

# BU Initiative on Cities: Beyond Congestion



Matthew Raifman

Senior Manager, Ford Smart Mobility

# Why do we care about congestion?

- Time (travel time, predictability)
- Greenhouse Gas Emissions (CO, CO<sub>2</sub>, NO<sub>x</sub>)
- Health (stress, exposure to PM)
- Vehicle costs

# What is Congestion?



*Boston Globe*

# What is Congestion?

Excess of vehicles on a portion of roadway at a particular time resulting in a reduction below the total possible throughput.

# What is Congestion? What can we do about it?

Fewer vehicles

More roads

Excess of vehicles on a portion of roadway at a particular time resulting in a reduction below the total possible throughput.

Spread demand over time

Improve the overall efficiency of the roadway

# What is Congestion? What can we do about it?

More roads



Excess of vehicles on a portion of roadway at a particular time resulting in a reduction below the total possible throughput.

# How might we access more roadway?

- Build more roads
- Repurpose greenspace, bikelanes, and sidewalks

# “If you build it, they will come” induced demand on Boston Artery





~~How might we access more roadway?~~

- ~~• Build more roads~~
- ~~• Repurpose greenspace, bikelanes, and sidewalks~~

What's the right mix of green lanes, roads, sidewalks, parking, and dedicated bus lanes to optimize throughput?

# What is Congestion? What can we do about it?

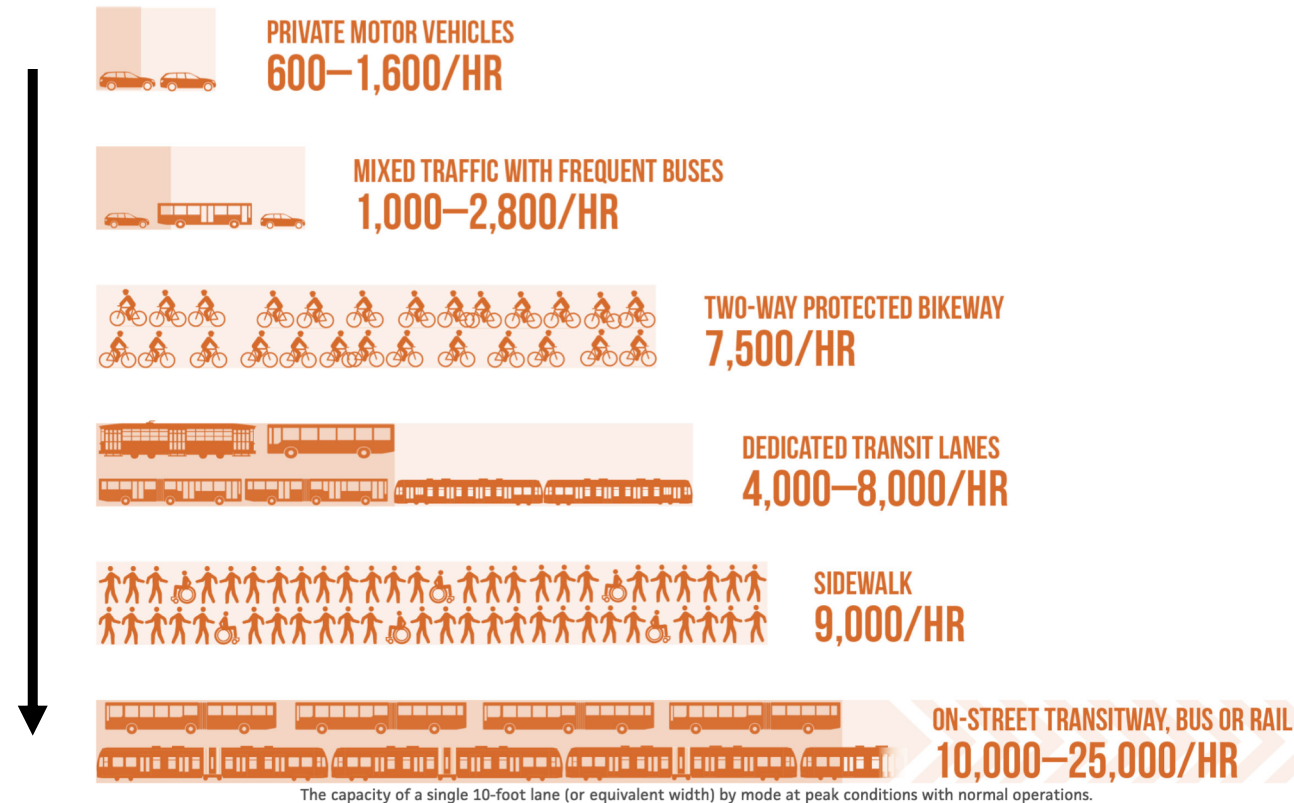
Fewer vehicles



Excess of vehicles on a portion of roadway at a particular time resulting in a reduction below the total possible throughput.

