOT AT HOME 8 pm

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by Viz/Cities



Opacity: 100

N/A



8 pm

Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



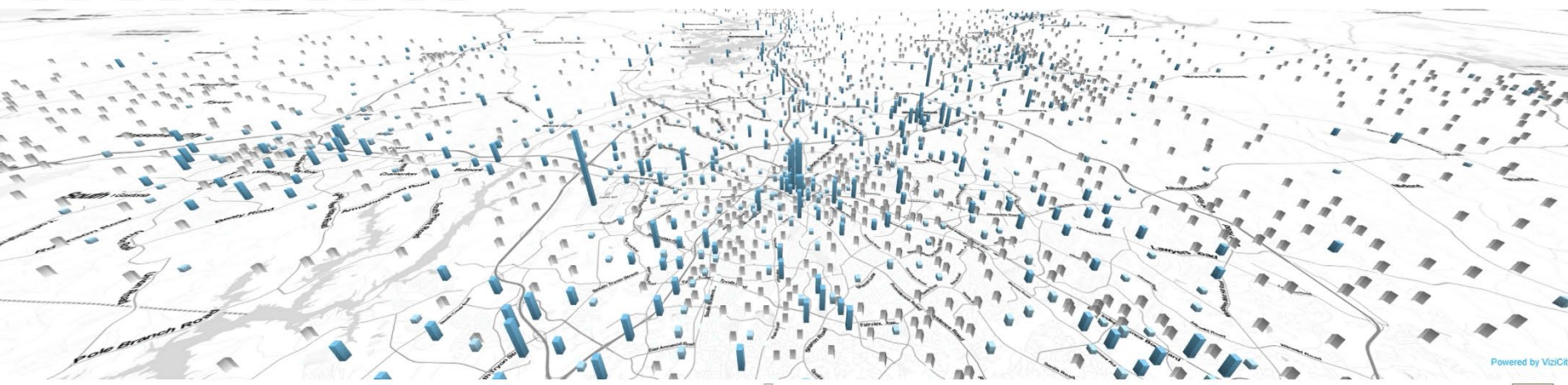
PERSONS NOT AT HOME 9 pm

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Controls Centroids

Classification

Quartiles



Powered by Viz/Cities



Opacity: 100

N/A



9 pm

Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



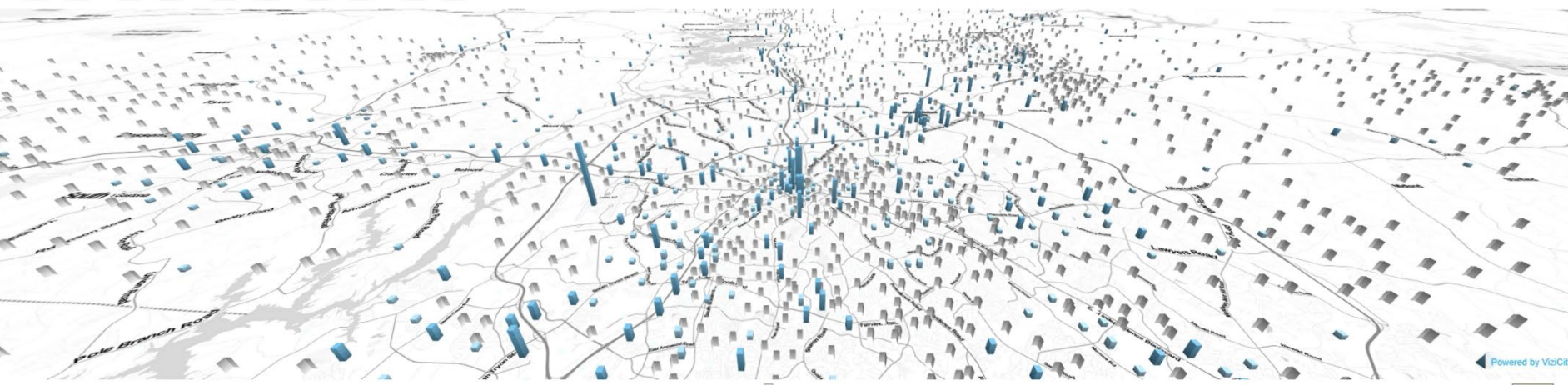
PERSONS NOT AT HOME 10 pm

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Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100

10 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



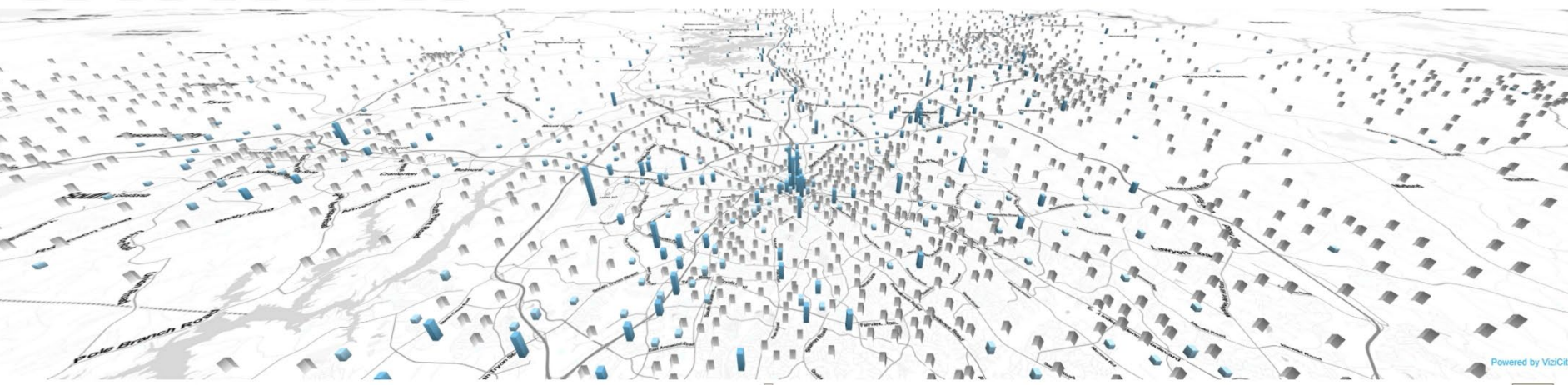
PERSONS NOT AT HOME 11 pm

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by Viz/Cities

N/A



Opacity: 100

11 pm



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



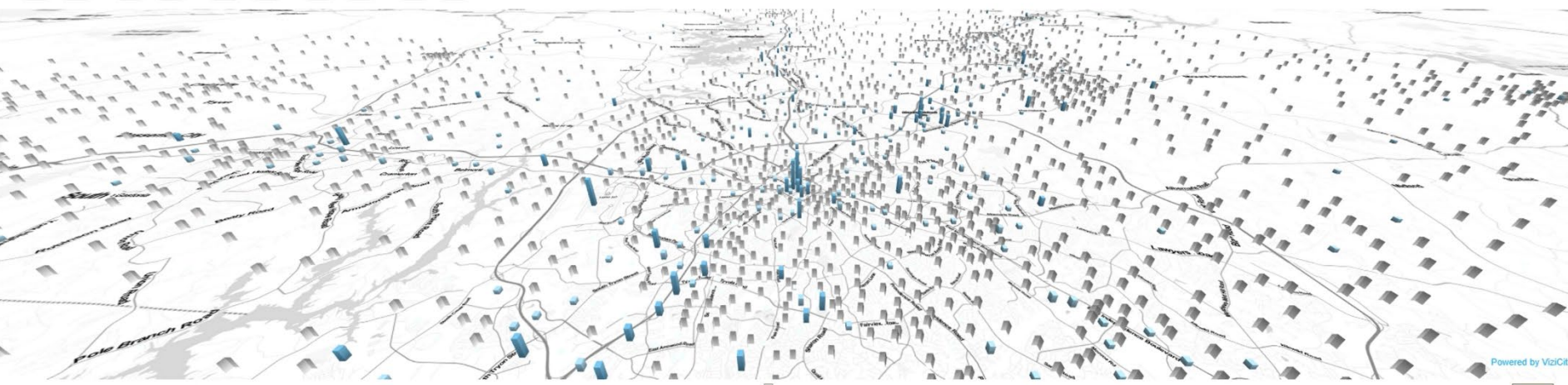
PERSONS NOT AT HOME 12 am

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by Viz/Cities



Opacity: 100

N/A

12 am



Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



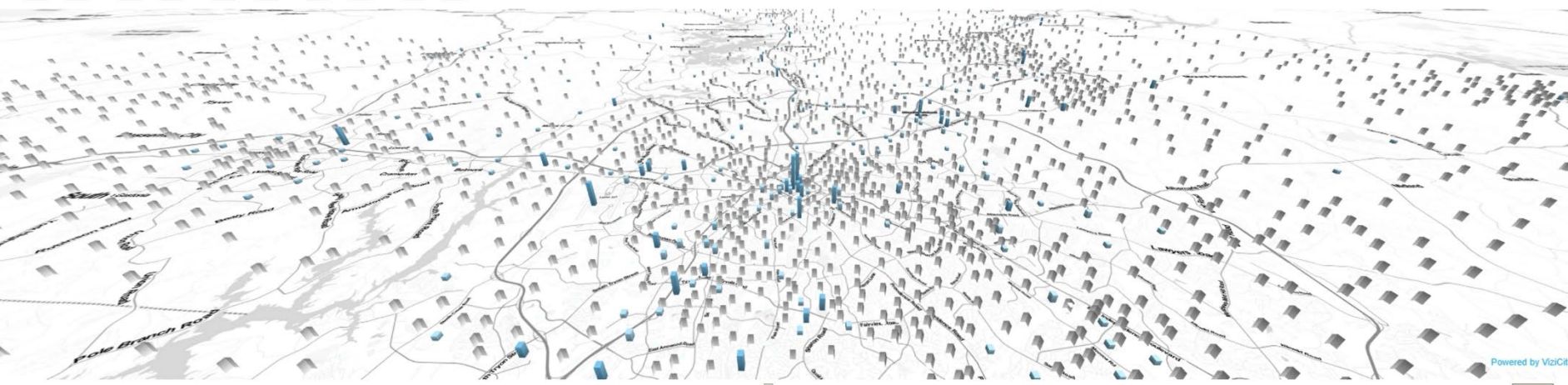
PERSONS NOT AT HOME 1 am

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by Viz/Cities



Opacity: 100

N/A



1 am

Stop Cycle

Redraw every 1 sec



Charlotte Out-of-Home Activity



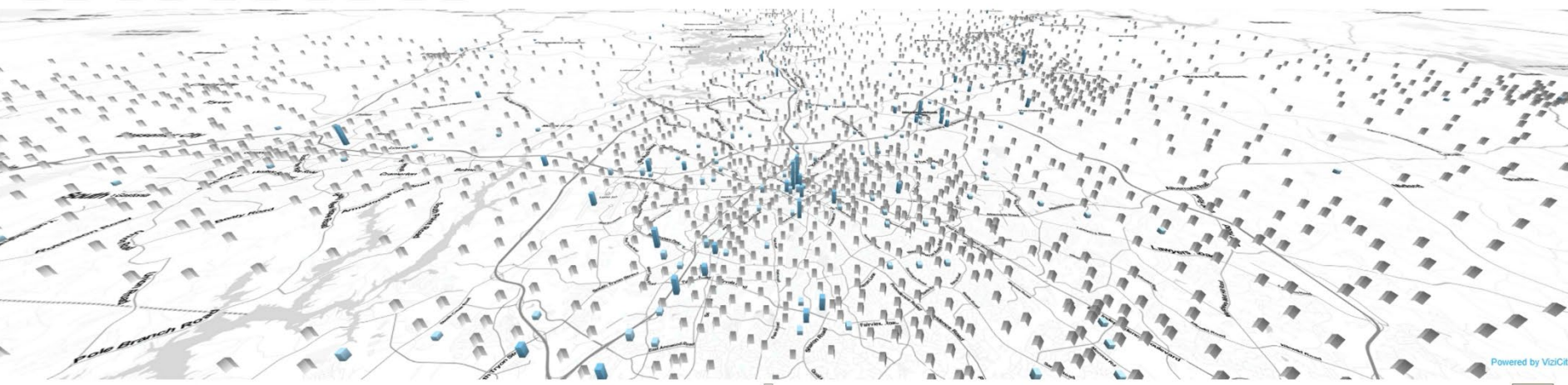
PERSONS NOT AT HOME 2 am

The map displays the zonal data as choropleth polygon coloring and height. The coloring and height are relative to the max value over all periods.

