

# **Dynamic Pricing Strategies for High Occupancy/Toll (HOT) Lanes**

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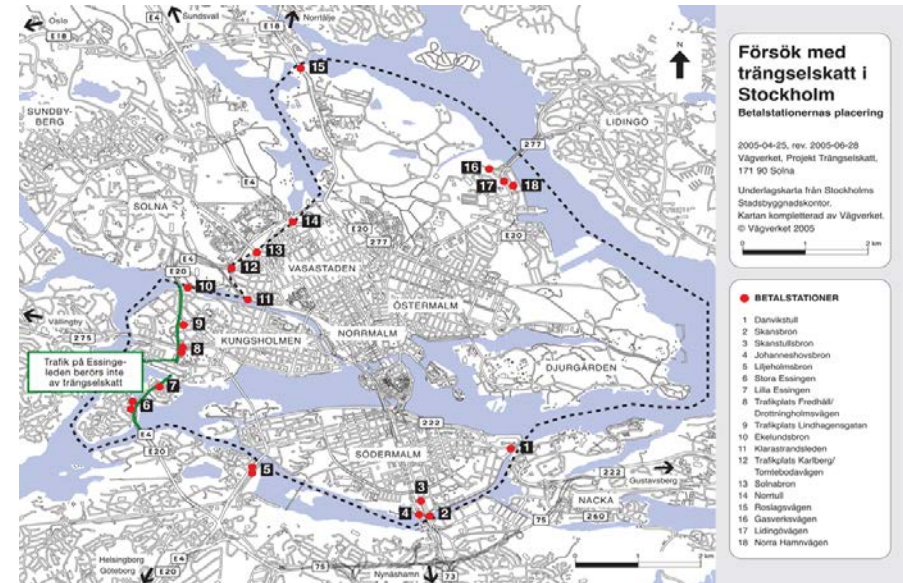
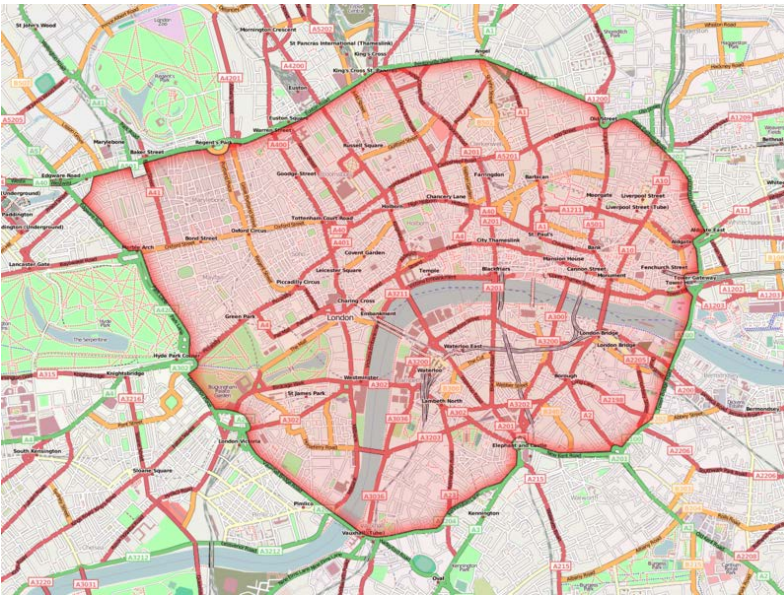
# Congestion Pricing

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- **The basic concept has been around for over 80 years (e.g., Pigou, 1920)**
  - **Internalize the negative externality of a trip by charging up to the full cost that the trip imposes to the society**
  - **Use tolls to provide incentives for users to change their travel behaviors to reduce traffic congestion, enhance system performance and improve social welfare**

# Congestion Pricing Practice

- **Cordon or Area-based Pricing**
  - e.g., Singapore, Oslo, London and Stockholm



