

# Calibrating Speed-Density Functions for Mesoscopic Traffic Simulation

Ramachandran Balakrishna<sup>1</sup>

Constantinos Antoniou<sup>2</sup>

Haris N. Koutsopoulos<sup>3</sup>

Yang Wen<sup>4</sup>

Moshe Ben-Akiva<sup>4</sup>

*<sup>1</sup>Caliper Corporation, USA*

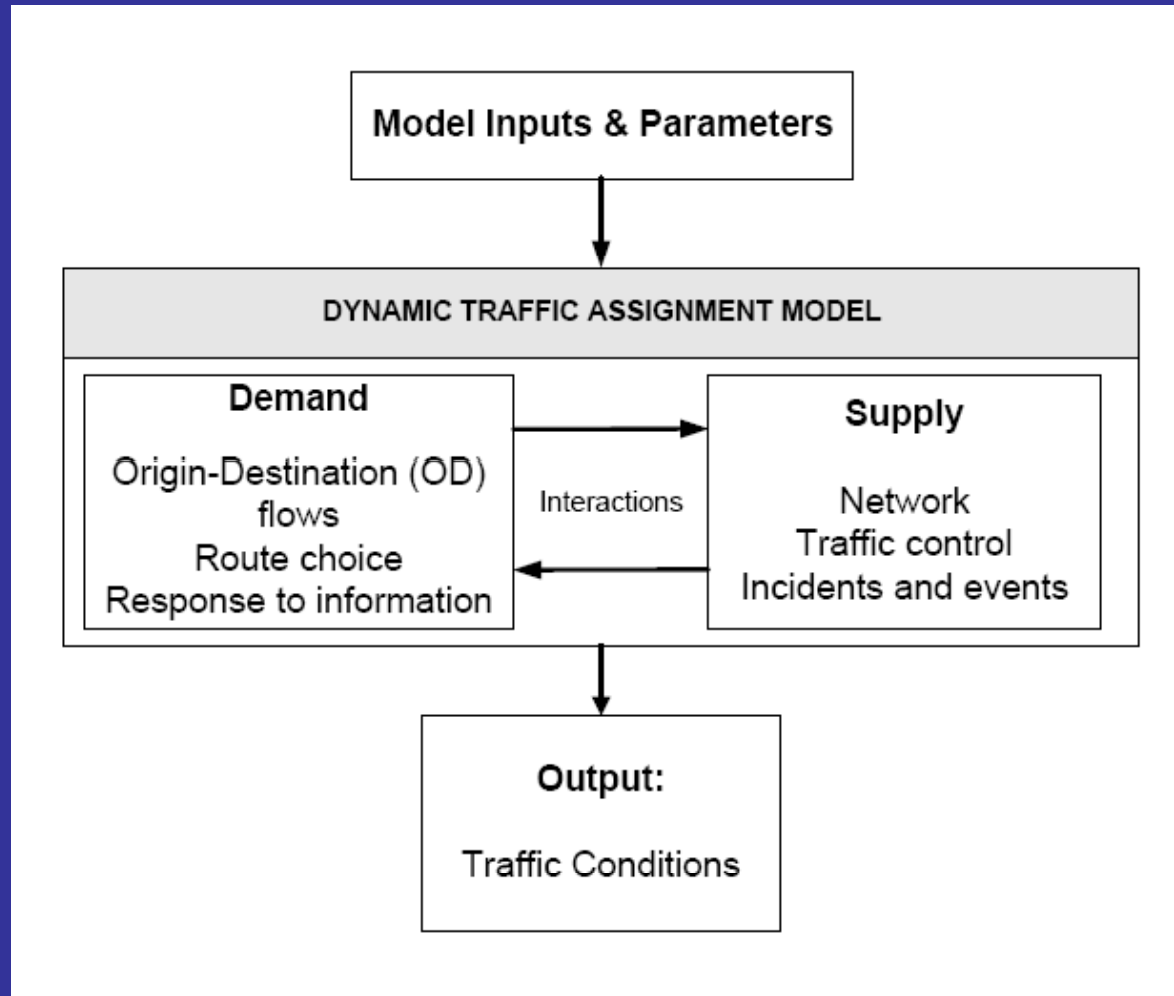
*<sup>2</sup>National Technical University of Athens, Greece*