Controls Centroids

Classification

Quartiles



Powered by Viz/Cities



Opacity: 100

N/A
2 am



Stop Cycle

Redraw every 1 sec



I-77 Flows



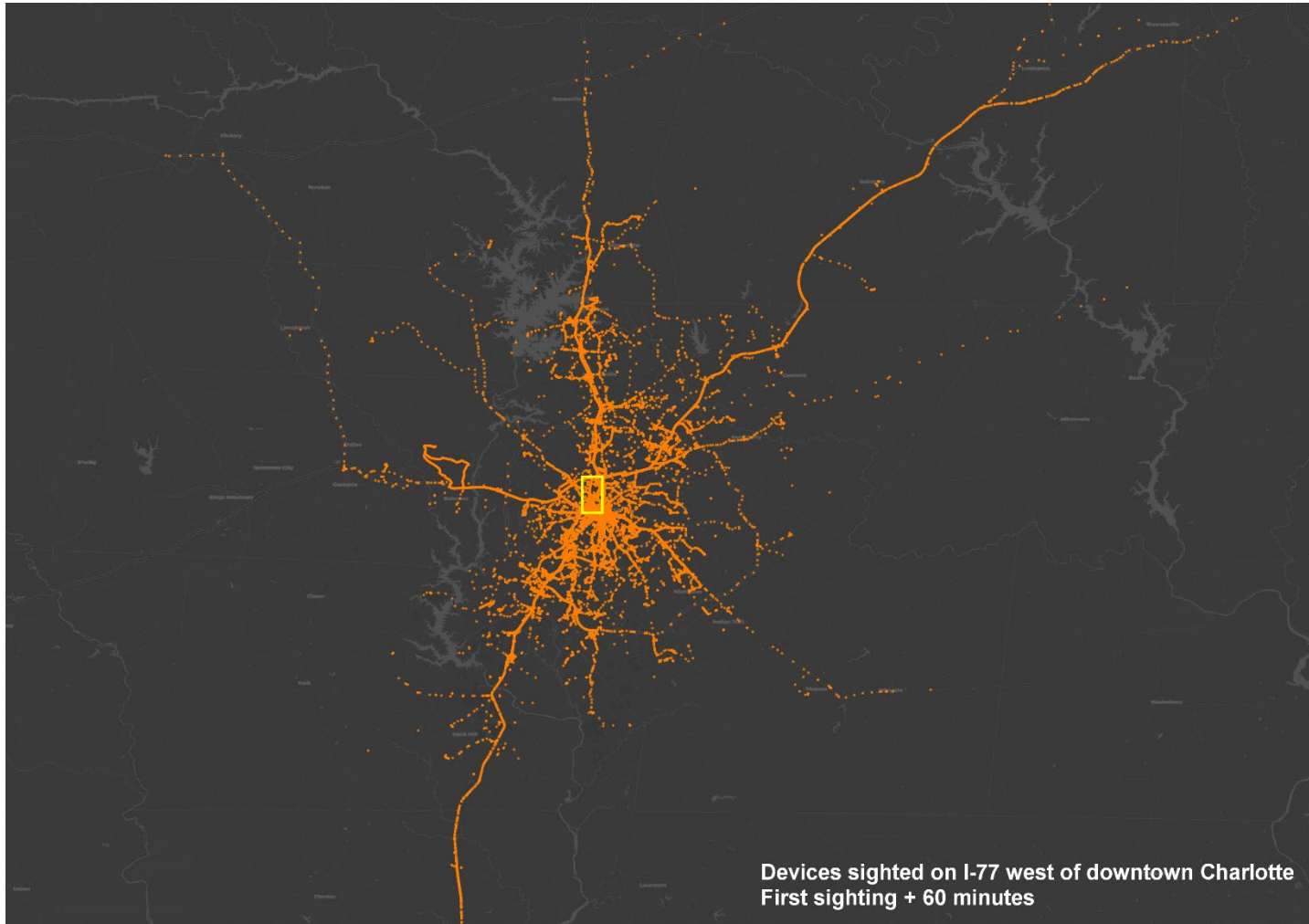
I-77 Flows



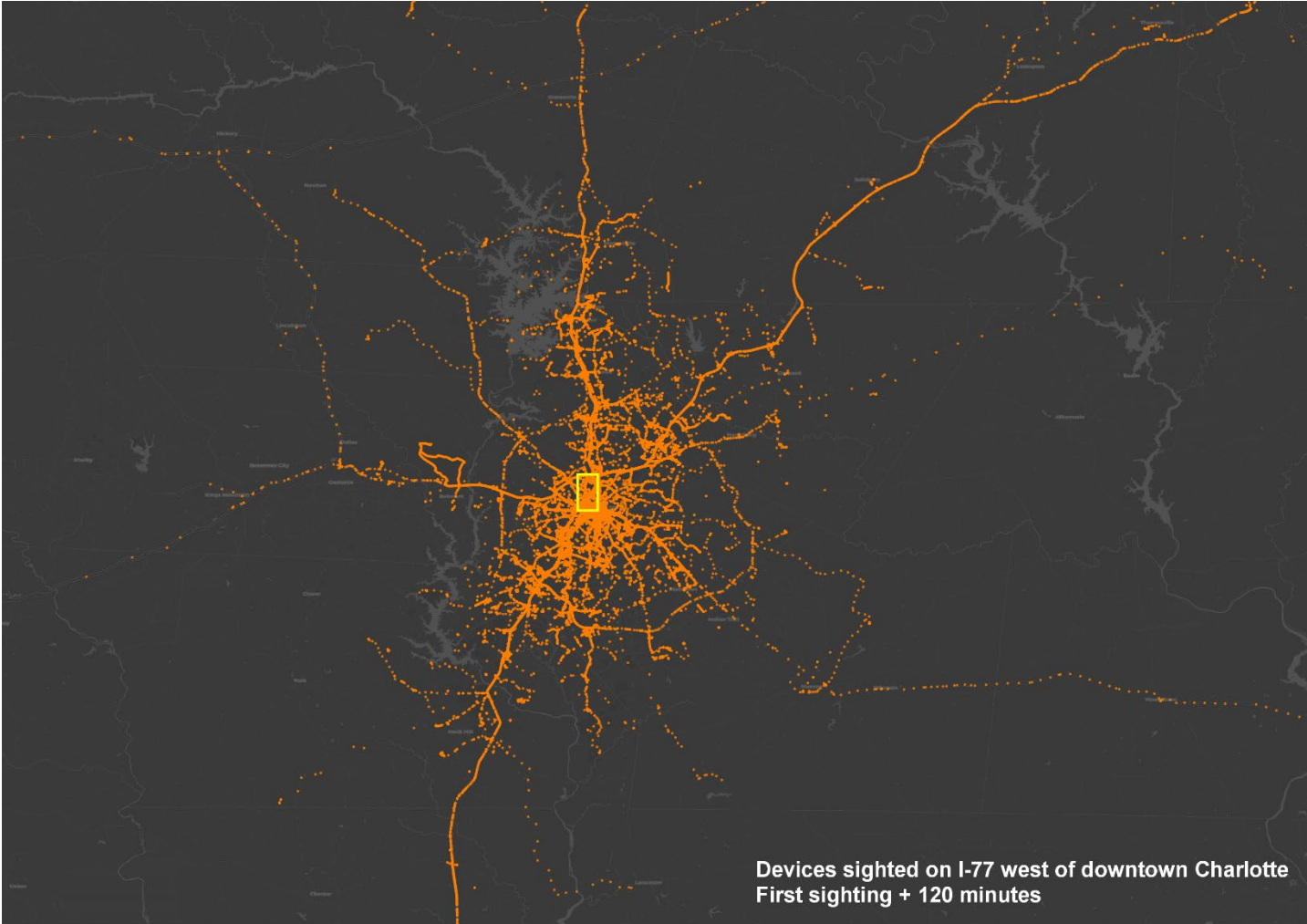
I-77 Flows



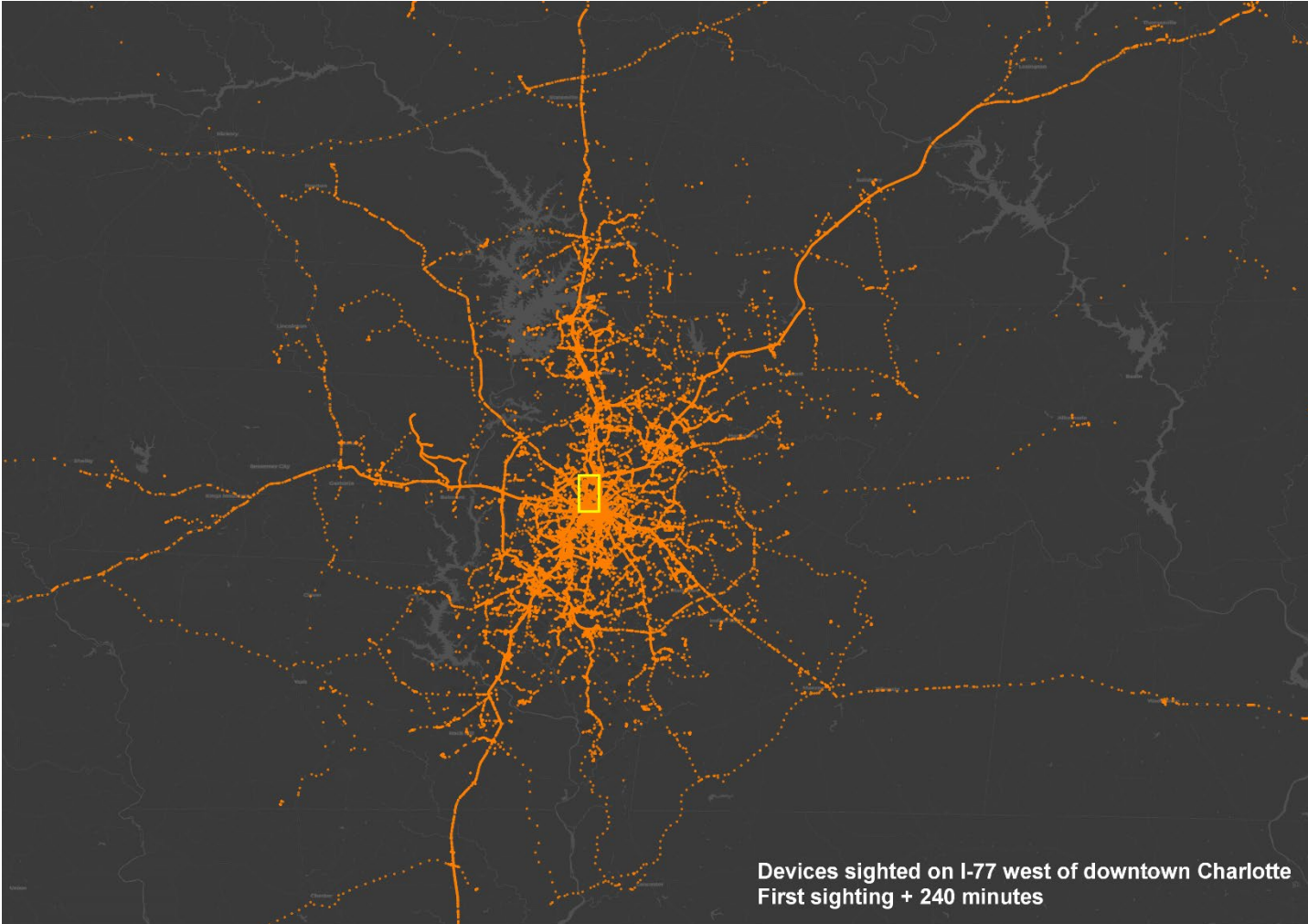
I-77 Flows