# High Occupancy/Toll (HOT) Lanes

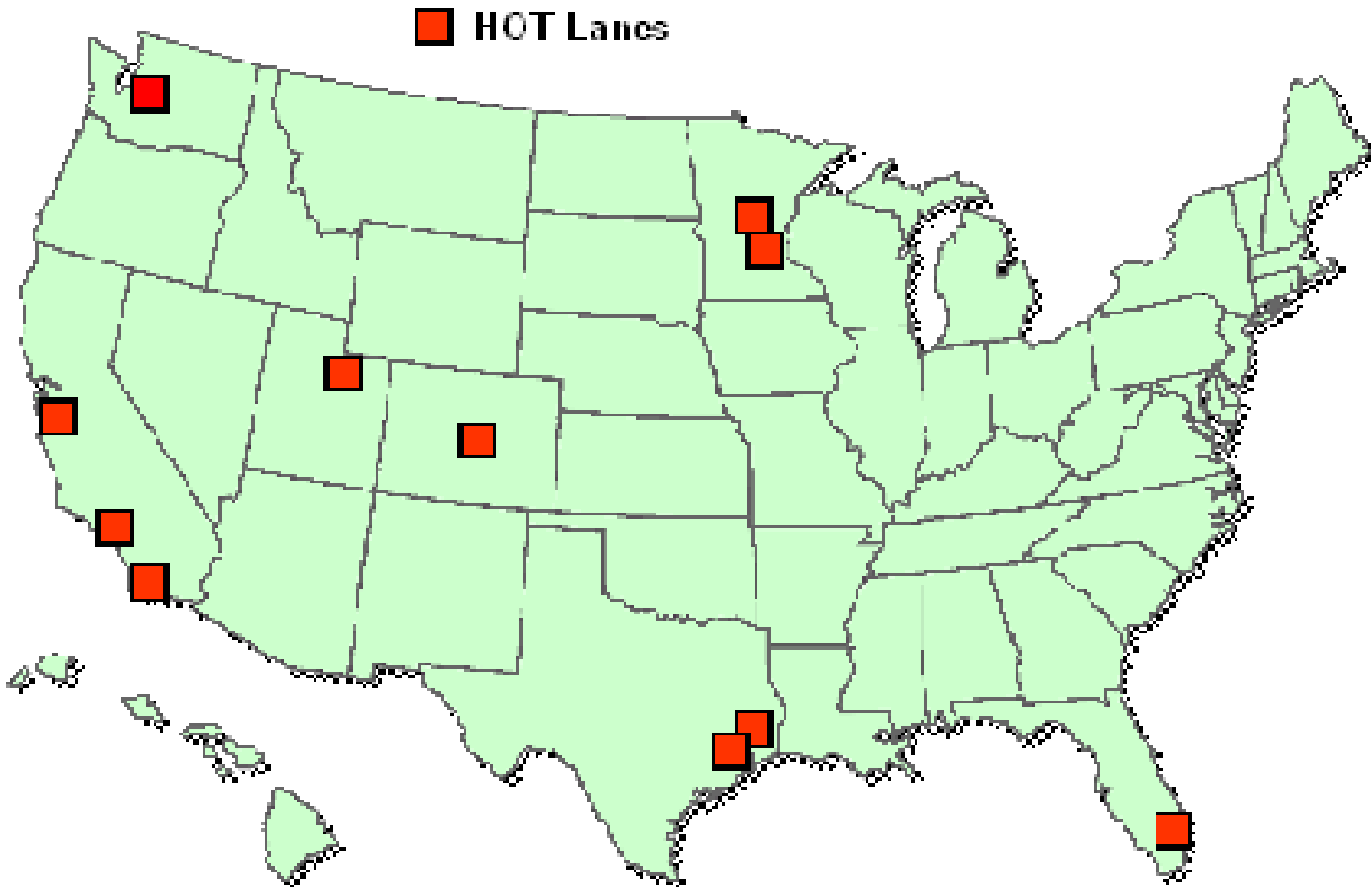
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- **A type of managed lanes that allows lower-occupancy vehicles to pay to gain access, but free for high-occupancy vehicles**
- **One form of congestion pricing**
- **First conceived of by Elliott (1976)\* and then advocated by Fielding and Klein (1993)**
- **The term “HOT Lanes” first suggested by Fred Laurence Williams at FTA in 1992**
- **First implemented in the U.S. in 1995 (SR91, CA)**

\*Source: <http://www.claremontmckenna.edu/govt/welliott/discoveries.htm>

# Current Practices

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# 95 Express in Florida



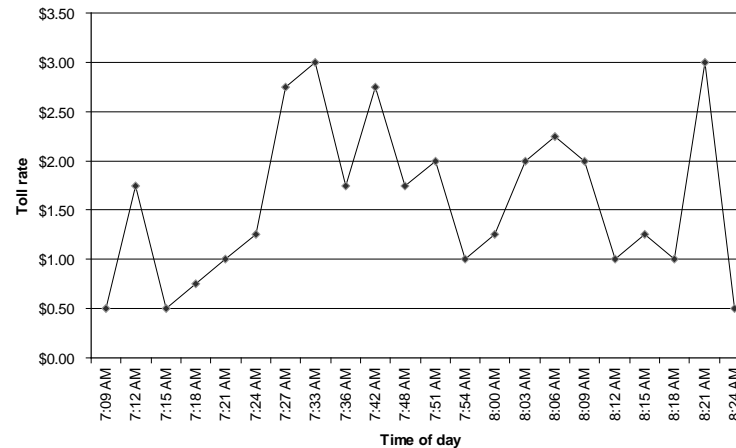
*Opened to traffic on July 11, 2008 and tolling started December 5, 2008 and January 15, 2010 for the northbound and southbound respectively*

# Pricing Strategies for HOT Lanes

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- **Objectives**
  - **Provide a superior uncongested level of service on the HOT lanes while maximizing the throughput rate of the freeway (FHWA, 2003)**
- **Key Question**
  - **What is the right price to charge?**
- **Dynamic Pricing of HOT Lanes**
  - **Toll varies as often as every a few minutes in response to real-time traffic condition**