# How might we reduce the number of vehicles on the road?

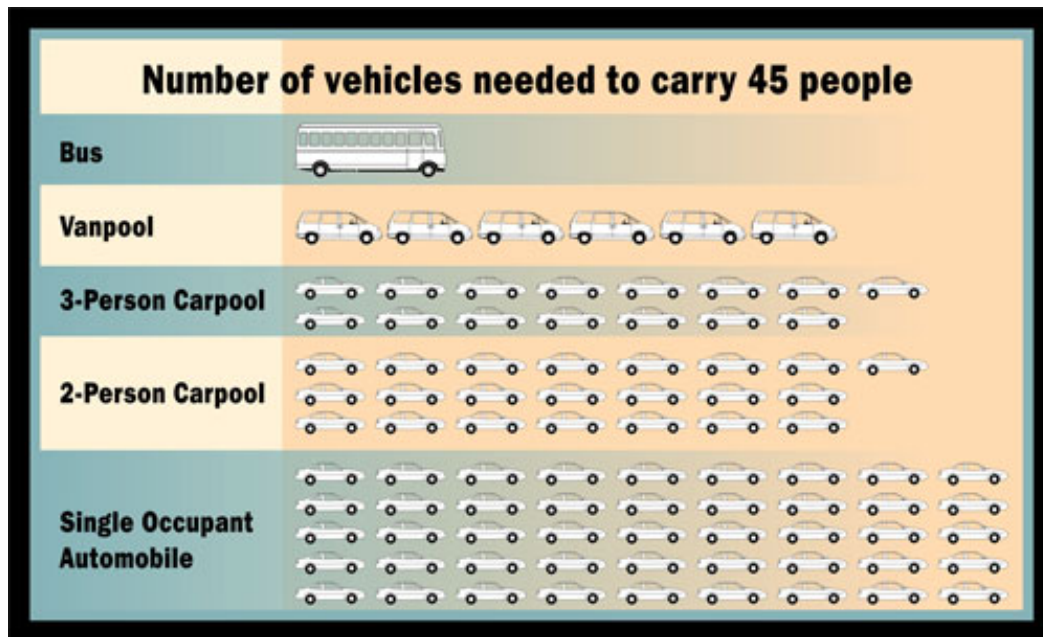
- Shift commuters from private vehicles to more efficient modes



*NACTO, Designing to Move People Guide*

# How might we reduce the number of vehicles on the road?

- Pool people and goods



USDOT FHWA



Curbed; Shutterstock

# How might we reduce the number of vehicles on the road?

- Shift from cars to more efficient modes
- Pool people and goods
- Don't drive in the first place

# What is Congestion? What can we do about it?

Excess of vehicles on a portion of roadway at a particular time resulting in a reduction below the total possible throughput.



Spread demand over time

# Spread demand over time?

- Workplace policies (staggered arrival times)
- Off hour goods delivery
- Technology-enabled routing across time

# What is Congestion? What can we do about it?

Excess of vehicles on a portion of roadway at a particular time resulting in a reduction below the total possible throughput.

Improve the overall efficiency of the roadway



# How might we improve the overall efficiency of the system?

- Avoid unnecessary stopping (e.g. tolls, parking)
- Optimize speed to maintain throughput
- Dynamically reroute based on traffic conditions



# Summary

- Behavior change away from single occupancy vehicles
- Technology can potentially enable behavior change... but policy, regulation, and pricing play a key role
- Technology can improve overall efficiency of system on the margins, but it is not a silver bullet

# From Data to Models and Proposed Solutions

Yannis Paschalidis

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CENTER FOR INFORMATION & SYSTEMS ENGINEERING



Department of Electrical and Computer Engineering,  
Division of Systems Engineering,  
Department of Biomedical Engineering,  
and Center for Information and Systems Engineering  
Boston University

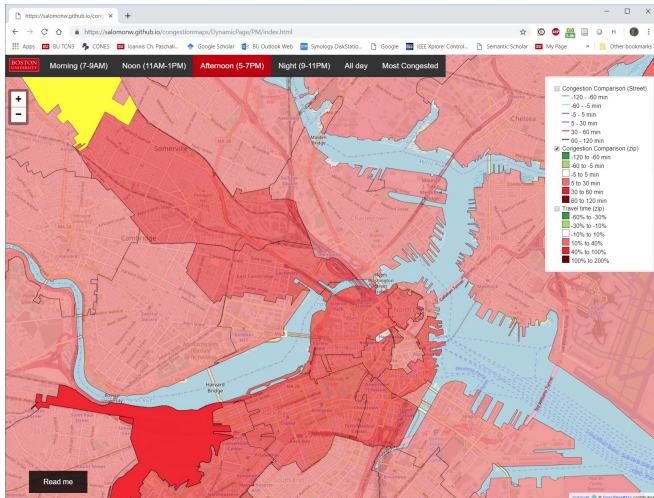
March 26, 2019  
Forum at IOC

# The problem



- Traffic congestion responsible for **20% of fuel consumption** and **90% of CO** in large urban areas.
- Cost of traffic congestion will reach **\$2.8T** in the US by 2030 ( $\approx$  annual tax revenue).
- On a per-driver basis, cost of traffic congestion is **\$1740** annually in US/Europe.
- Boston recently made news being declared **#1** in hours lost in rush-hour traffic per driver in 2018.