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I-77 Flows



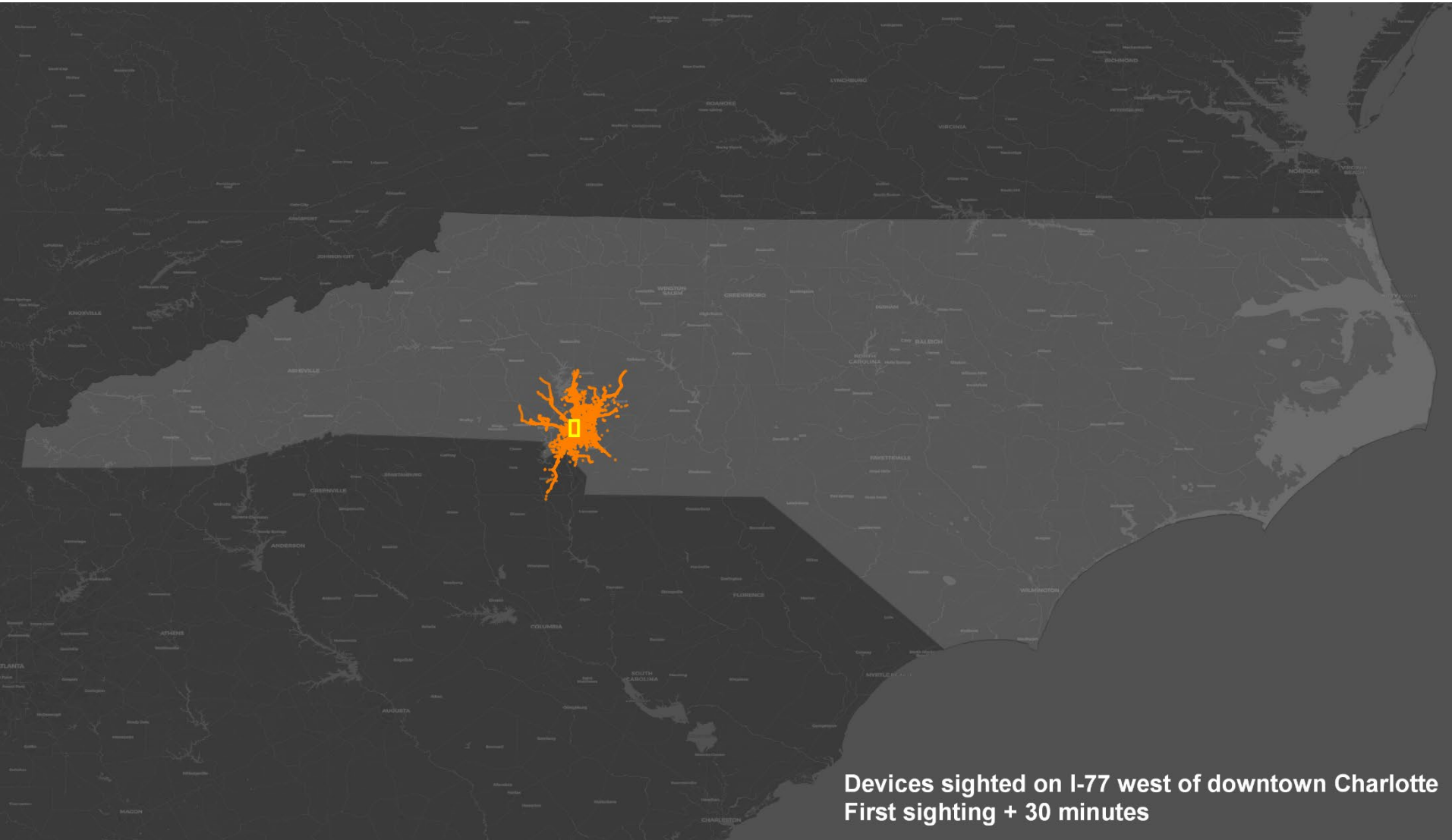
Devices sighted on I-77 west of downtown Charlotte
First sighting between 7-8am, weekday

I-77 Flows



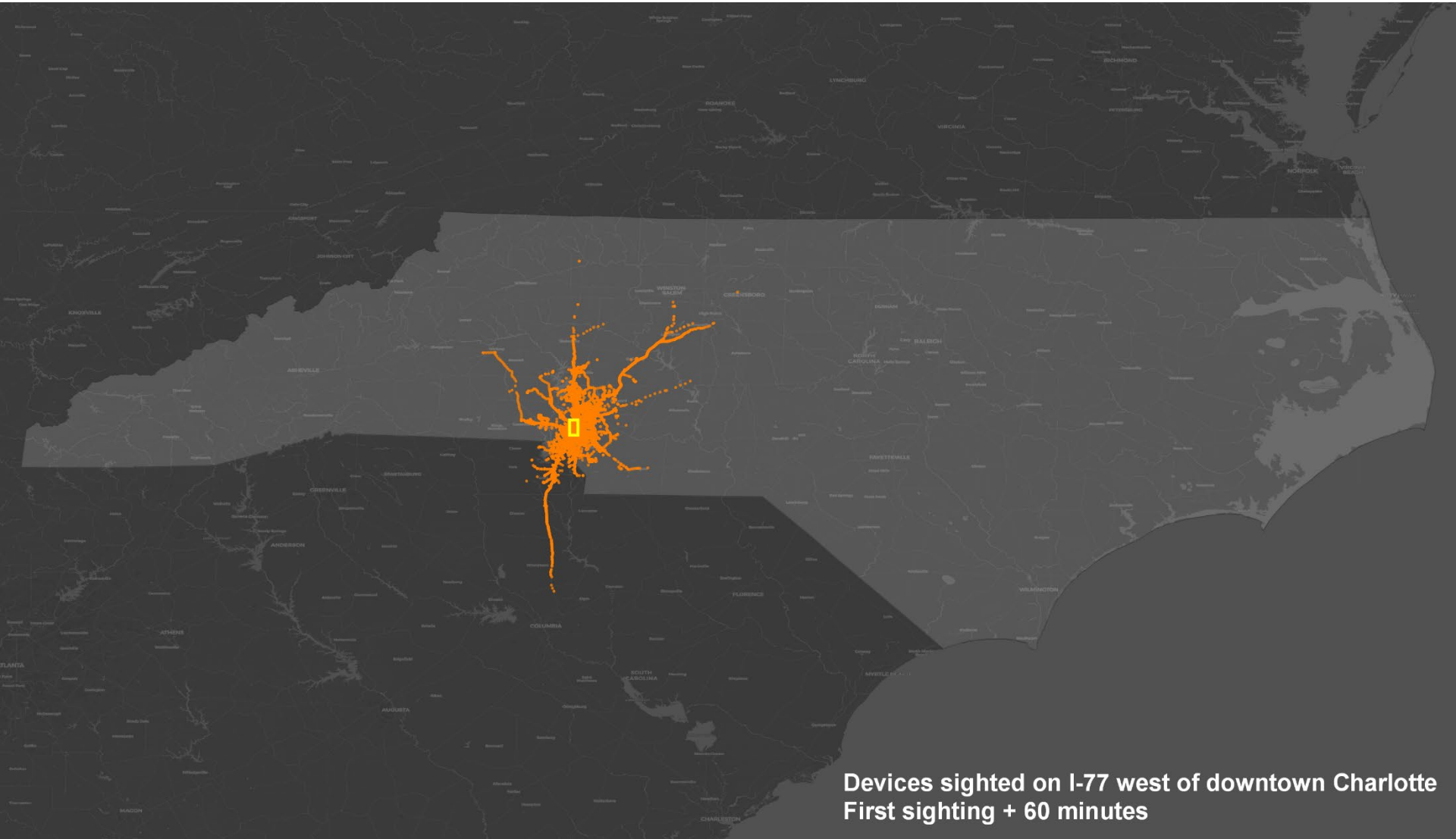
Devices sighted on I-77 west of downtown Charlotte
First sighting + 15 minutes