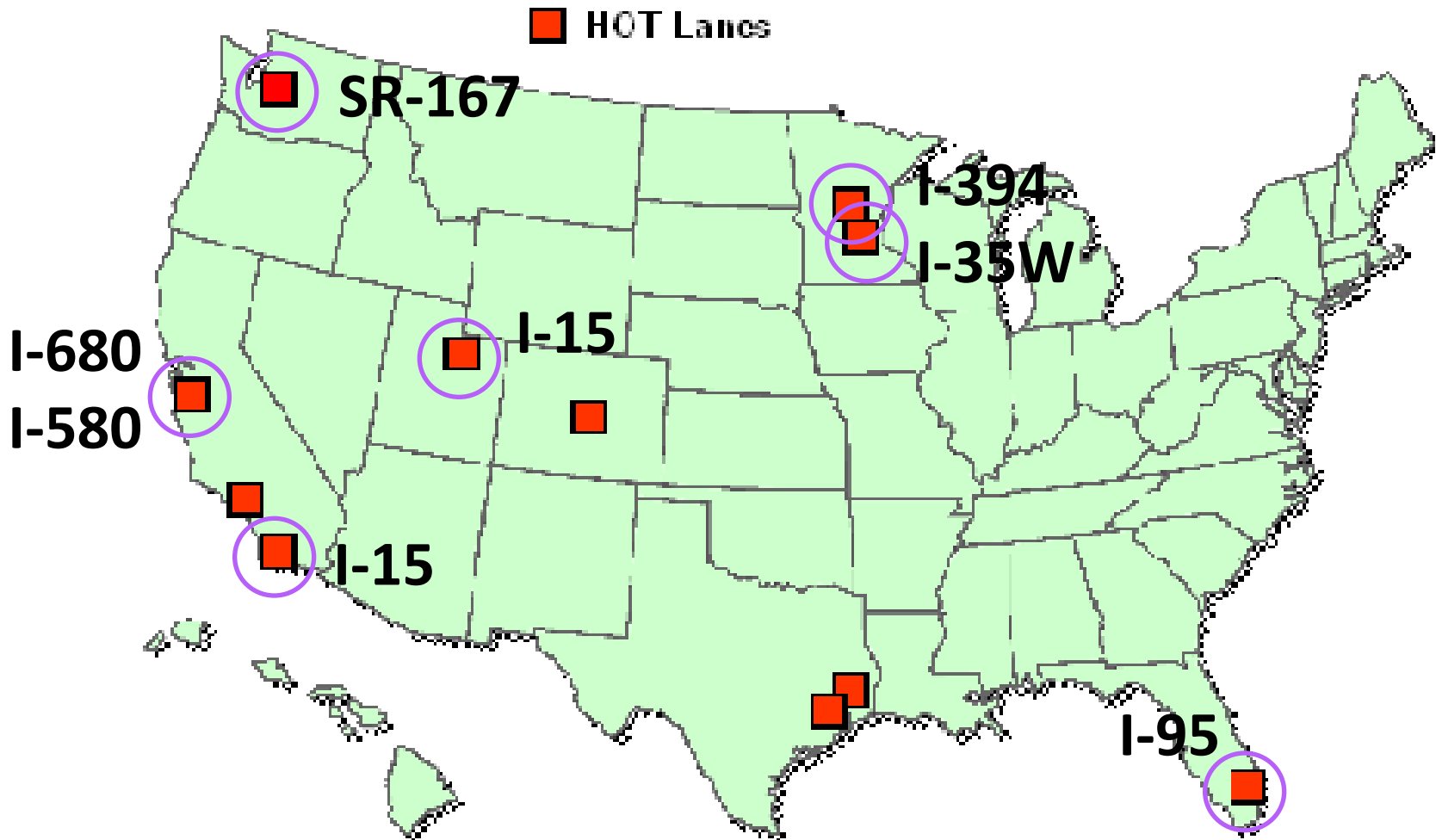
# Dynamic Pricing





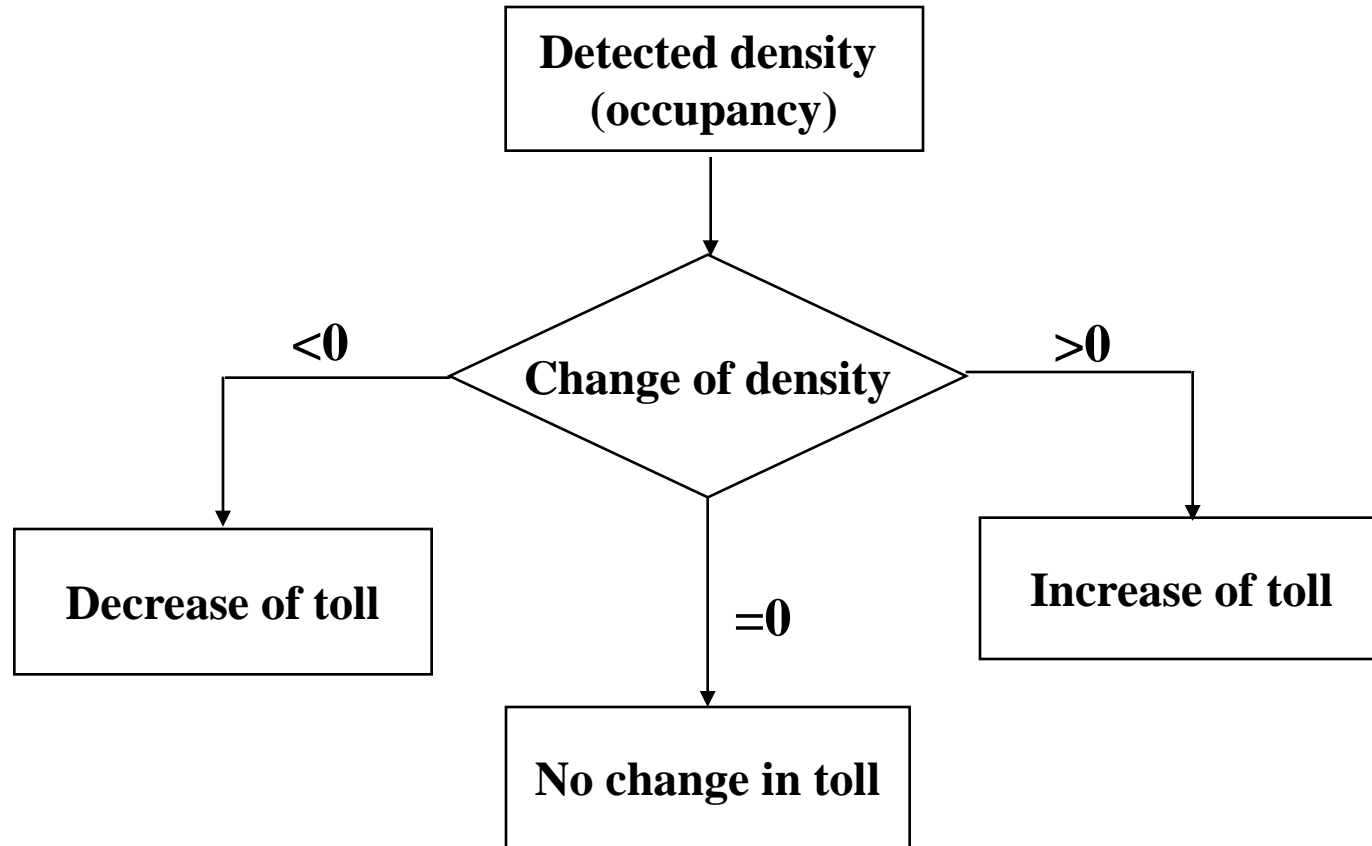
# Dynamic Pricing of HOT Lanes

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# Heuristic Approach

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# Heuristic Approach (Cont'd)

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- **The above approach is similar to those implemented in practice, and has been demonstrated mostly effective in maintaining the targeted level of service**
- **It reflects the following philosophy:**