# Congestion Maps for the Boston Area: 2012→2015

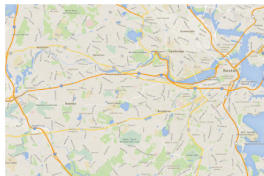


<https://salomonw.github.io/congestionmaps/DynamicPage/PM/index.html>

(Salo Wollenstein)

# Transportation Network Models

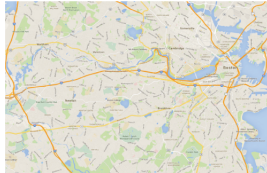
- **Transportation** network modeled as a graph.



- **Dynamics**: Drivers have a **congestion function** function of flow for each arc and pick the cheapest arcs to traverse. Collective decisions lead to a **Nash (Wardrop) equilibrium**.
- To control/design we need to build accurate **predictive models**.
- Data: Traffic flows.
- **Can we learn (the congestion function) from data?**

# Transportation Network Models

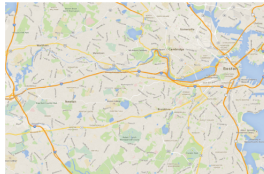
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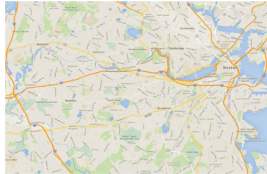


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# Price of Anarchy<sup>1</sup>

- Having the **congestion function** allows us to answer many “what-if-questions”.
- We can also formulate a problem to obtain a **socially optimal** equilibrium.
- **Price-of-Anarchy:**

$$\text{PoA} = \frac{\text{Congestion under Selfish Behavior}}{\text{Congestion under Socially Optimal Behavior}}$$



- Useful to assess how good/bad things are, but also to design interventions.

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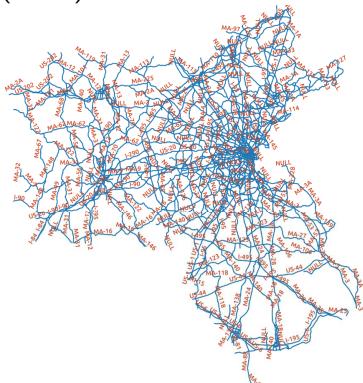
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# Boston Area Data<sup>2</sup>

## Eastern Massachusetts (EMA) Network

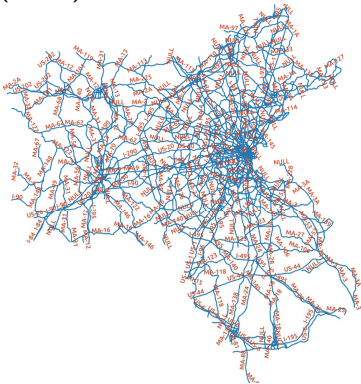


- Spatial average speeds for 13,000 road segments for each minute of 2012 (50 GB) and 2015 (130 GB).
- Capacity data in different times-of-day: lanes, peak vehicles counts, etc.

<sup>2</sup><https://github.com/jingzbu/InverseVITraffic>,  
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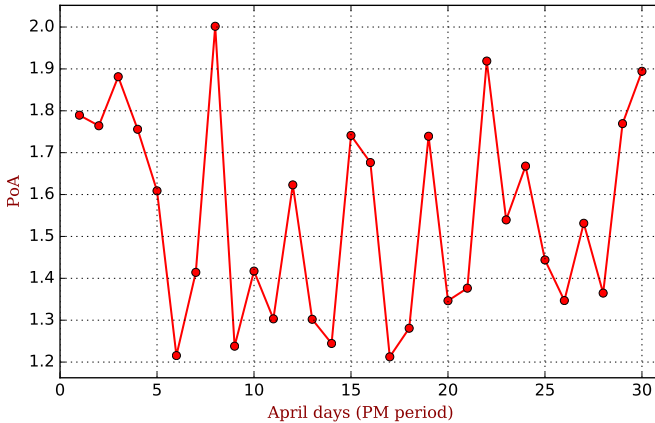
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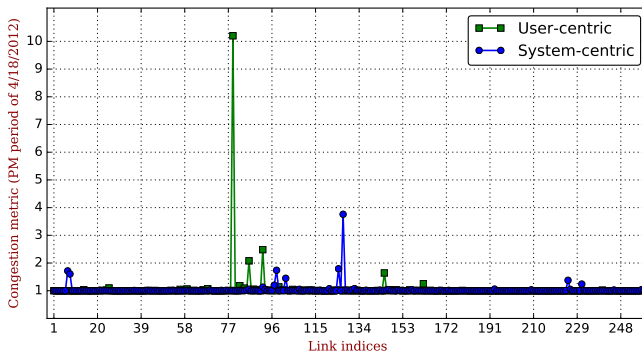
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# Price-of-Anarchy (2012)



# Road Congestion: Socially Optimal vs. User Optimal

“Spreading the traffic” results in:





# Control and Interventions

- 1 **Sensitivities: Where to intervene?**
- 2 **Socially optimal route recommendations:** Can be shown that we can achieve the **Socially Optimal** solution through **User Optimal** actions if users use a properly **modified congestion function!**
  - Easier to incorporate in apps, even enforce with autonomous vehicles.
  - Take the driver "out of the picture"
- 3 **Change demand! Congestion pricing and incentives!**

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# Final remarks

- We have developed a new general framework for modeling driver behavior using data.
- Policy space: How to address traffic allocation issues and prevent NIMBY reactions?