I-77 Flows



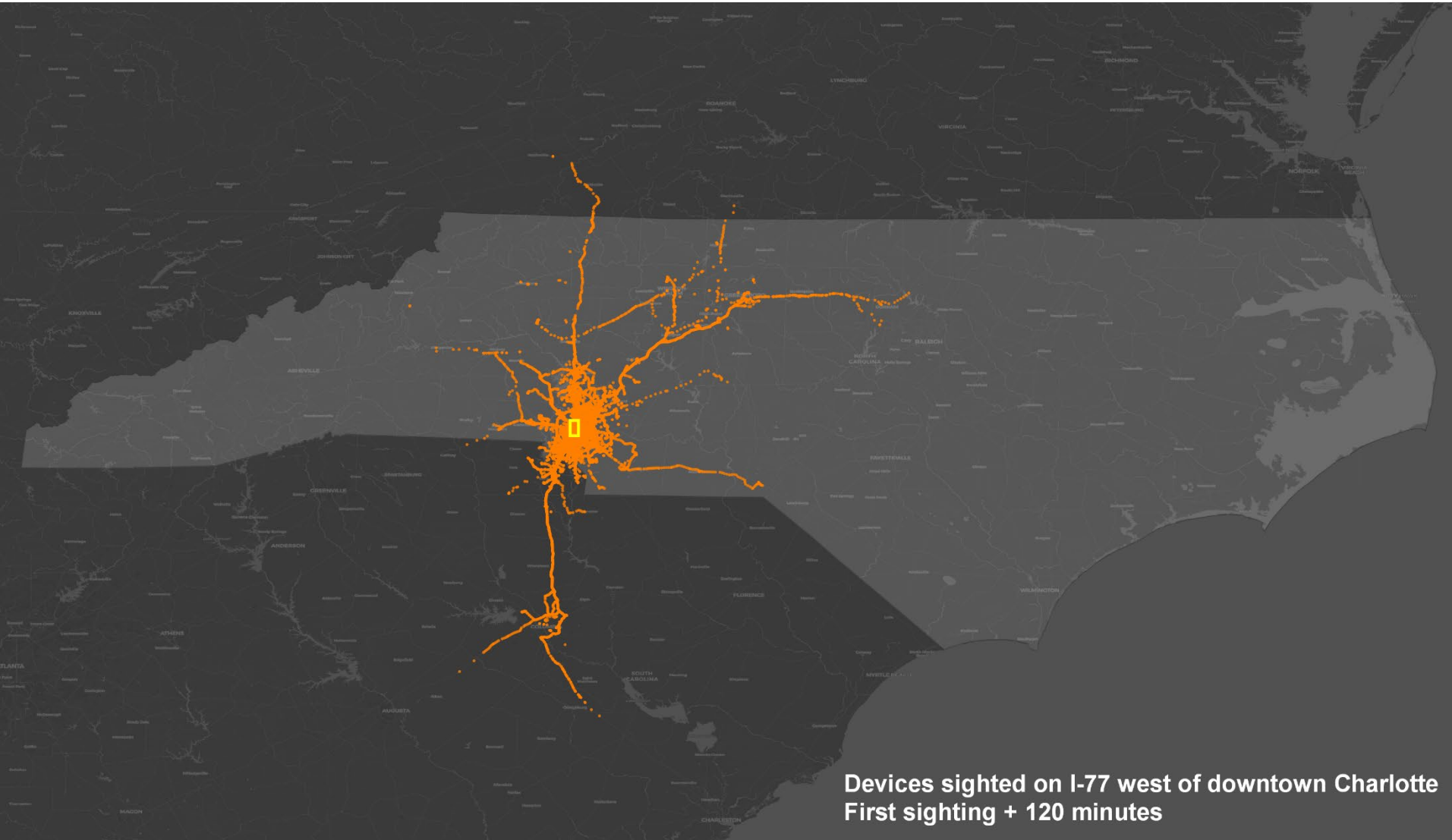
Devices sighted on I-77 west of downtown Charlotte
First sighting + 30 minutes

I-77 Flows



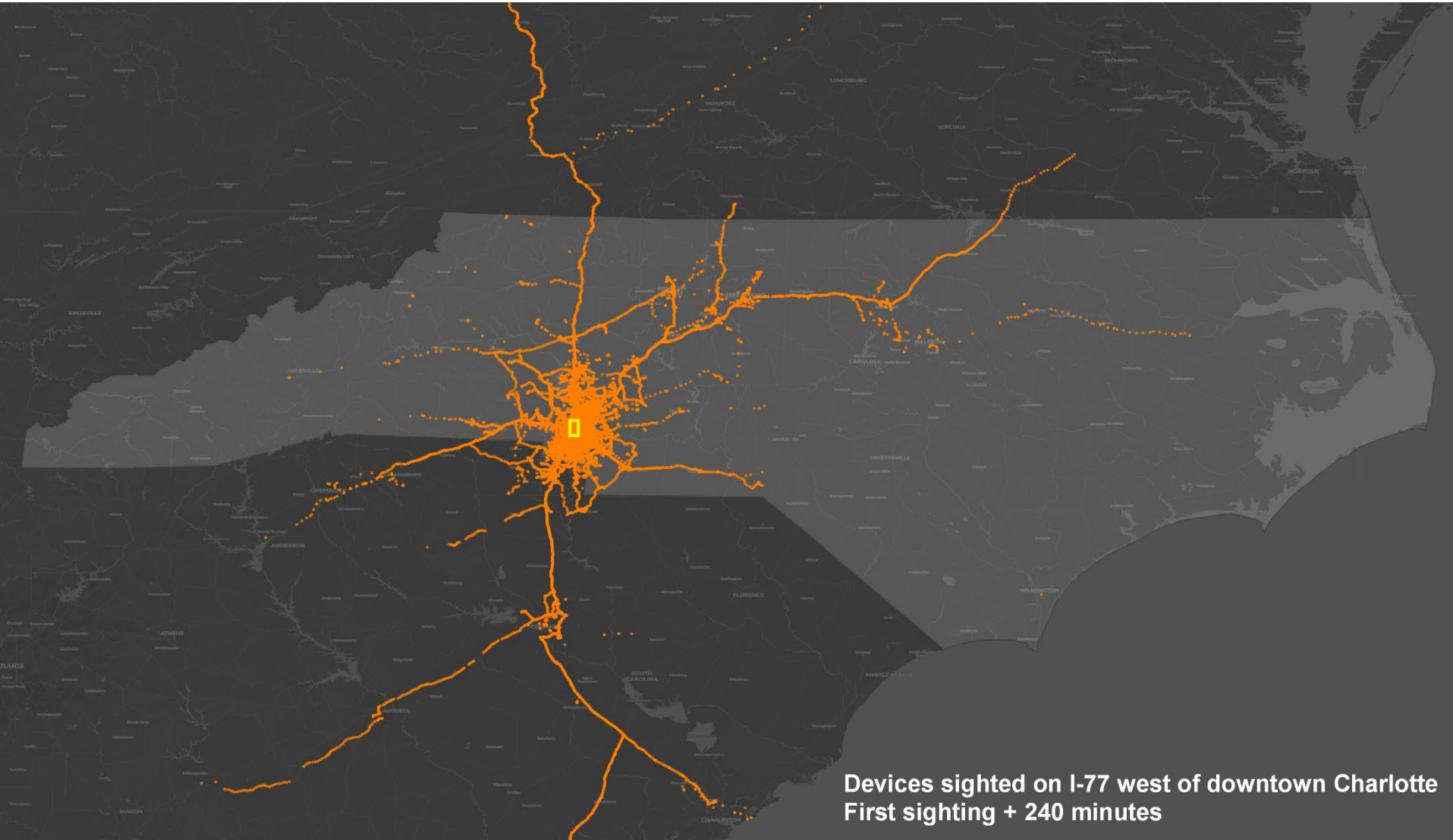
Devices sighted on I-77 west of downtown Charlotte
First sighting + 60 minutes

I-77 Flows



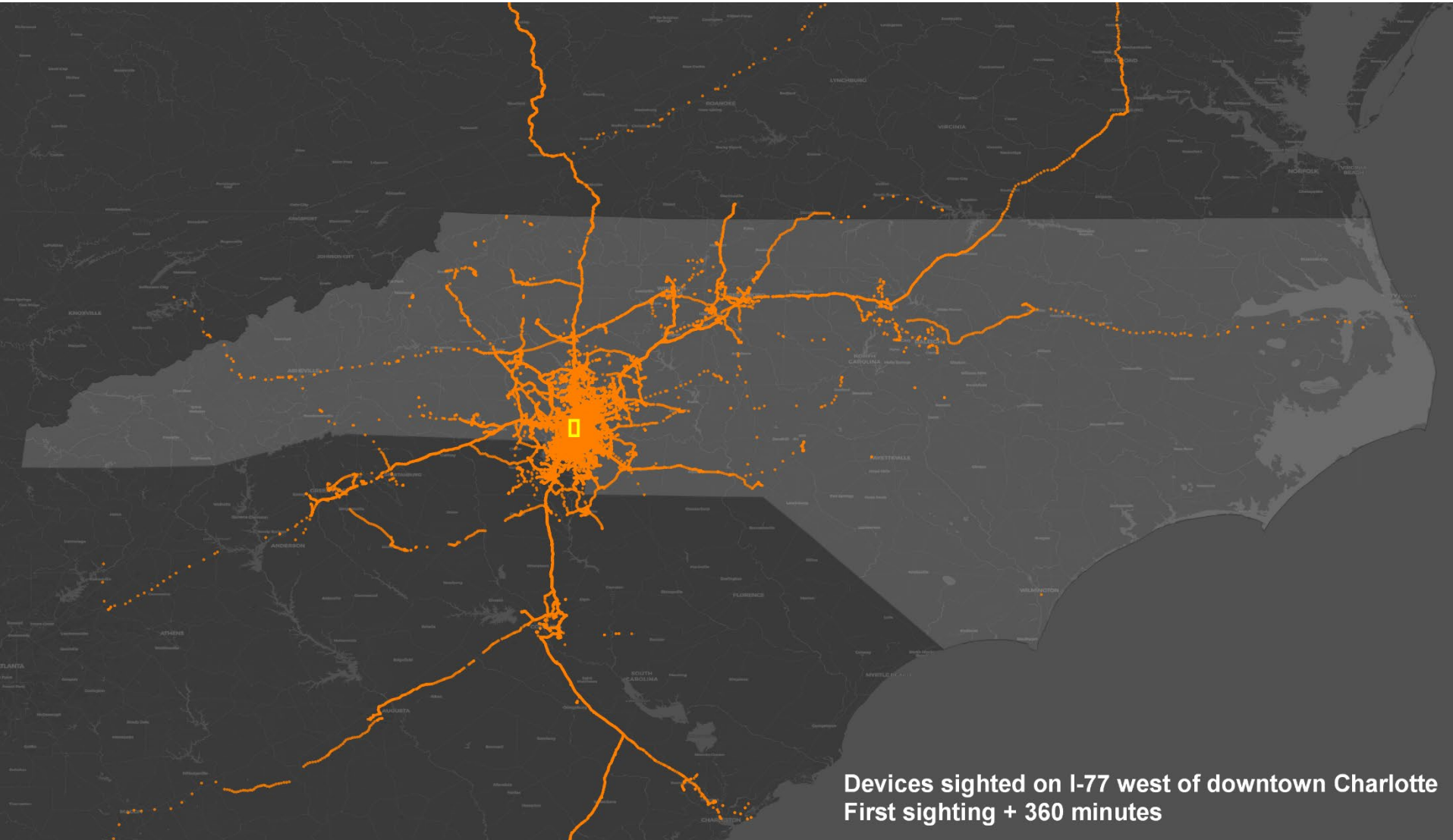
Devices sighted on I-77 west of downtown Charlotte
First sighting + 120 minutes