*<sup>3</sup>The Royal Institute of Technology, Sweden*

*<sup>4</sup>Massachusetts Institute of Technology, USA*

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# Motivation



- Key supply input: speed-density functions for all road segments

# Literature Review

- Off-line
  - Curve-fitting
    - *Leclercq (2005), Van Aerde & Rakha (1995)*
  - Parameter subsets
    - *Munoz et al. (2004)*
  - Freeway corridors and sections
    - *Ngoduy & Hoogendoorn (2003), Ngoduy et al. (2006)*
  - General networks
    - *Park et al. (2006), Kunde (2002), Balakrishna et al. (2007)*
- On-line
  - Adjustments in response to real-time data
    - *Doan et al. (1999), Tavana & Mahmassani (2000), Wang & Papageorgiou (2005), Antoniou et al. (2007)*

# Case Studies

- (I) Los Angeles, CA (off-line)
  - (II) Lower Westchester County, NY (off-line)
  - (III) Southampton, UK (on-line)
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- DynaMIT: Mesoscopic model to be calibrated
    - Disaggregate (microscopic) demand
    - Aggregate (macroscopic) supply

## Case Studies (contd.)

- DynaMIT speed-density function form

$$v = v_{\max} \left[ 1 - \left( \frac{k - k_{\min}}{k_{\text{jam}}} \right)^{\beta} \right]^{\alpha}$$

- Performance measures

$$RMSN = \frac{\sqrt{S \sum_{i=1}^S (y_i - \hat{y}_i)^2}}{\sum_{i=1}^S y_i}$$

$y_i$  : observed (count, speed)

$\hat{y}_i$  : simulated (count, speed)