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# New Skills for New Mobility

Boston University Initiative on Cities  
March 2019

Jascha Franklin-Hodge / @jfh

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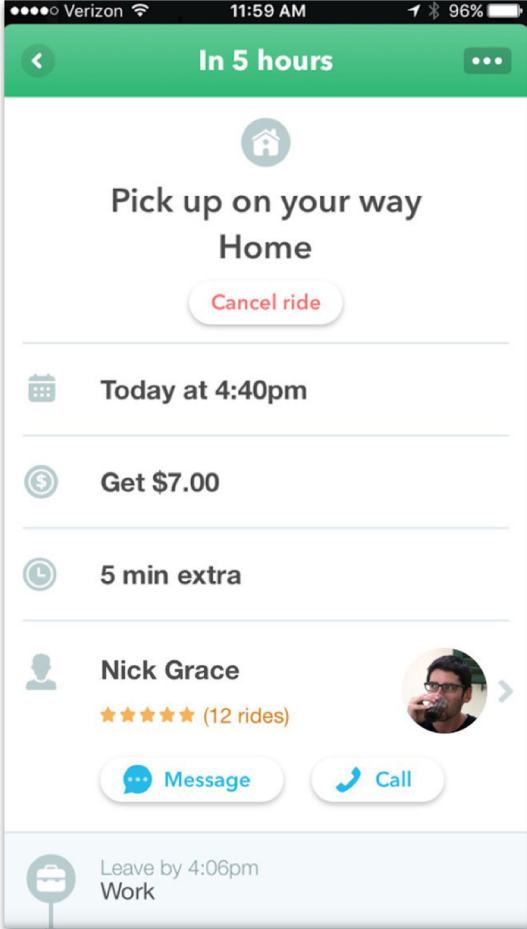
# What's new?