  - **“You're trying to price the toll lane and you set the price to maintain traffic volume for something like LOS-B to D. What's happening in adjoining lanes cannot be allowed to influence your price” from the CON-PRIC listserv on April 8, 2010**

# Limitation

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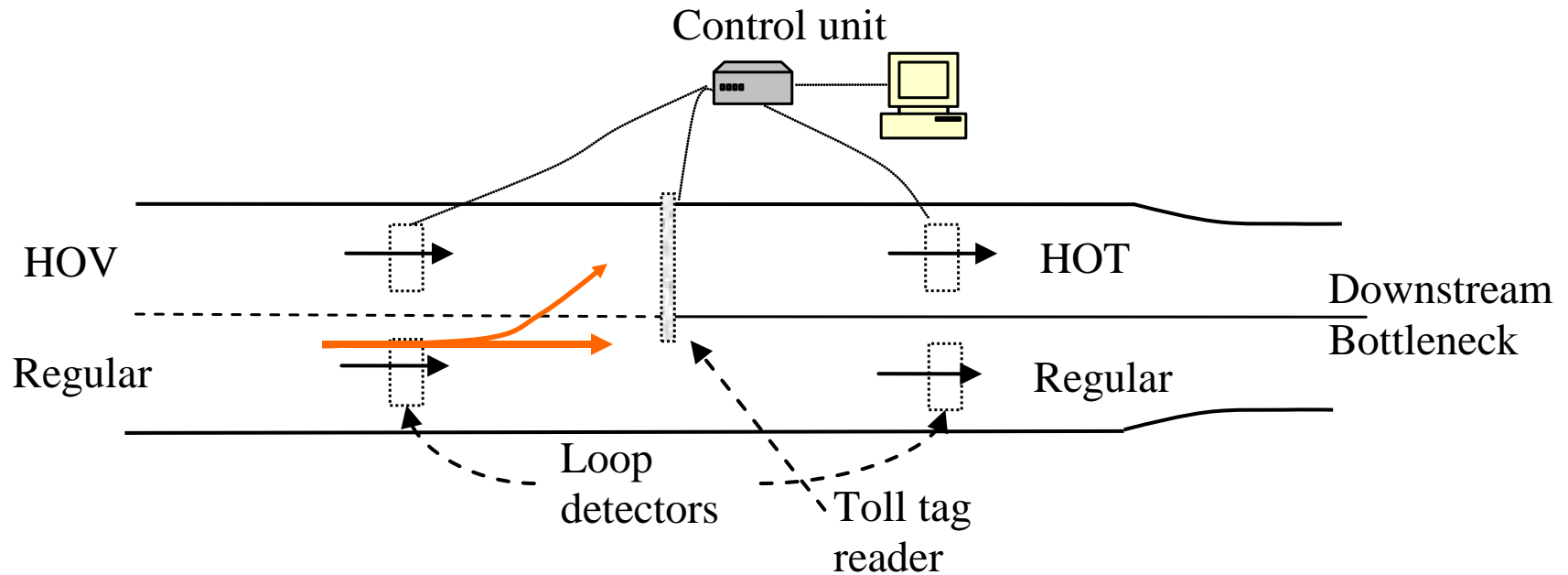
- **The above approach may not lead to a full utilization of available capacity at HOT lanes**
- **To achieve both objectives, it is critical to monitor both the priced and unpriced lanes since the traffic conditions on those lanes will affect drivers' willingness to pay**