I-77 Flows



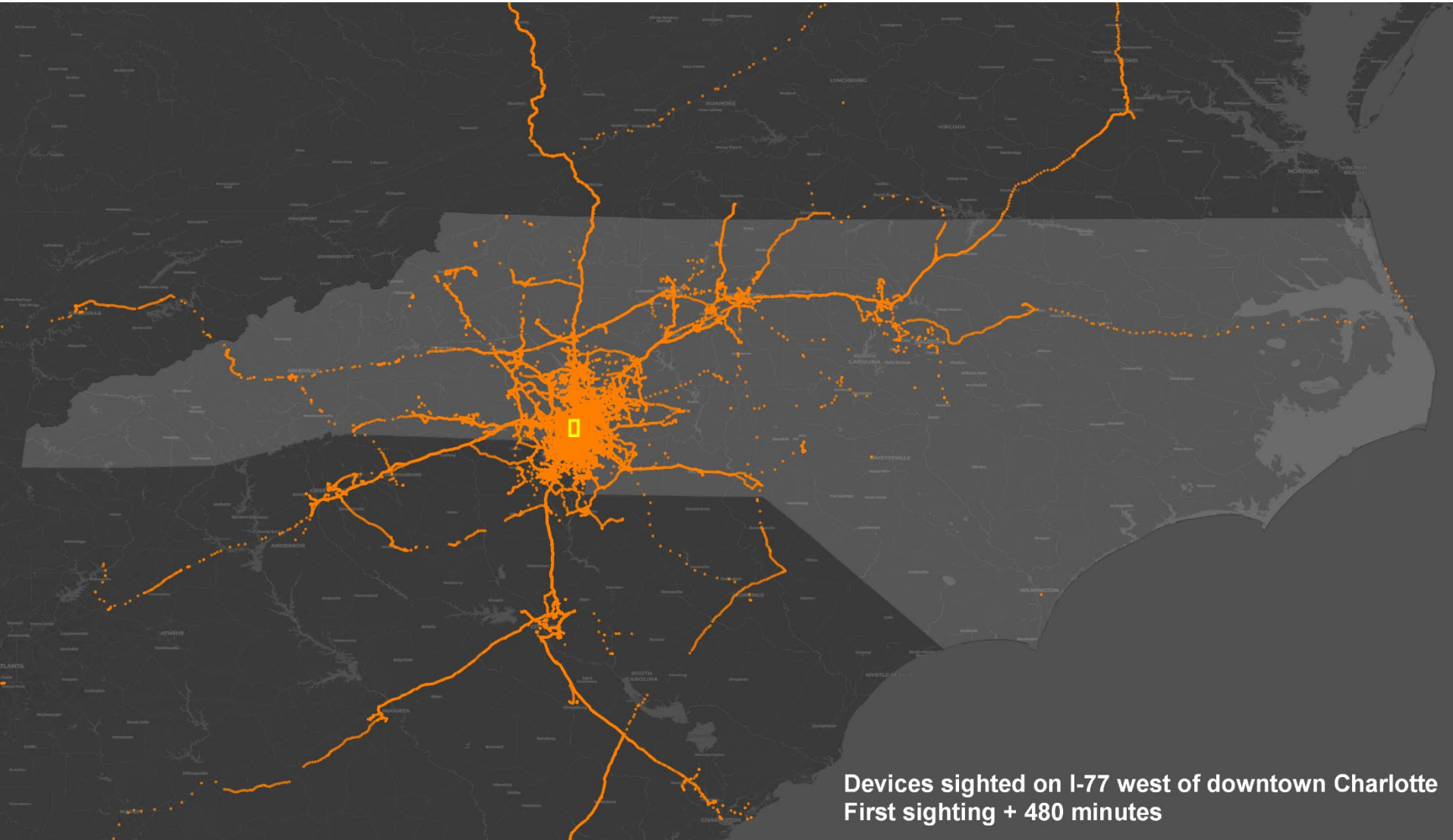
Devices sighted on I-77 west of downtown Charlotte
First sighting + 240 minutes

I-77 Flows



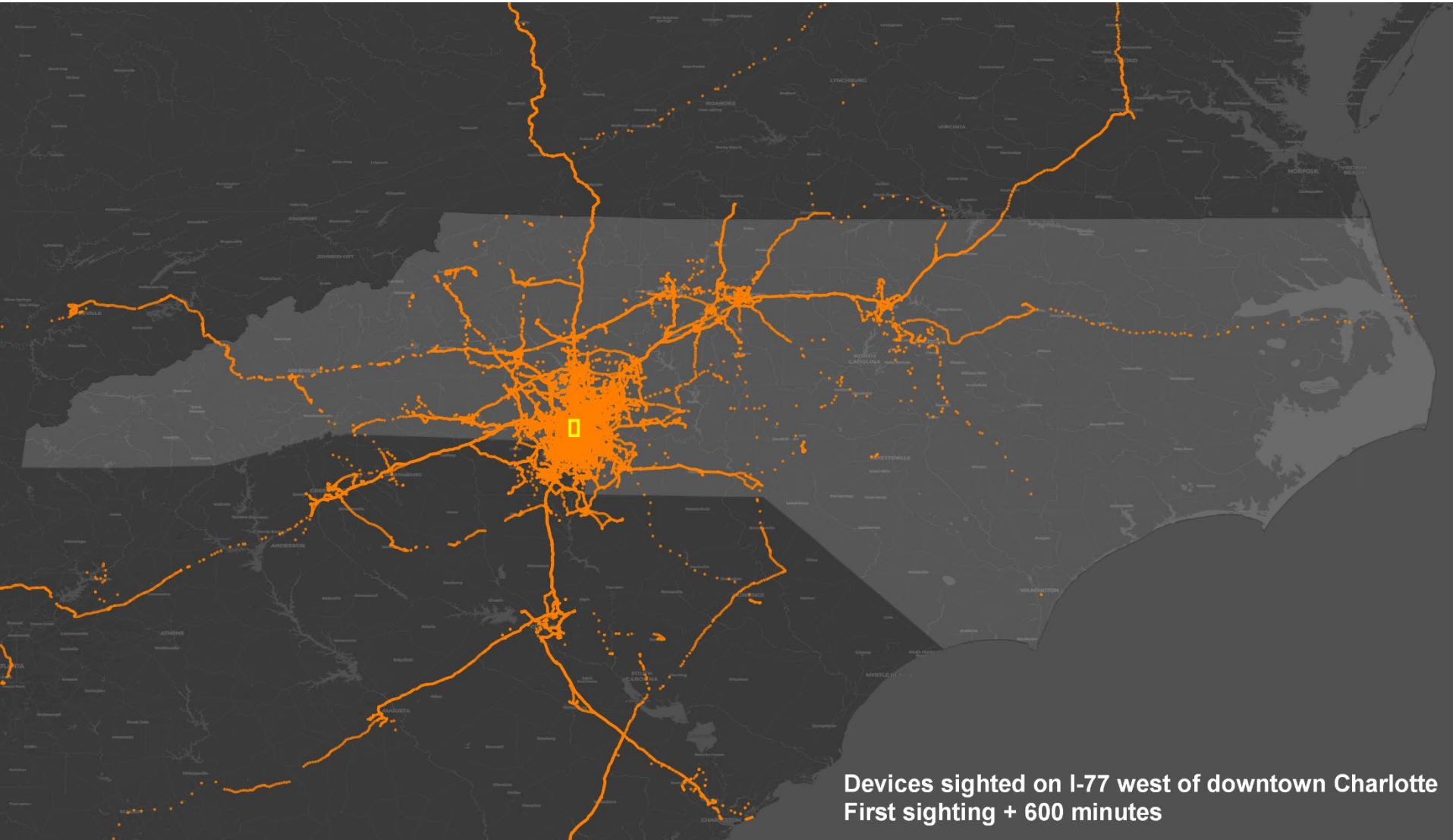
Devices sighted on I-77 west of downtown Charlotte
First sighting + 360 minutes

I-77 Flows



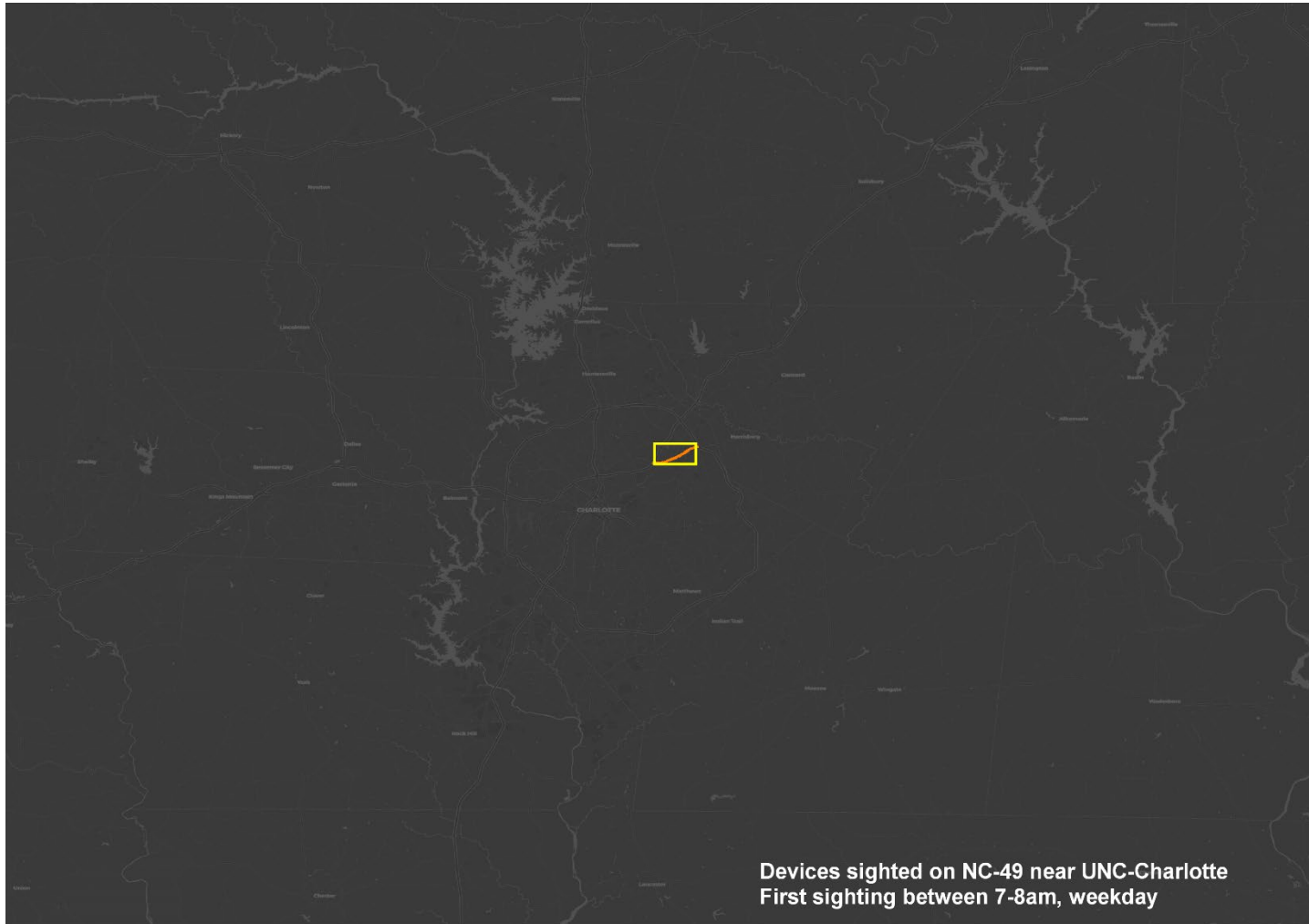
Devices sighted on I-77 west of downtown Charlotte
First sighting + 480 minutes