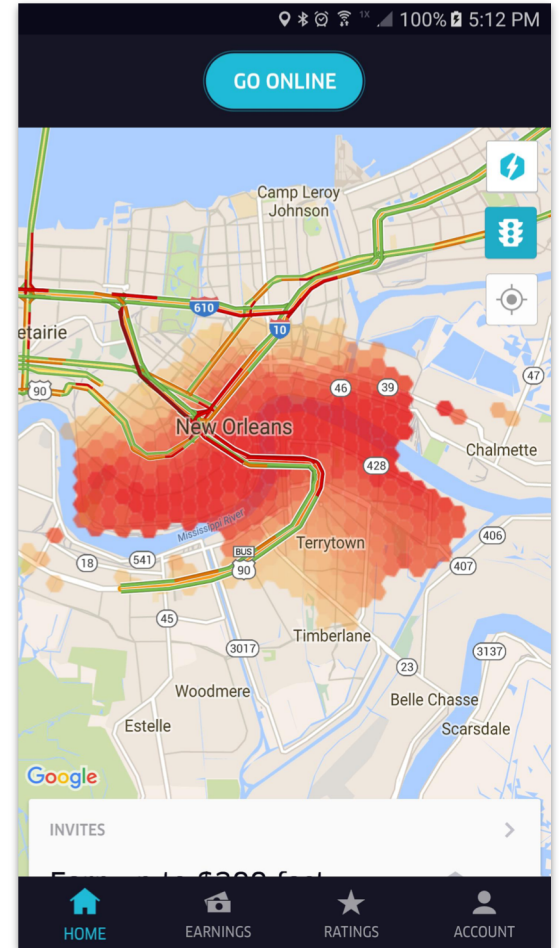
# New mobility is digital



WAYMO  
**one.**

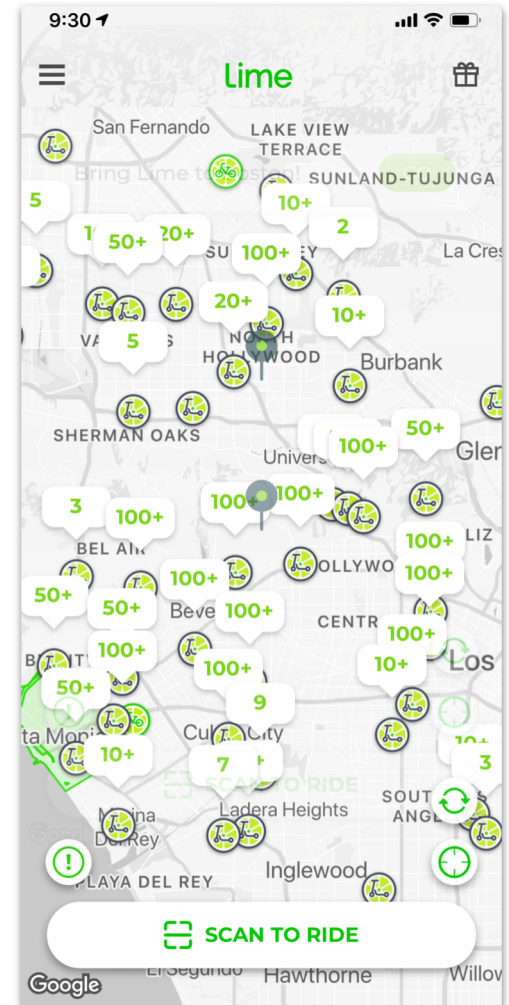
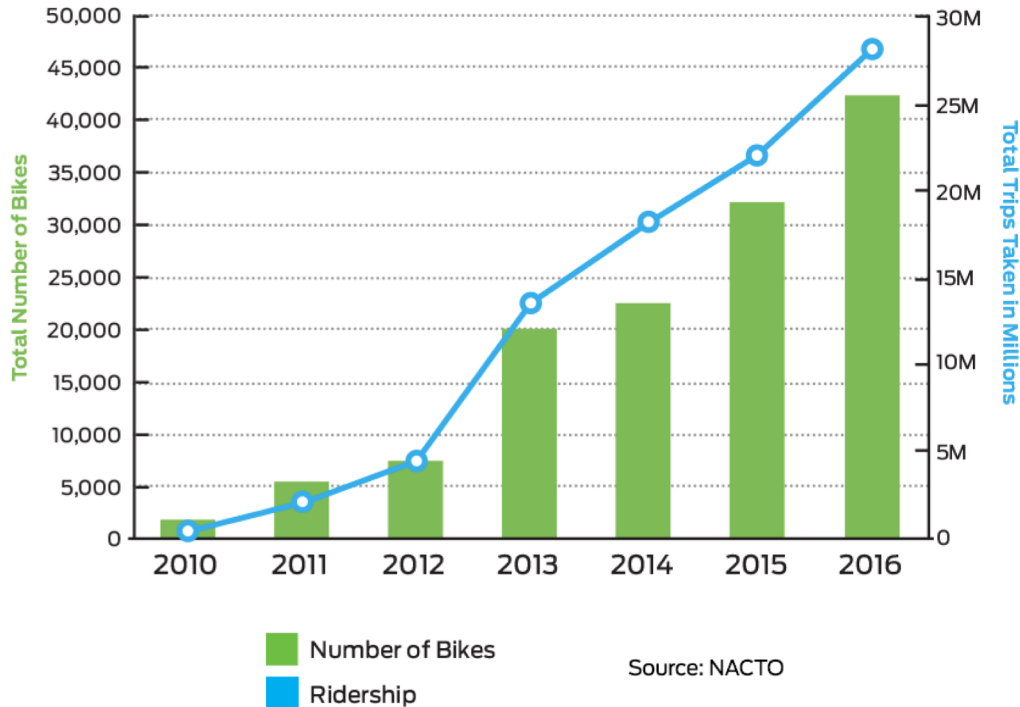