# Potential Improvements

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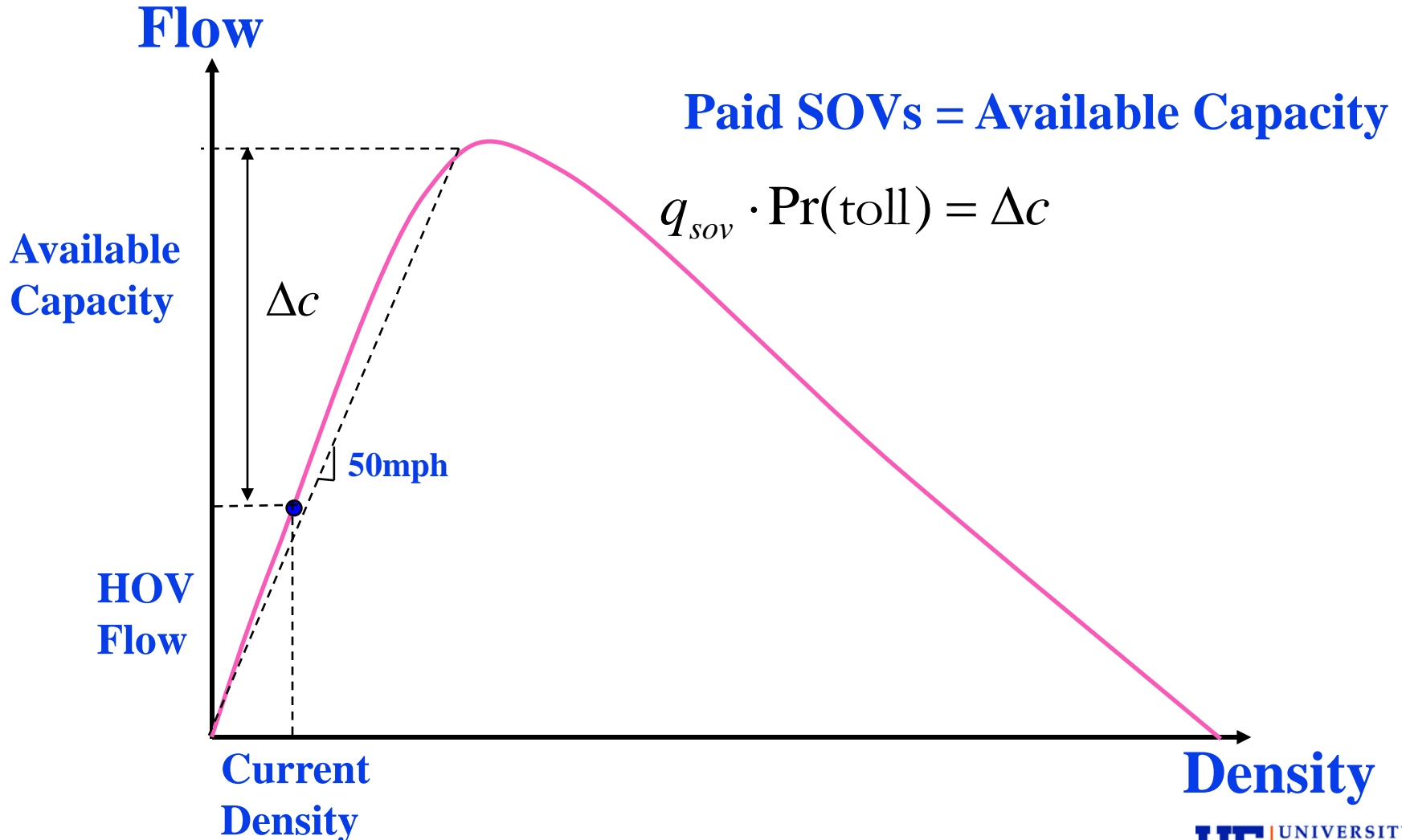
- **Adjusting the toll rate of HOT lane based on the traffic conditions on both HOT and GP lanes**
- **Displaying travel time information on DMS to help drivers to make lane-choice decision**
- **The above will allow the toll to provide a correct pricing signal on the value of traveling on HOT lane**
  - **“There is a huge disconnect with most drivers, who assume the higher tolls mean the free lanes are backed up and that if they pay they will get to go faster.” - Michael Turnbell, Sun Sentinel, April 6, 2010**

# Improved Pricing Approach



1. How many SOVs should be allowed to use HOT lane?
2. What is the right price to attract this many SOVs?

# Fundamental Diagram



# Charge a Right Price (Cont'd)

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- **Lane-Choice Model**

$$\text{Pr}(\text{toll}) = \frac{1}{1 + \exp(-\alpha \cdot \text{Travel time saving} + \beta \cdot \text{Toll} + \gamma)}$$