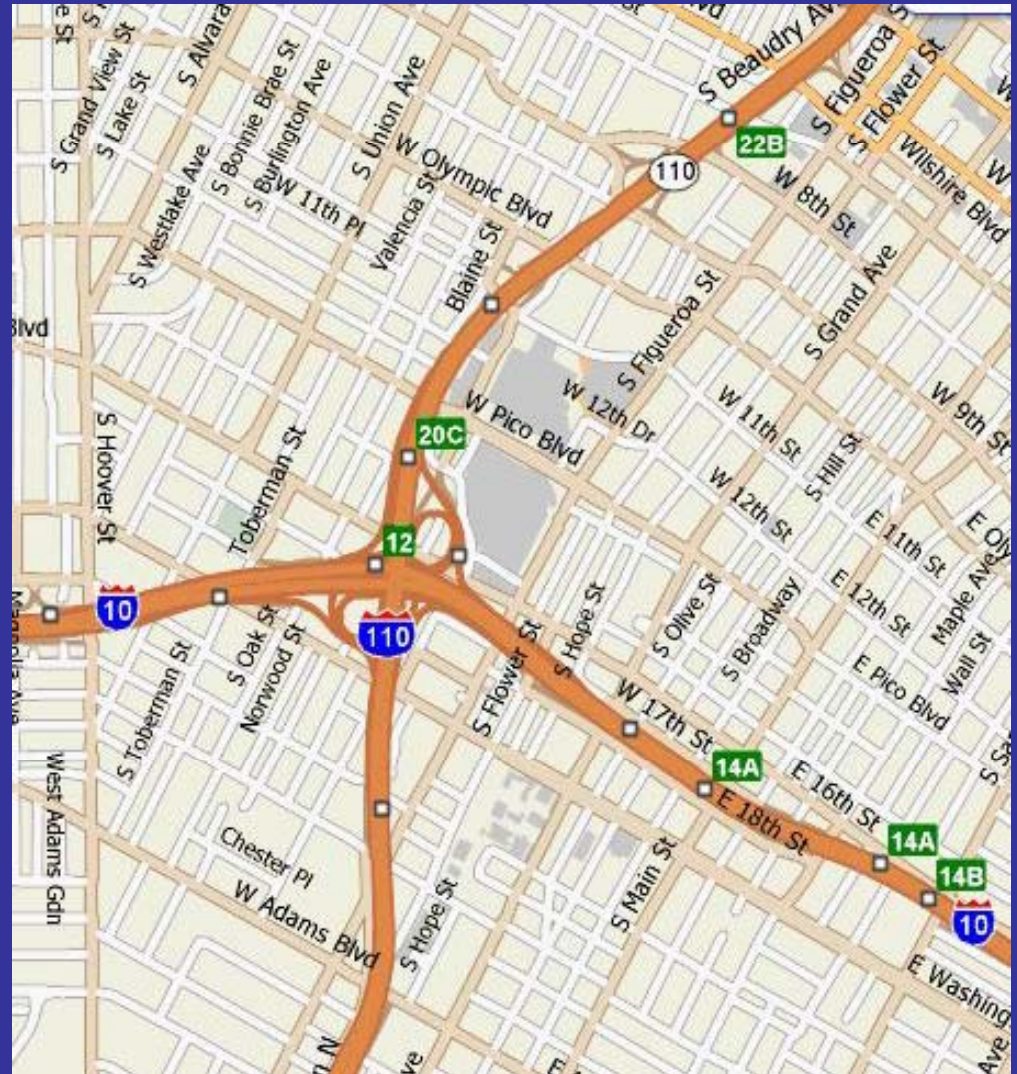
$S$  : number of data points

# Case Studies (contd.)

- Methodology
  - Large-scale optimization
    - Match DTA outputs to data
  - Highly non-linear
  - Solution algorithms
    - SPSA, Kalman Filter
- Data issues
  - Very sparse sensor coverage
  - Measurement errors
  - Spatial inconsistencies

# Case Study I: Los Angeles, CA

- 740 segments
- Freeways, arterials
- Heavy congestion
  - Staples Center
  - Conventions
- Loop data
  - Counts, occupancies