# New mobility is market driven.



# New mobility is dynamic.

## Bike Share Growth in the US

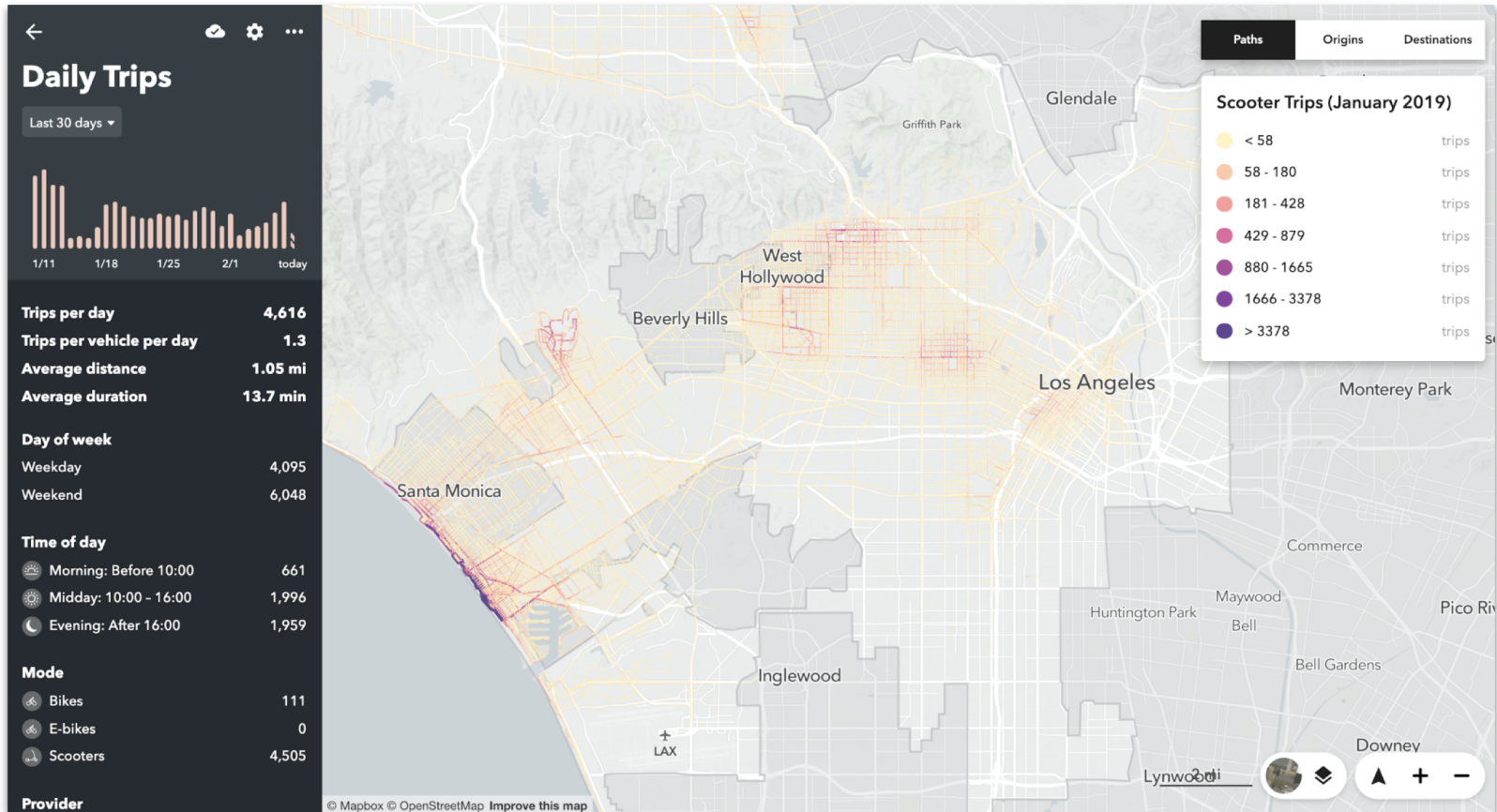


# New mobility is dynamic.



Mode	Cost	Duration
Walk	87 cal	22 min
Bike	31 cal	~12 min
Car Sharing	\$1.60	~11 min
Uber	\$5-7	10 min
Suggested (Bus)		18 min
Suggested (Bus)		20 min
Suggested (Bus)		21 min

# New skill: Real-time data for planning



# New skill: Data sharing with private sector

The screenshot shows the GitHub interface for the repository 'CityOfLosAngeles / mobility-data-specification'. At the top, there's a search bar and navigation links for 'Pull requests', 'Issues', 'Marketplace', and 'Explore'. The repository name is displayed with options to 'Unwatch', 'Unstar', 'Fork', and 'Watch'. Below this, there are tabs for 'Code', 'Issues (29)', 'Pull requests (11)', 'Projects (0)', 'Wiki', and 'Insights'. A description of the repository is provided: 'A data standard for Mobility as a Service Providers who work within in the City of Los Angeles'. A summary bar shows '319 commits', '16 branches', '7 releases', '40 contributors', and 'CC0-1.0'. Below the summary, there are buttons for 'Branch: dev', 'New pull request', 'Create new file', 'Upload files', 'Find File', and 'Clone or download'. A list of recent commits is shown, including 'agency', 'generate\_schema', 'provider', '.gitignore', 'CONTRIBUTING.md', 'LICENSE', 'README.md', 'ReleaseGuidelines.md', 'ReleaseNotes.md', and 'providers.csv'. The 'README.md' file is selected, showing its content: 'Mobility Data Specification' followed by a description of the data standard and its goals.

CityOfLosAngeles / **mobility-data-specification** Unwatch 74 Unstar 158 Fork 65

<> Code Issues 29 Pull requests 11 Projects 0 Wiki Insights

A data standard for Mobility as a Service Providers who work within in the City of Los Angeles

319 commits 16 branches 7 releases 40 contributors CC0-1.0

Branch: dev New pull request Create new file Upload files Find File Clone or download

thekaveman and hunterowens indentation fix Latest commit 128cf67 6 days ago

agency	Merge branch 'dev' into remove-412-response	18 days ago
generate_schema	updating schema version	25 days ago
provider	updating schema version	25 days ago
.gitignore	adding Pipenv	4 months ago
CONTRIBUTING.md	Minor language tweaks	6 days ago
LICENSE	license	10 months ago
README.md	Fix broken link to Feb 7 webinar presentation	24 days ago
ReleaseGuidelines.md	indentation fix	6 days ago
ReleaseNotes.md	add release notes	a month ago
providers.csv	Update providers.csv	9 days ago

README.md

## Mobility Data Specification

A data standard and API specification for *mobility as a service* providers, such as Dockless Bikeshare, E-Scooters, and Shared Ride providers who work within the public right of way.

Inspired by [GTFS](#) and [GBFS](#). Specifically, the goals of the Mobility Data Specification (MDS) are to provide API and data standards for municipalities to help ingest, compare and analyze *mobility as a service* provider data.