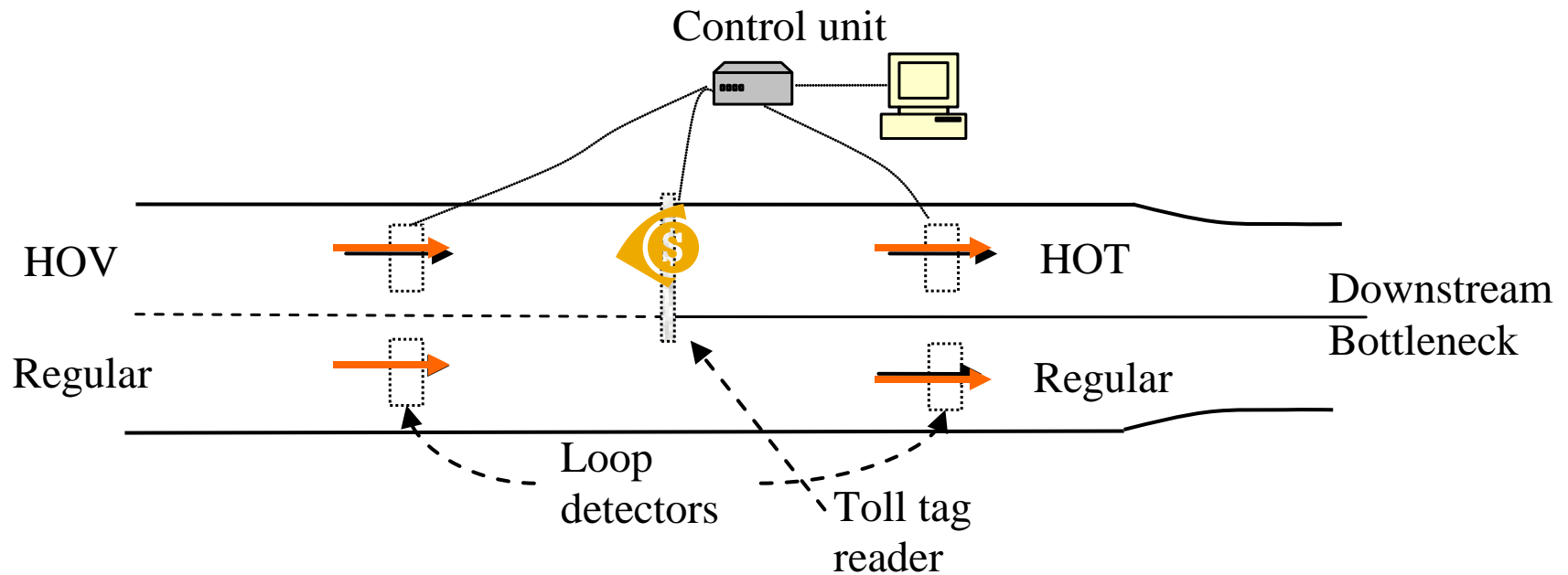
- **If all parameters are known, the optimal toll can be easily calculated.**

$$\text{Toll} = \frac{\alpha}{\beta} \cdot \text{Travel time saving} - \frac{\gamma}{\beta} + \frac{1}{\beta} \ln\left(\frac{q_{sov}}{\Delta c} - 1\right)$$

- **However, the parameters are unknown, particularly:**  $\frac{\alpha}{\beta} = \text{Value of Travel Time}$



# Learning of Willingness-to-Pay



# Learning of Willingness-to-Pay (Cont'd)

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- **“Revealed-preference experiments” are being conducted every a few minutes**
- **Facing the displayed toll, drivers made their choice based on their willingness-to-pay. The choice outcomes are captured by traffic measurements**
- **Drivers’ revealed willingness-to-pay can be learned by analyzing traffic measurements (flow, occupancy and speed) at limited sensor locations**

$$\text{Toll} = \frac{\alpha}{\beta} \cdot \text{Travel time saving} - \frac{\gamma}{\beta} + \frac{1}{\beta} \ln \left( \frac{q_{sov}}{\Delta c} - 1 \right)$$

# Proactive Self-Learning Pricing Approach

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- **Data mining. Analyzing traffic measurements (flow, occupancy and speed) at limited sensor locations for:**
  - **(Revealed) willingness-to-pay learning**
  - **Demand forecast**
  - **Traffic state estimation**
- **Toll optimization to maximize throughput while ensuring**
  - **A superior level of service on HOT lanes**
  - **Incremental change of toll rate**
  - **Equity among users**