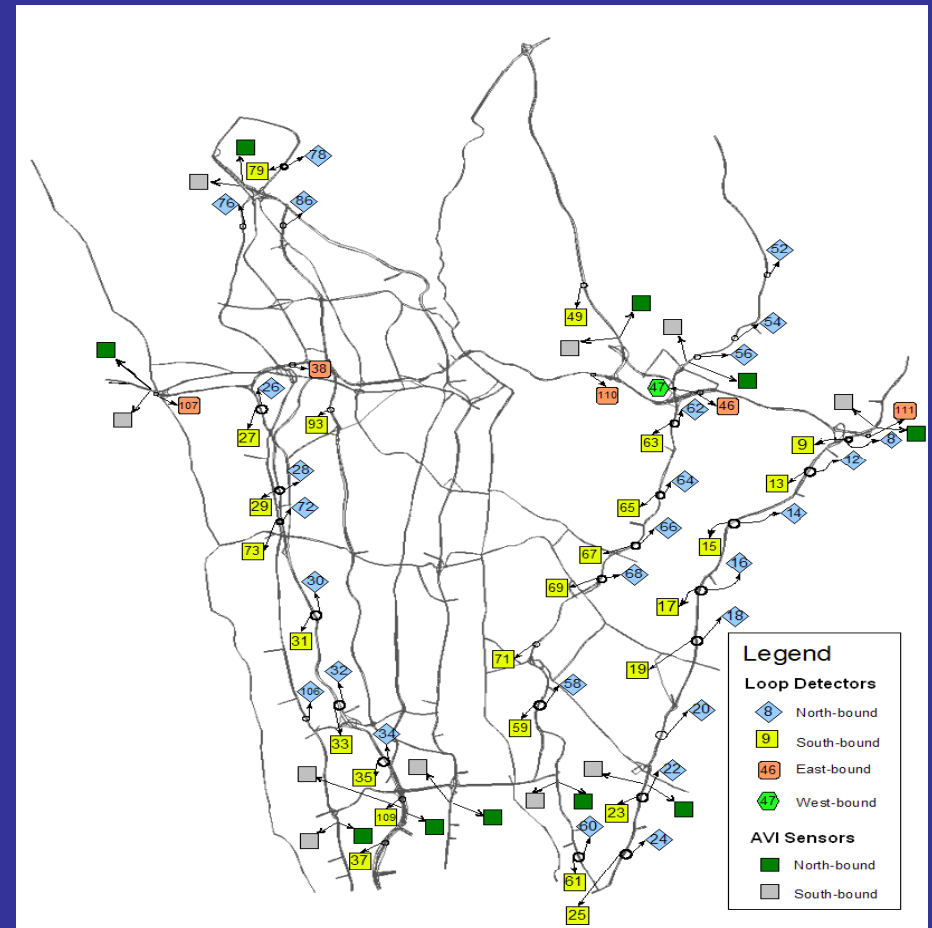
# Case Study I: Results

Estimator	Fit to Counts (RMSN <sup>c</sup> )		Fit to Speeds (RMSN <sup>s</sup> )	
	Freeway	Arterial	Freeway	Arterial
Ref	0.218	0.239	0.181	0.203
S(c)	0.149	0.178	0.119	0.131

- Ref
  - Local fitting of speed-density functions
- S(c)
  - Network-level supply calibration with counts
  - Demand same as Ref

# Case Study II: Lower Westchester County, NY

- Freeways
- 8 time intervals
- Data
  - Loop counts, speeds
  - AVI (Automatic Vehicle ID)

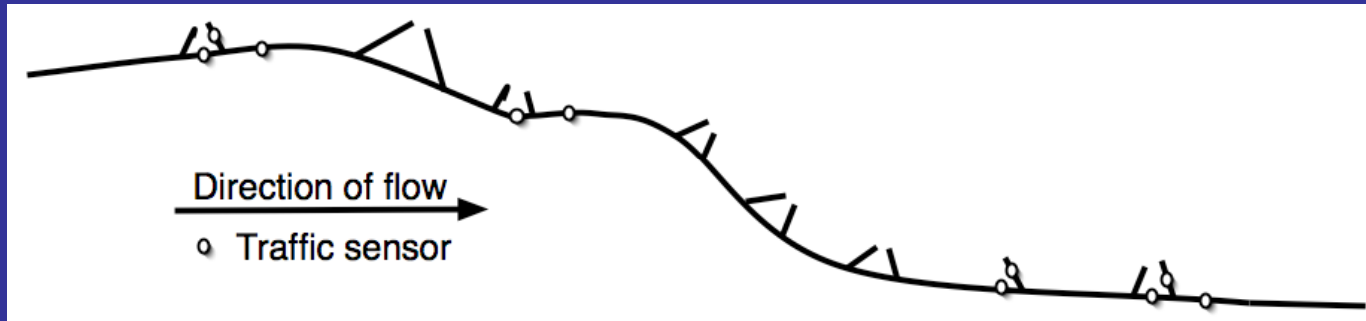


# Case Study II: Results

- Calibration variables
  - Dynamic OD flows
  - Speed-density parameters
  - Capacities

	<b>Fit to counts (RMSN<sup>c</sup>)</b>	<b>Fit to speed (RMSN<sup>s</sup>)</b>
<b>A priori</b>	0.253	0.291
<b>Count data</b>	0.200	0.222
<b>Count+AVI data</b>	0.182	0.212