# New skill: Data sharing with private sector

2019 SESSION

INTRODUCED

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**HOUSE BILL NO. 2232**

Offered January 9, 2019

Prefiled January 8, 2019

A *BILL to amend and reenact §§ 46.2-100, 46.2-800, 46.2-849, 46.2-903, 46.2-904, 46.2-905, 46.2-908.1, 46.2-1015, 46.2-1041, and 46.2-1081 of the Code of Virginia and to amend the Code of Virginia by adding in Chapter 13 of Title 46.2 a section numbered 46.2-1315, relating to motorized skateboards or foot-scooters; operation; local authority.*

Patrons—Bagby and Sickles

Referred to Committee on Transportation

Be it enacted by the General Assembly of Virginia:

1. That §§ 46.2-100, 46.2-800, 46.2-849, 46.2-903, 46.2-904, 46.2-905, 46.2-908.1, 46.2-1015, 46.2-1041, and 46.2-1081 of the Code of Virginia are amended and reenacted and that the Code of Virginia is amended by adding in Chapter 13 of Title 46.2 a section numbered 46.2-1315 as follows:

§ 46.2-100. Definitions.

As used in this title, unless the context requires a different meaning:

"All-terrain vehicle" means a motor vehicle having three or more wheels that is powered by a motor and is manufactured for off-highway use. "All-terrain vehicle" does not include four-wheeled vehicles commonly known as "go-carts" that have low centers of gravity and are typically used in racing on

599 *1. Require licensees to provide to the locality anonymized fleet and ride activity data for all trips*  
600 *starting or ending within the jurisdiction of the locality on any vehicle provided by the licensee or any*  
601 *company controlled by, controlling, or under common control with the licensee, provided that (i) such*  
602 *data is provided via an application programming interface complying with the format requirements of*  
603 *the Mobility Data Specification and subject to the licensee's license agreement for such interface; (ii)*  
604 *any such data provided shall be treated as trade secret and proprietary business information, shall not*  
605 *be shared to third parties without the licensee's consent, and shall not be treated as owned by the local*  
606 *authority; and (iii) disaggregated ride history data containing GPS location traces of rides taken by*  
607 *users shall be considered personally identifiable information and shall under no circumstances be*

"Bicycle lane" means that portion of a roadway designated by signs and/or pavement markings for

the preferential use of bicycles, electric power-assisted bicycles, motorized skateboards or foot-scooters, and mopeds.

"Business district" means the territory contiguous to a highway where 75 percent or more of the property contiguous to a highway, on either side of the highway, for a distance of 300 feet or more along the highway, is occupied by land and buildings actually in use for business purposes.

"Camping trailer" means every vehicle that has collapsible sides and contains sleeping quarters but may or may not contain bathing and cooking facilities and is designed to be drawn by a motor vehicle.

"Cancel" or "cancellation" means that the document or privilege cancelled has been annulled or terminated because of some error, defect, or ineligibility, but the cancellation is without prejudice and

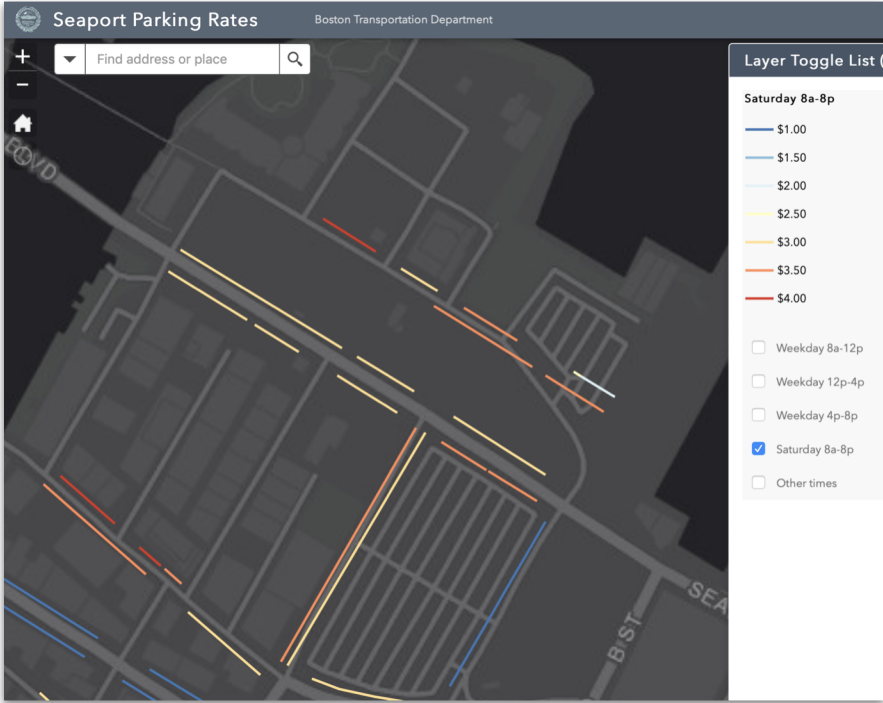


# New skill: Adaptive regulations

## 3.3.1 Dynamic Cap Adjustment Process

Operators interested in increasing their device cap must submit a request to the City with recent and relevant supporting data that demonstrates fleet utilization levels that meet or exceed the MUR. Data from the first 30 days of the pilot program should not be used in a request for adjustment. Utilization is calculated by dividing the sum of total daily rides within the jurisdiction over a one week period by the number of total devices available daily during the same timeframe. The highest and lowest outliers may be removed from the calculation.