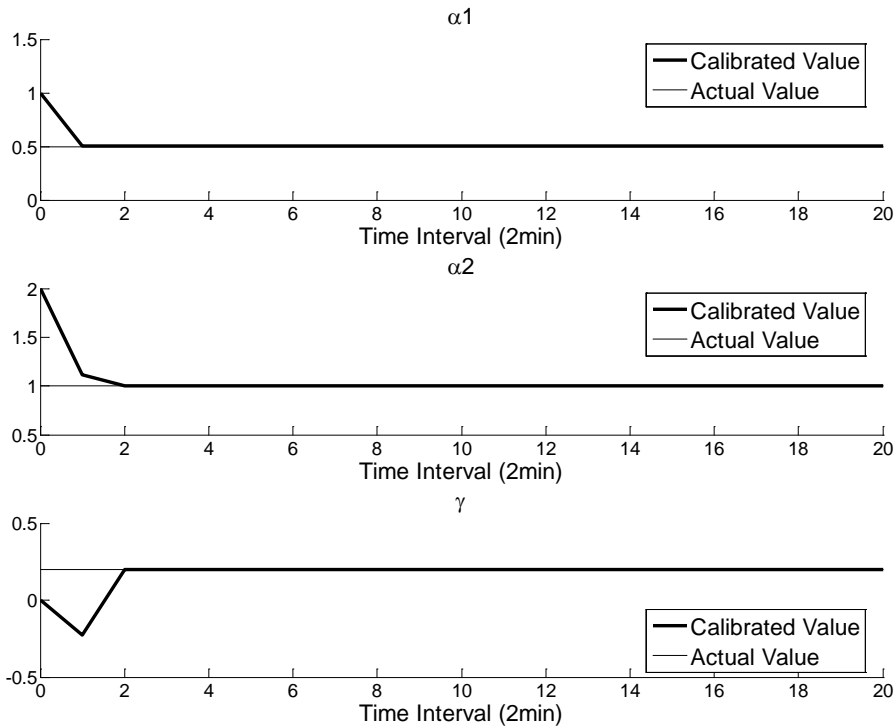
# Mathematical Techniques

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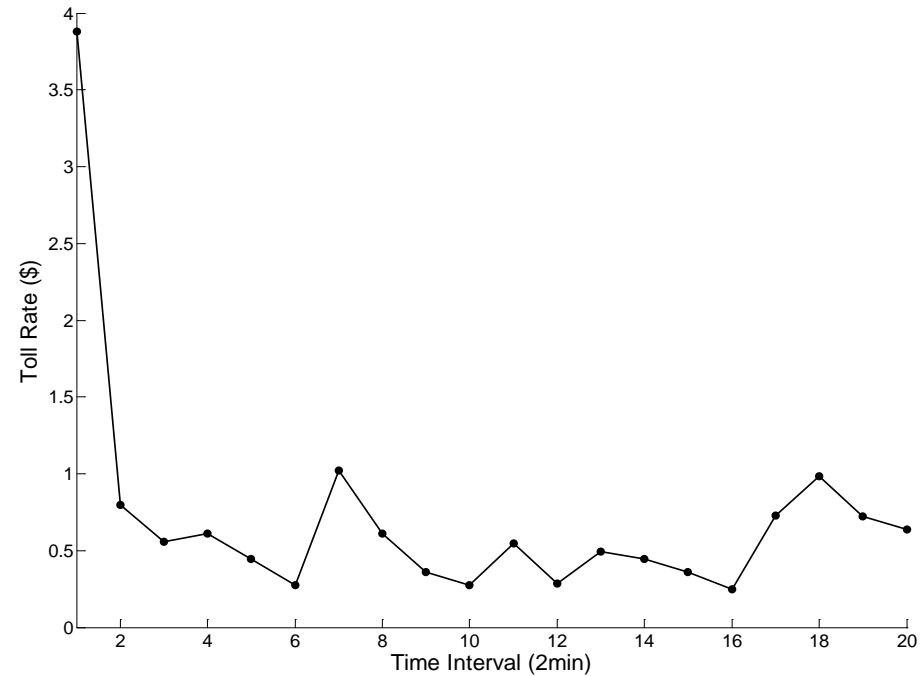
- **Data Mining**
  - **Kalman filtering for willingness-to-pay**
  - **Unscented Kalman filtering for traffic state estimation**
  - **Bayesian inference for demand forecast**
- **Toll Optimization**
  - **Rolling-horizon framework**
  - **Robust optimization to address uncertainty**