I-77 Flows

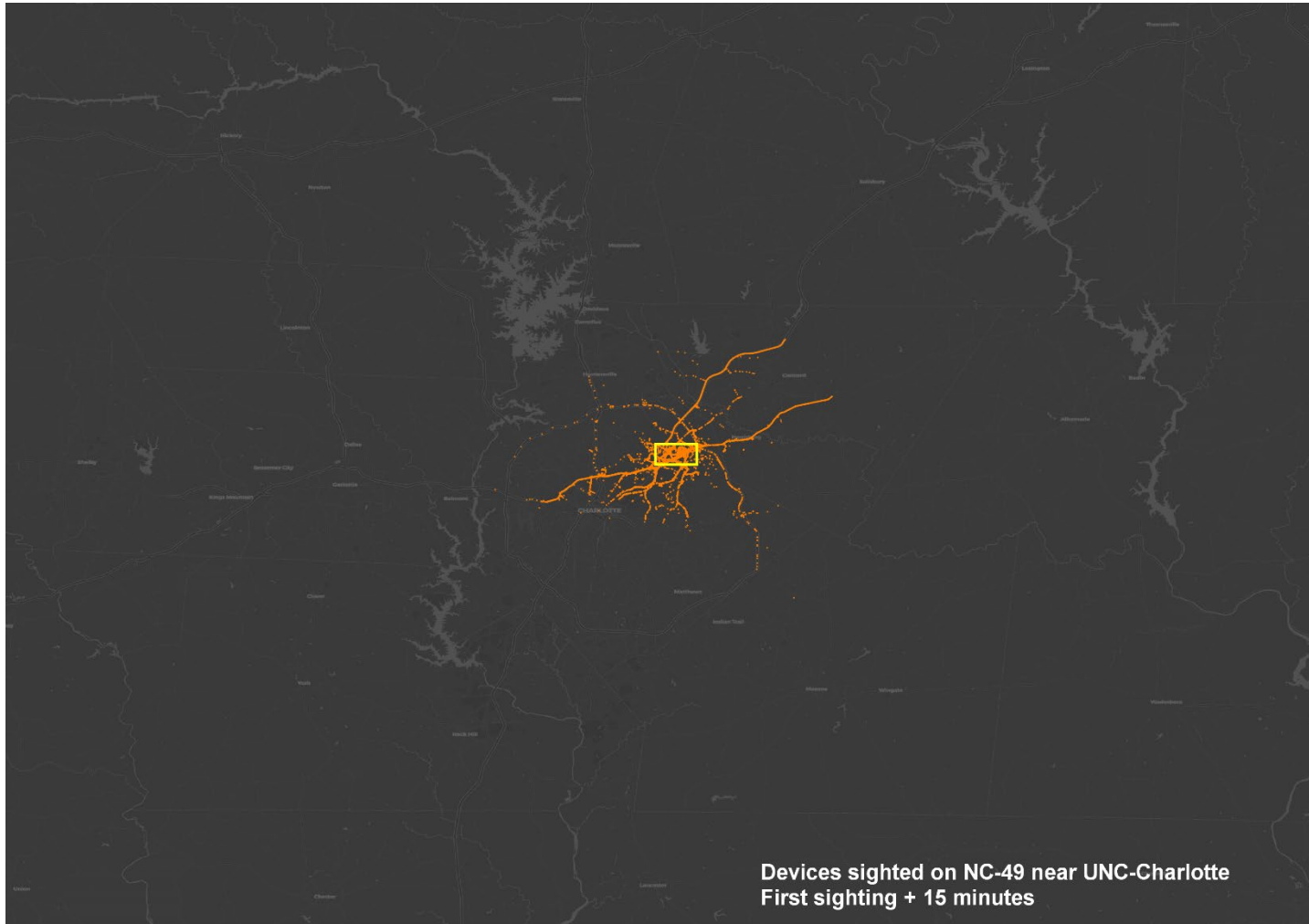


Devices sighted on I-77 west of downtown Charlotte
First sighting + 600 minutes

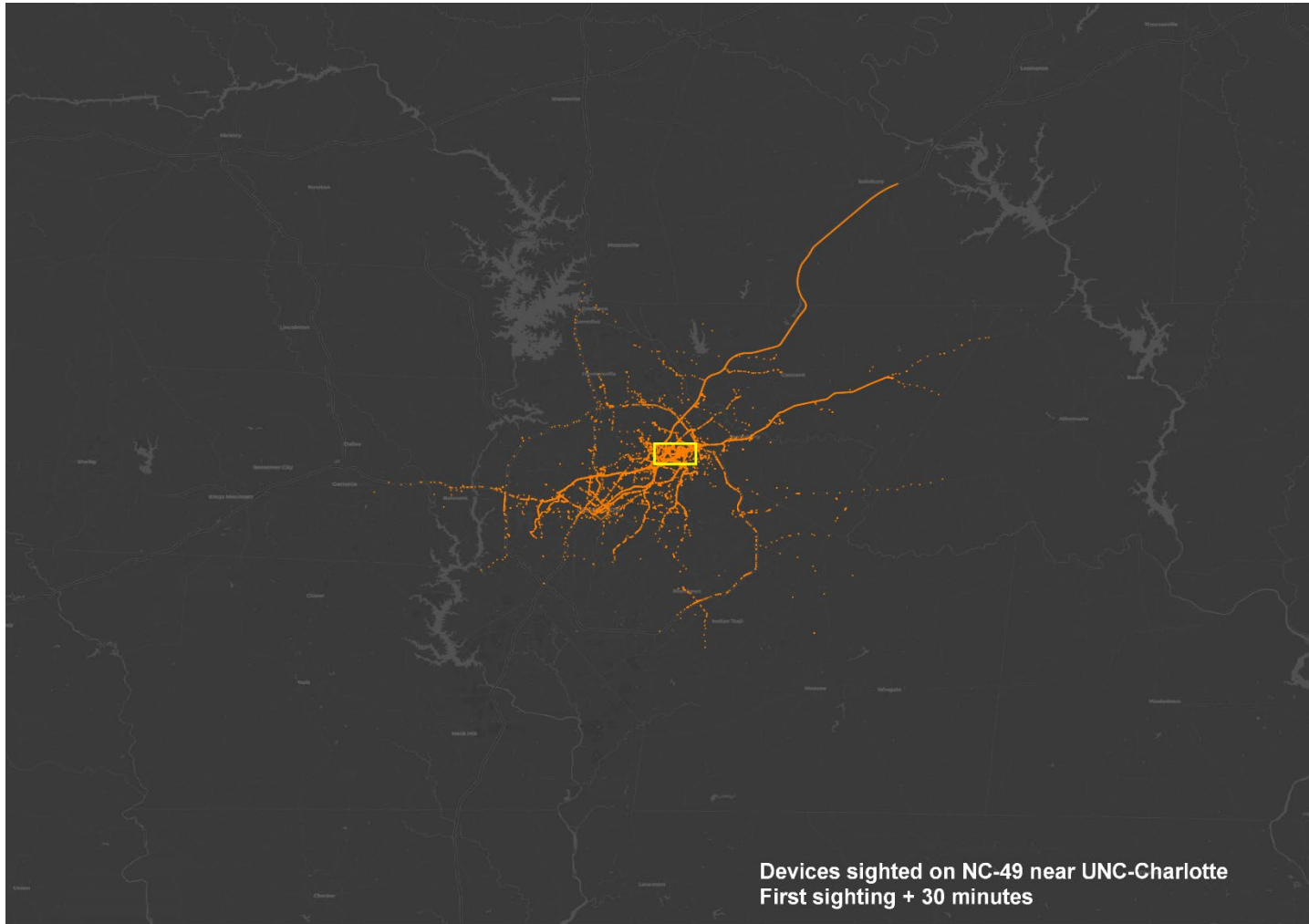
NC49 Flows



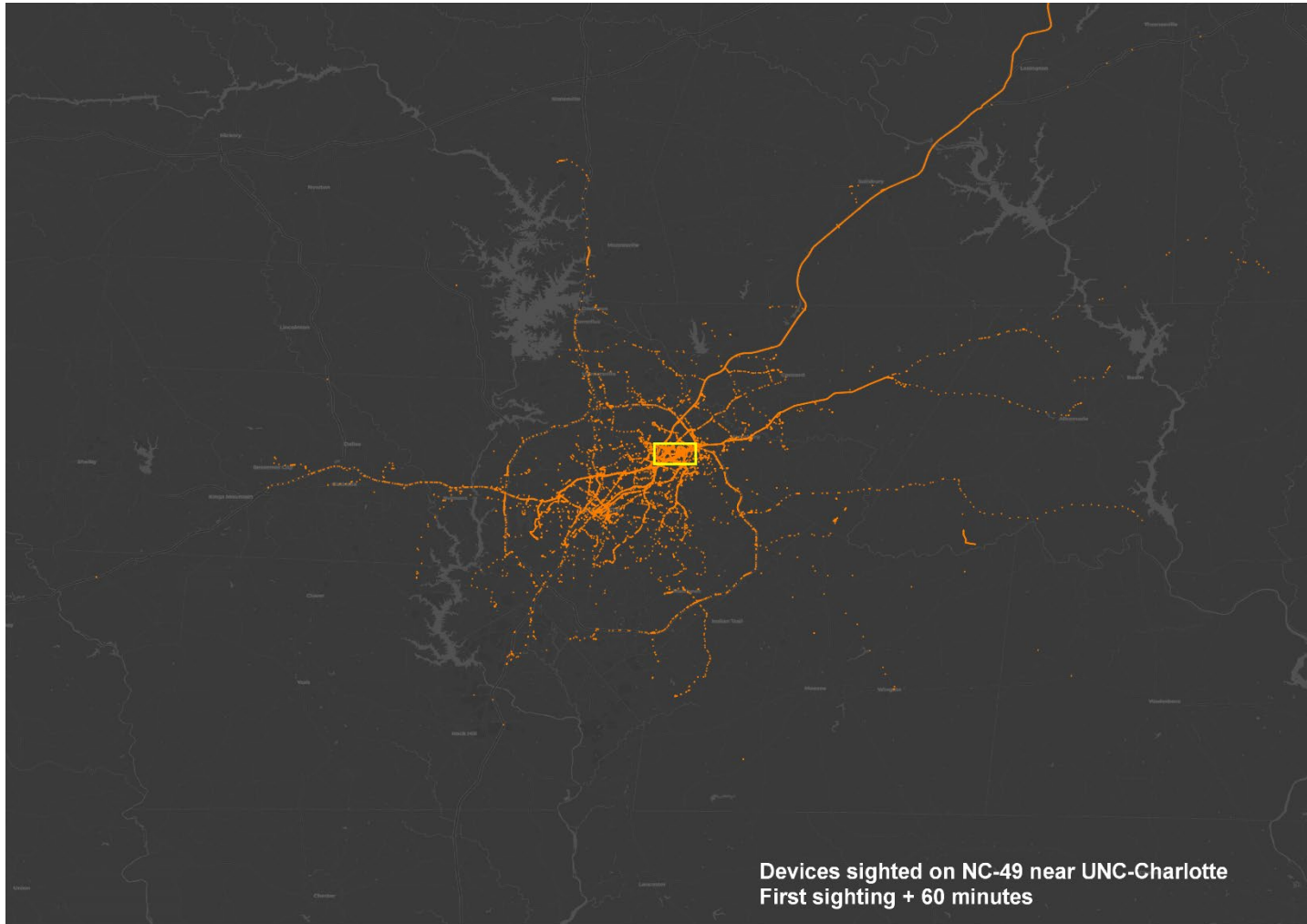
NC49 Flows



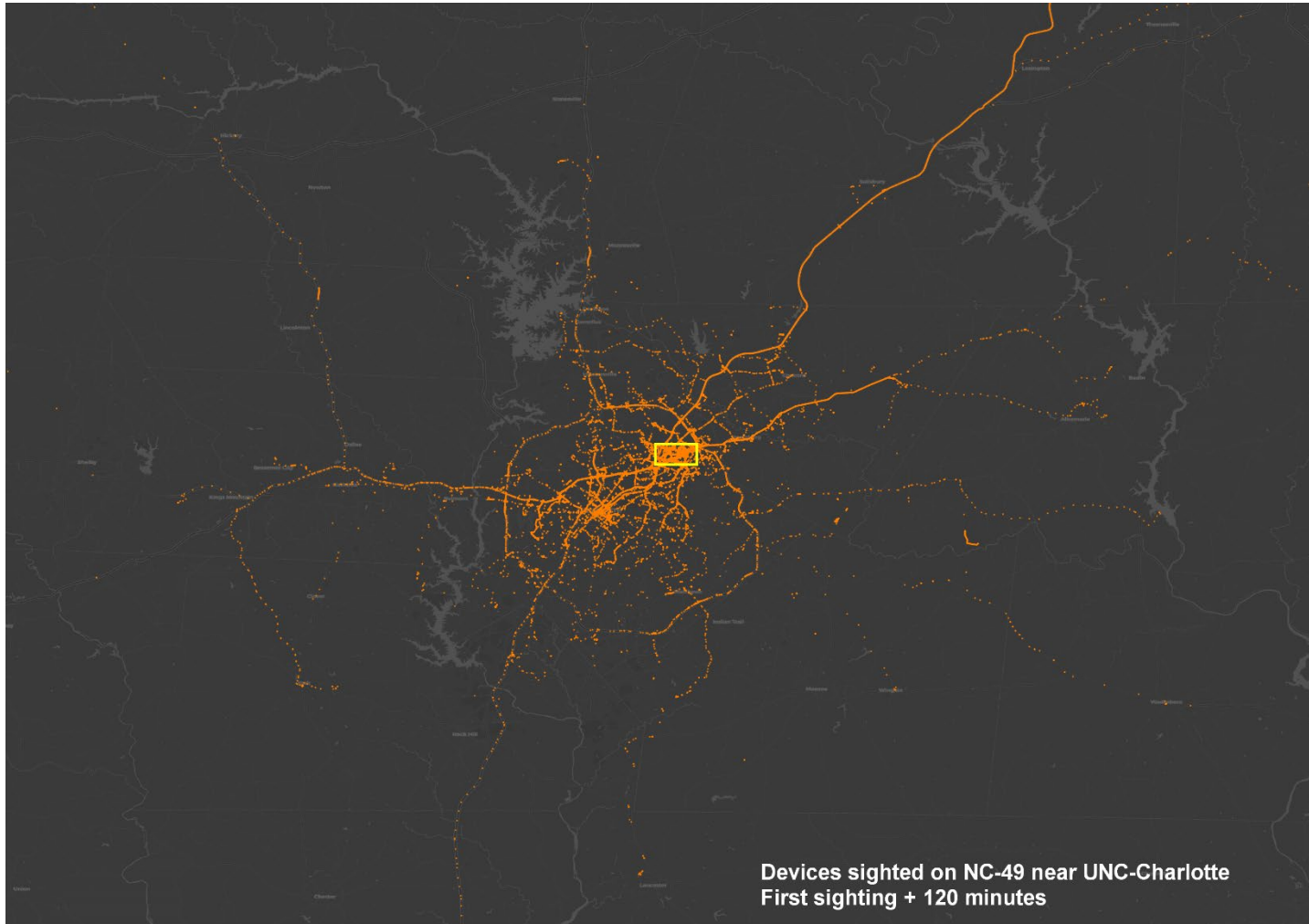
NC49 Flows



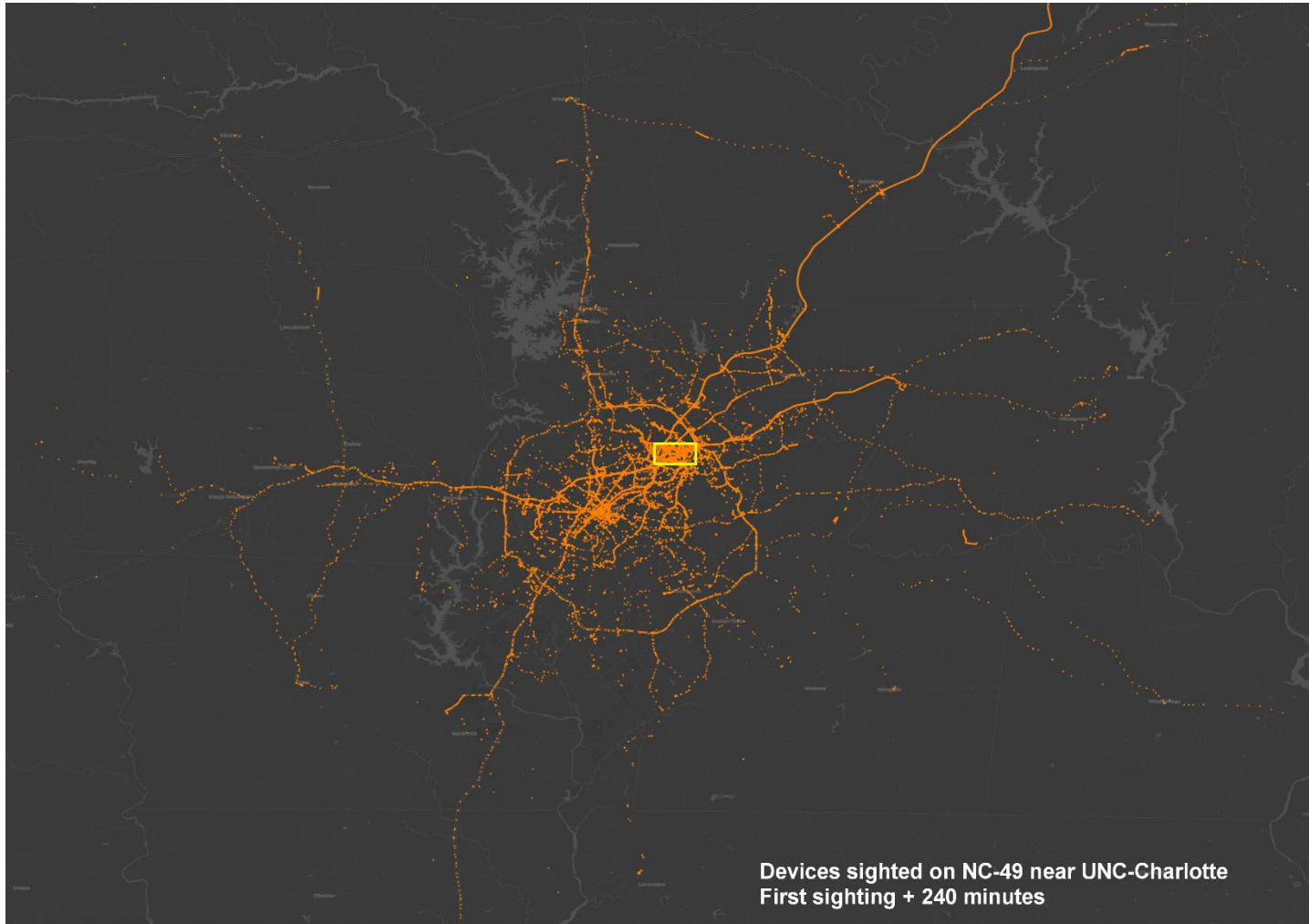