# New skill: Dynamic pricing



# New skill: Incentives for outcomes

## Your Uber and Lyft ride at Logan Airport may soon change



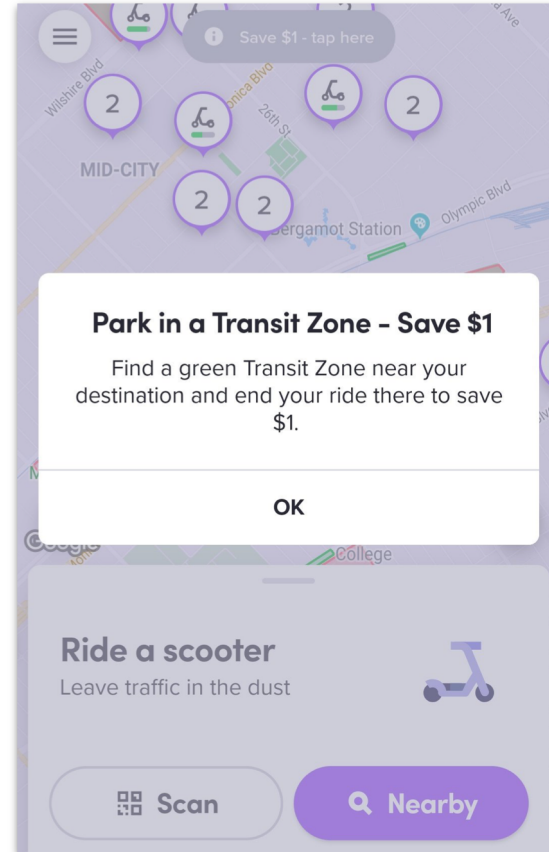
PAT GREENHOUSE/GLOBE STAFF/FILE

By [Adam Vaccaro](#) | GLOBE STAFF MARCH 21, 2019

Those Lyft and Uber rides to and from Logan may be getting more expensive — and they probably won't be dropping you off in front of the terminal anymore.

The Massachusetts Port Authority, which operates Logan Airport, on Thursday unveiled details of its plan to rein in the thousands of Uber and Lyft rides clogging its terminals and narrow roads, and a fee increase that would make its ride-hailing charge among the highest of any airport in the country.

"We have to do something," said Edward Freni, the agency's director of aviation, expressing exasperation about the daily traffic jams at the terminals and in East Boston.



# New skill: Consumer protection

11.02.18 | WORLD CHANGING IDEAS

## Why Uber and Lyft want to create walled gardens—and why it's bad for urban mobility

As ride-hailing apps begin to control scooters and bike shares, they're making it harder for people to make the best decisions about how to move around their cities.



[Photo: Mary Altaffer/AP/Shutterstock]

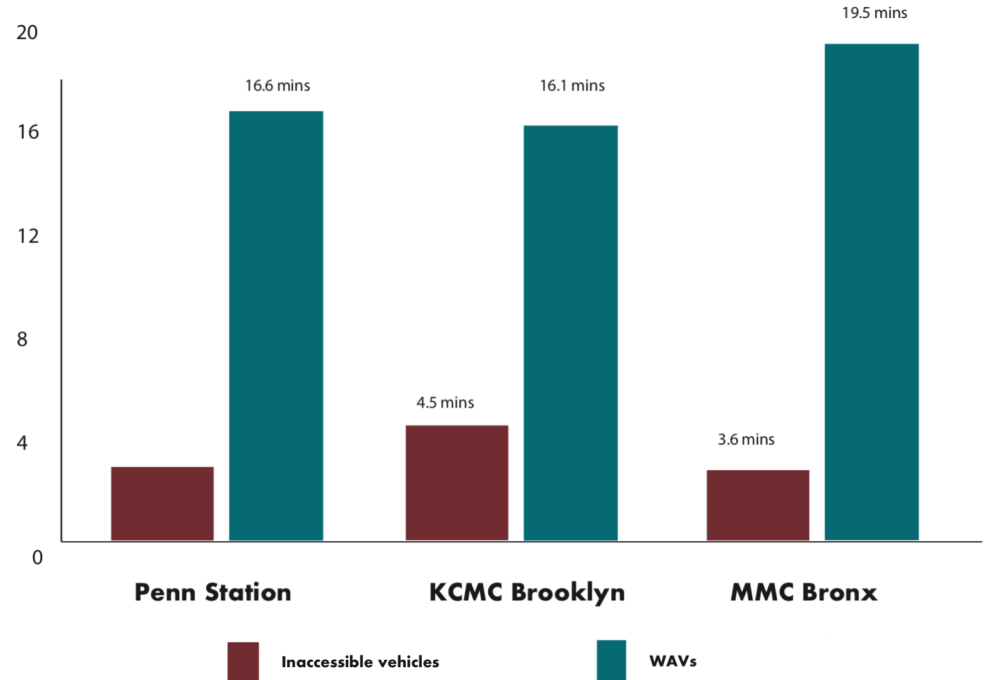


BY DAVID ZIPPER 6 MINUTE READ

If you're not a techie, you may not have come across the term "walled garden" before. But it's a critical concept these days. [Why Uber and Lyft](#)

# FAST COMPANY

## Estimated wait times locations for available vehicles (Note No WAVs were available at JFK or LGA Airports)



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**The future of the DOT is  
roads...and code.**

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