# Simulation Study

- Parameter Calibration

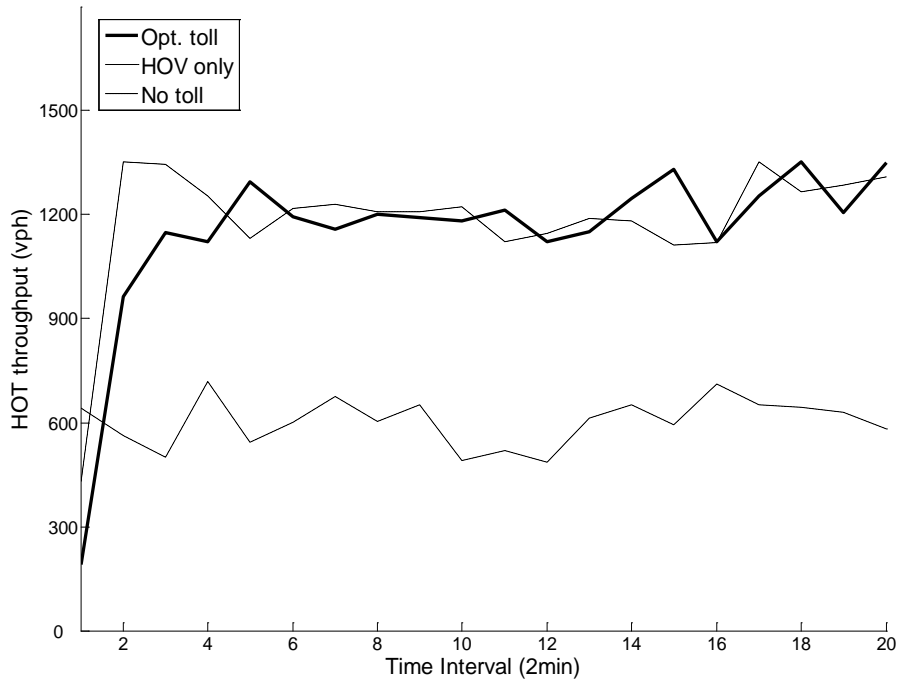


- Optimal Toll Rates

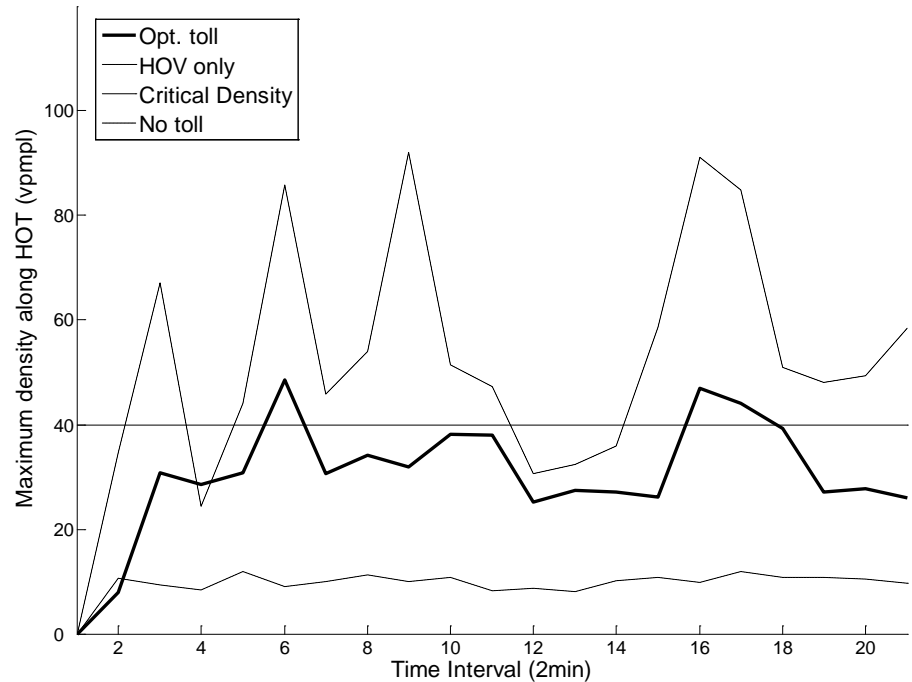


# Simulation Study (Cont'd)

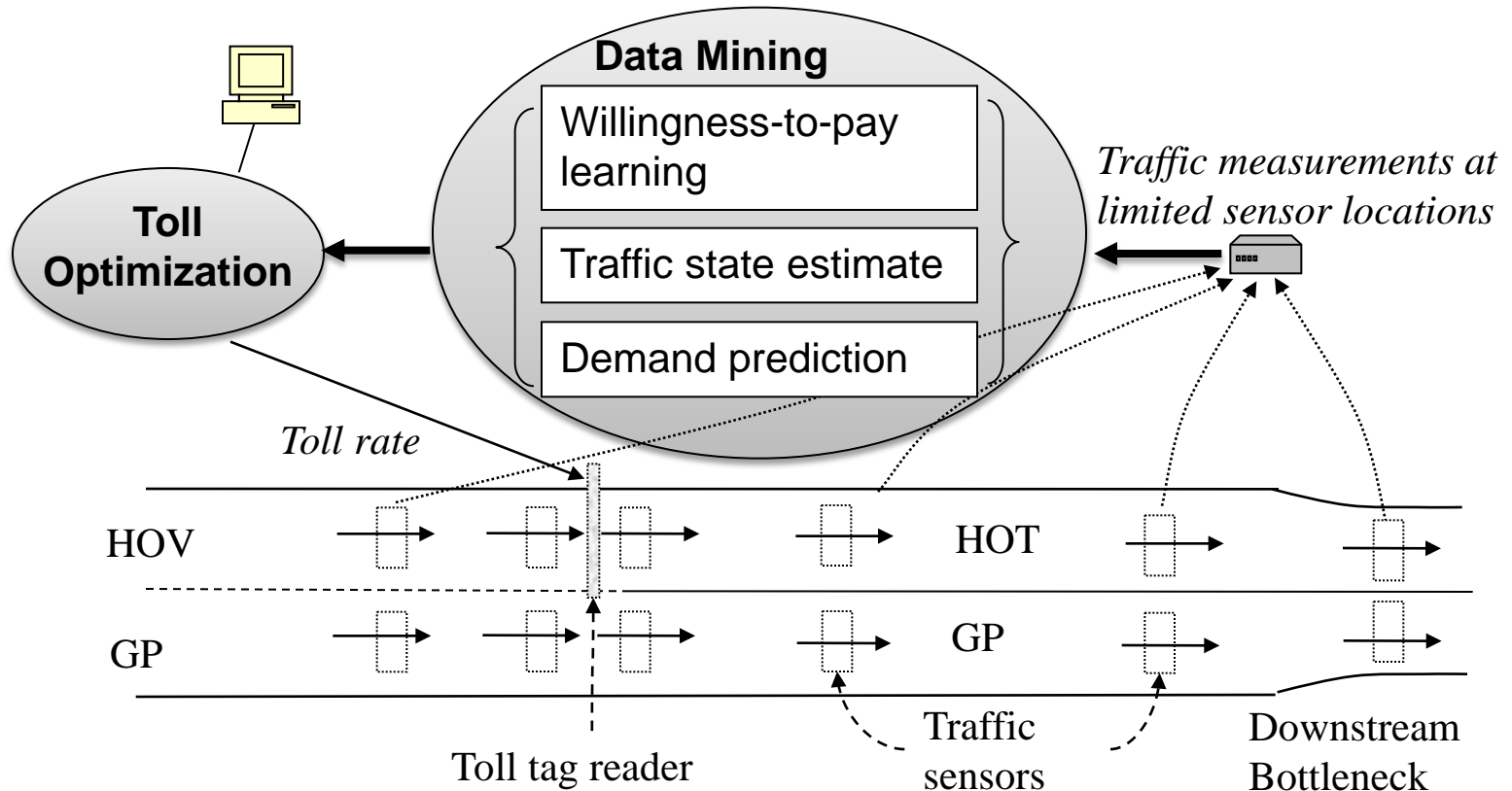
## •HOT Throughput



## •HOT Density



# Summary



# Implication

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- **Transportation industry is making transition from being “data poor” to “data rich”**
- **Freeway operations can be data driven**
  - **System performance monitoring**
  - **“Hidden” facts or patterns on both the demand and supply sides can be identified**
  - **Data-driven adaptive control for efficiency, safety and reliability**



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# Questions?



# For more information

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