NC49 Flows



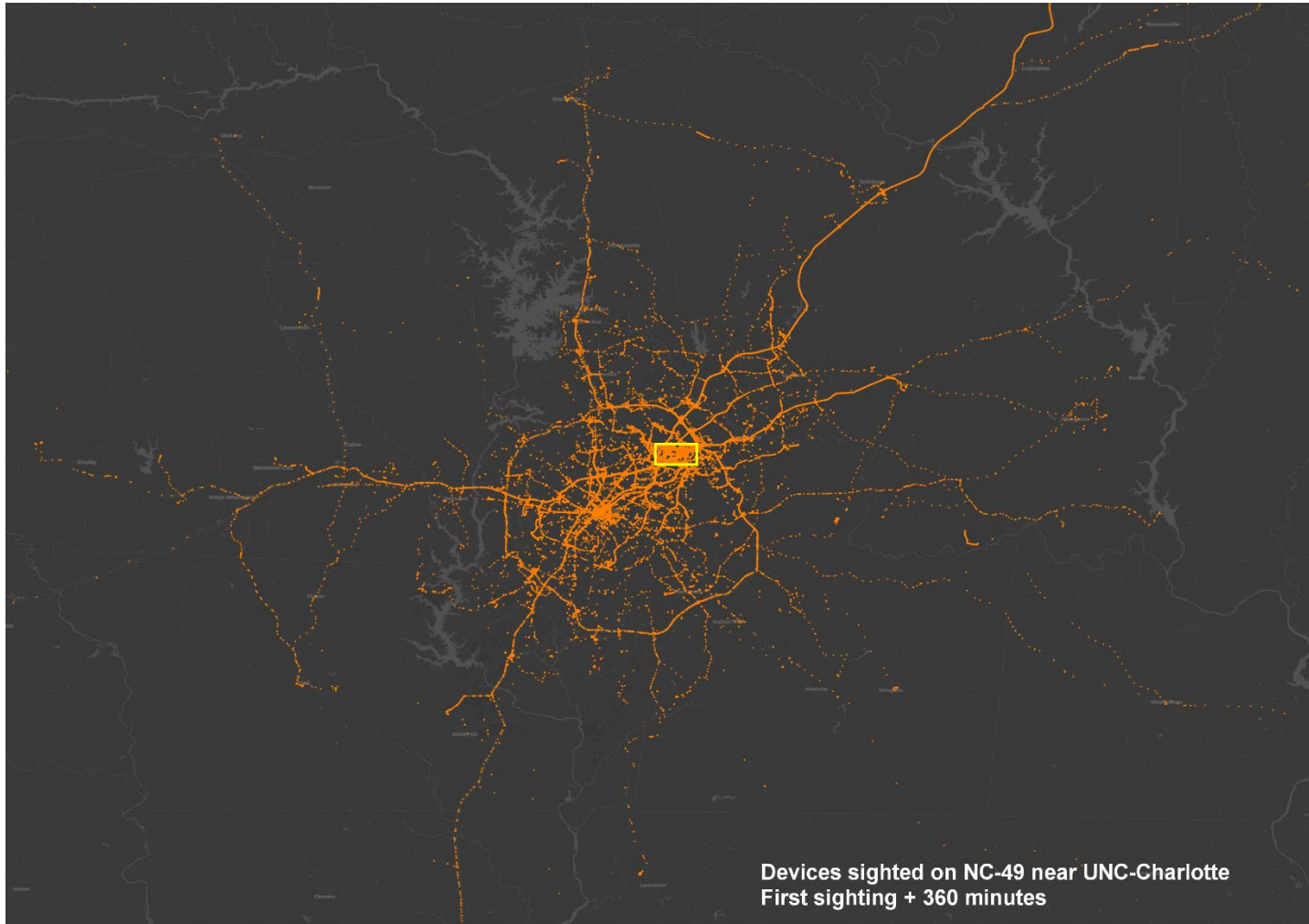
NC49 Flows



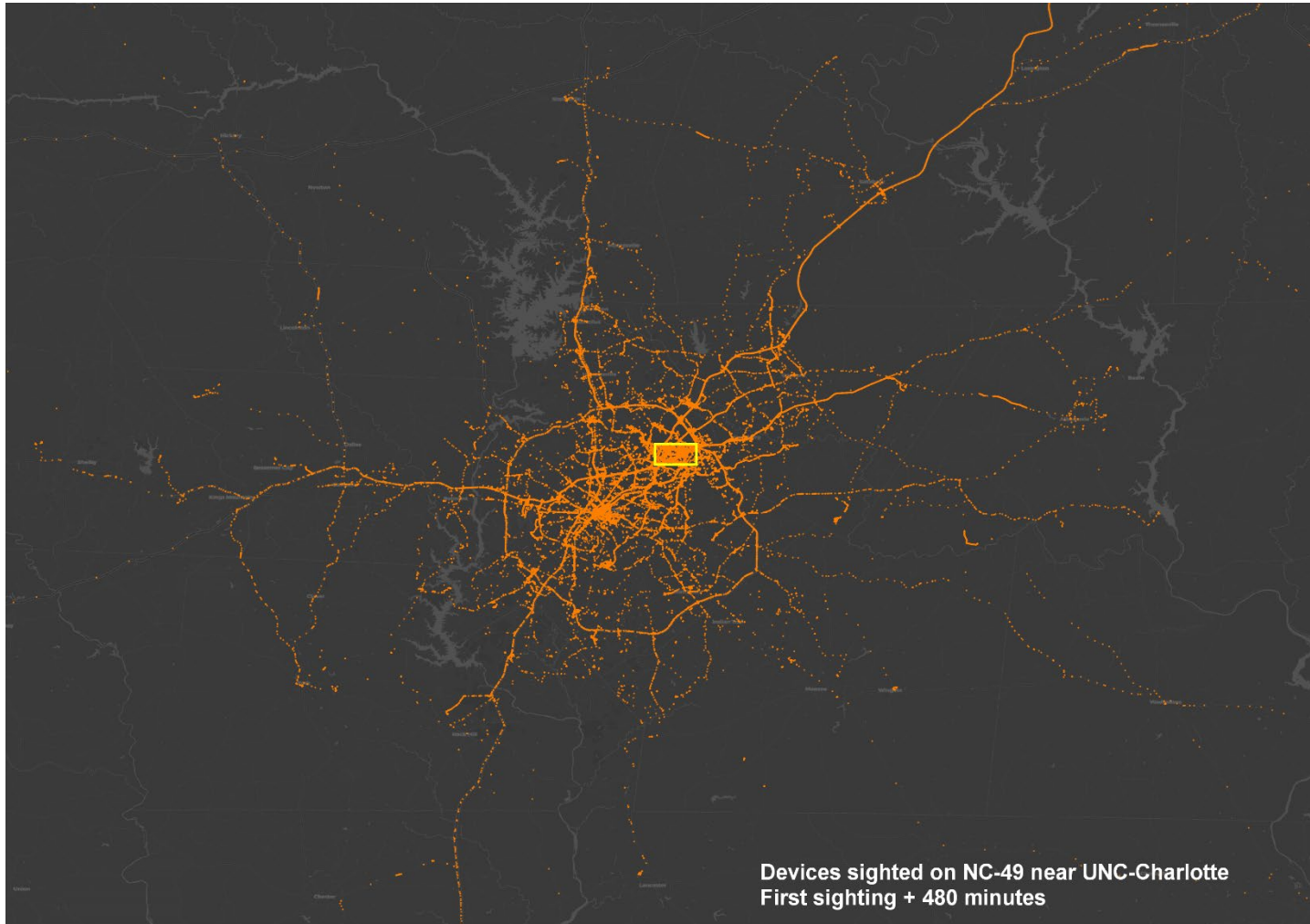
NC49 Flows



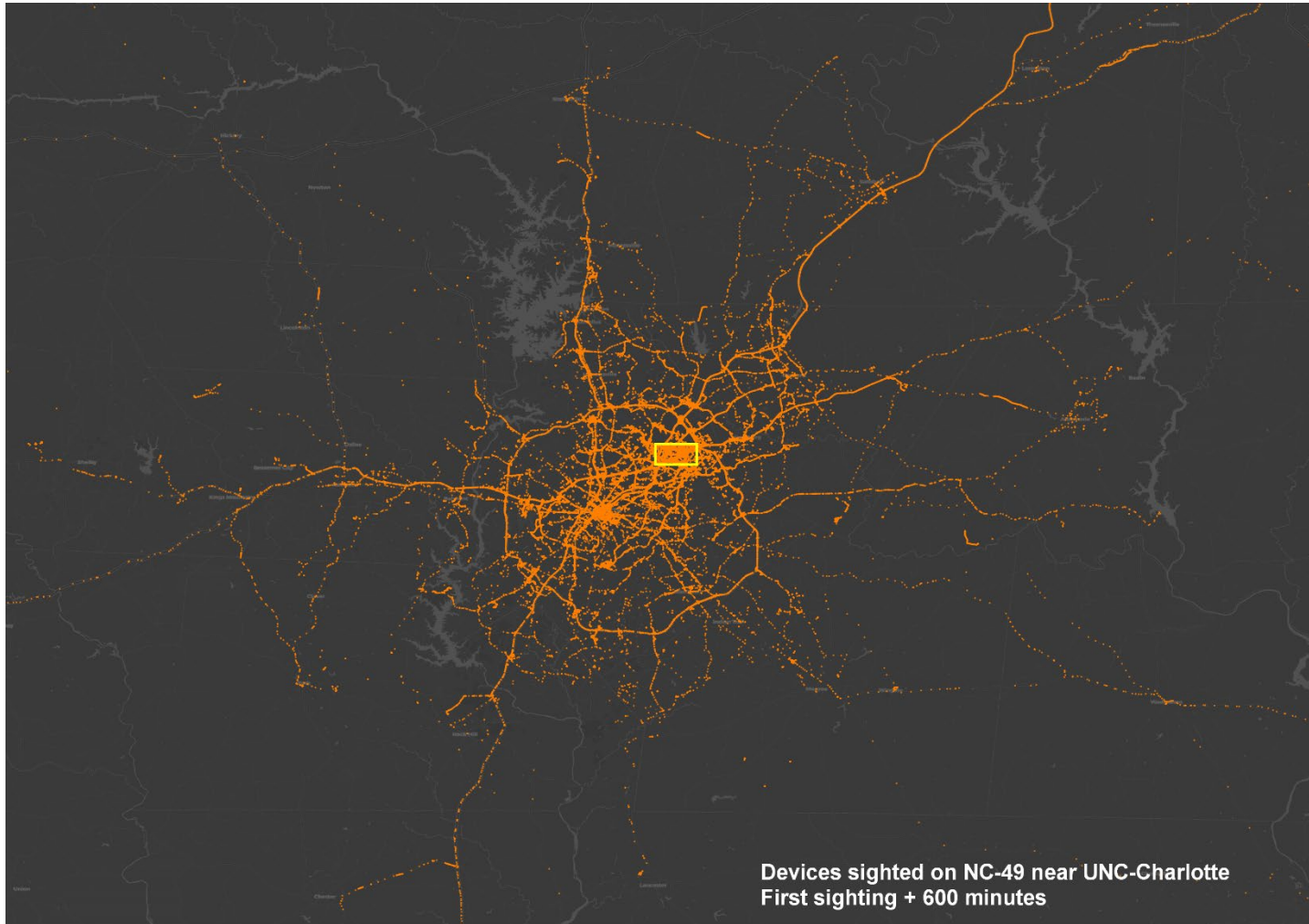
NC49 Flows



NC49 Flows



NC49 Flows



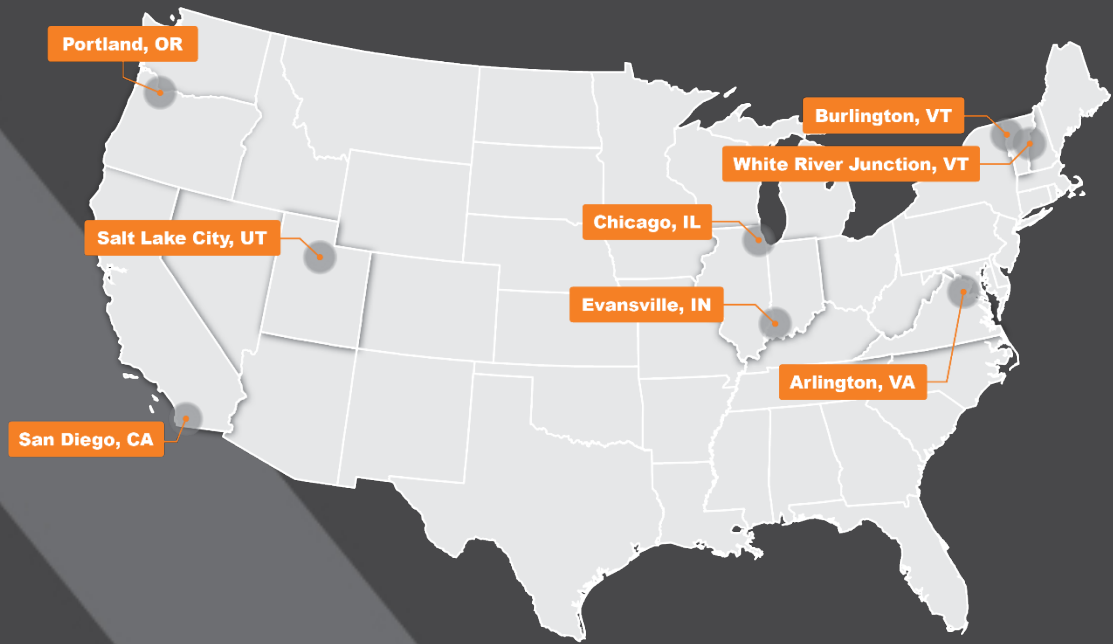


Summary & Takeaways

Summary

- Passive (big) data is available for 2018, but processing & expansion is necessary (and non-trivial)
- NCSTM gen 4
 - Incorporates new OD data in a new data driven pivot point design
 - More accurate ODs and better fit to counts, easier to update going forward
- Charlotte using data for I-77 and NC49 corridor studies, model update, etc.





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