# Case Study III: Southampton, UK

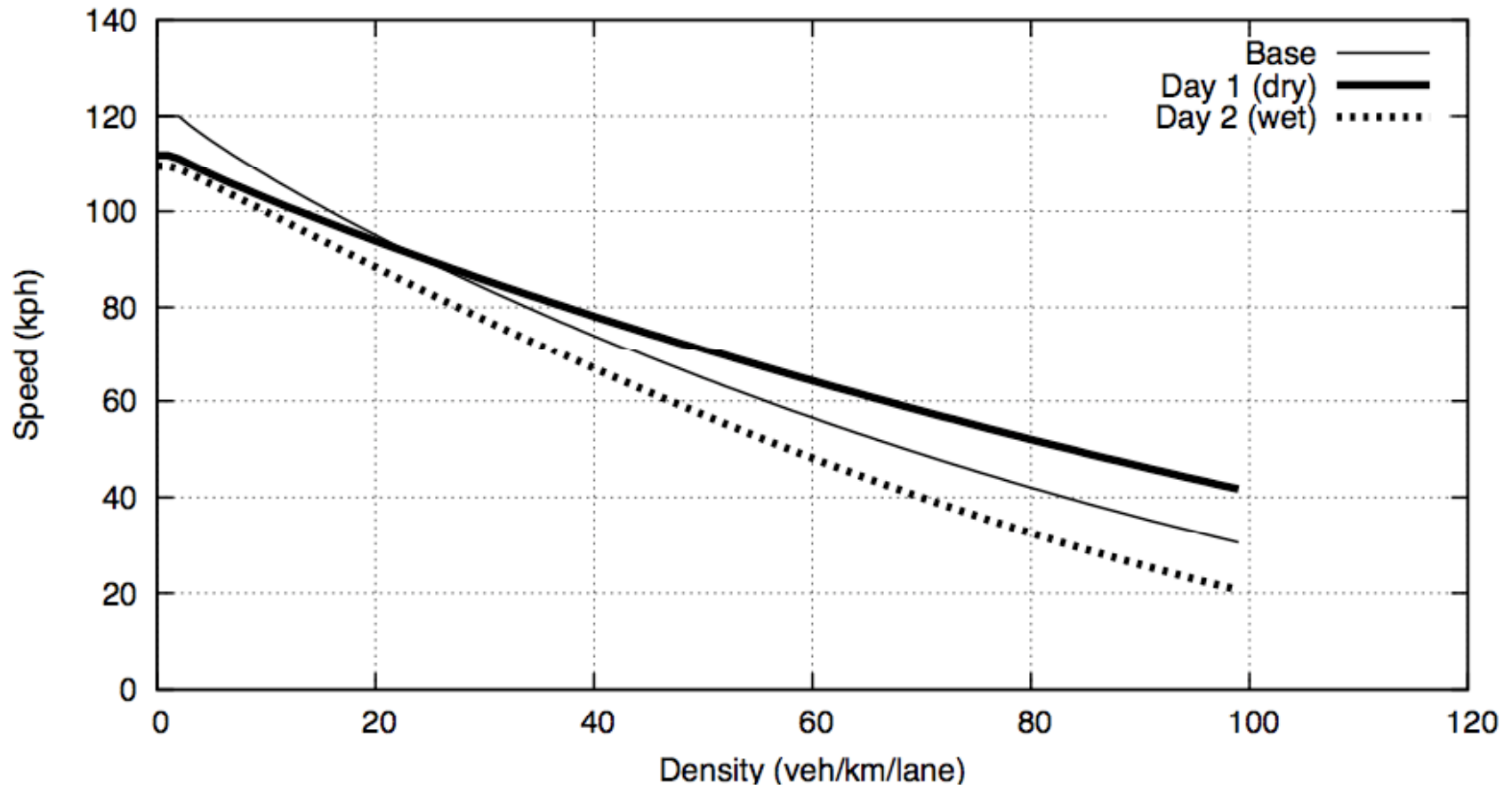


- On-line
  - Demand calibration only (base)
  - Demand + supply calibration
    - Dry weather
    - Wet weather

## Case Study III: Results

	Demand-only		Demand and supply	
	Fit to counts (RMSN <sup>c</sup> )	Fit to speeds (RMSN <sup>s</sup> )	Fit to counts (RMSN <sup>c</sup> )	Fit to speeds (RMSN <sup>s</sup> )
<b>Dry weather</b>	0.128	0.126	0.109	0.112
<b>Wet weather</b>	0.115	0.131	0.102	0.117

## Case Study III: Results (contd.)



- Re-calibrated speeds lower for wet day

# Conclusion

- Speed-density functions
  - Capture traffic dynamics in many DTA models
  - Have several parameters for each segment
  - Require calibration against real traffic data
- DynaMIT applications
  - Network-wide calibration
  - Off-line, on-line
  - Replicates counts and speeds
  - Adjusts parameters for conditions on given day