

# Multi-Modal Traffic Control for Sustainable Urban Living

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## Challenges

- Traffic congestion significantly degrades the quality of life in urban environments, resulting in lost time, wasted fuel resources, and reduced air quality for urban residents
- Multi-modal traffic flows: in addition to vehicles, pedestrians, bicyclists, and transit riders move in urban environments
- Sustainable urban living requires that all traffic modes be appropriately balanced, and walking is critical to the overall effectiveness of urban mobility in supporting other modes



## **Our Work**

- Investigate multi-model urban traffic control in the context of SURTRAC, a live, urban adaptive signal system testbed
- Design extensions that enable real-time adaptive control of multi-modal traffic flows, especially vehicles and pedestrians
- Evaluate the effectiveness and impacts of these extensions using both simulations and analysis based on field data

# **SURTRAC (Scalable URban TRAffic Control) System**

#### Schedule-Driven Intersection Control

- Treat each intersection as a single machine scheduling problem
- Use aggregate representation of traffic flows to identify input jobs
- Use schedule to decide whether to extend or switch phase

## Neighbor Coordination Mechanisms

- Communicate schedules to neighbors to extend visibility
- Layer mechanisms for coping with mis-coordinated situations
- Xie, X-F., S. Smith, G. Barlow, "Smart and Scalable Urban Signal Networks: Methods and Systems for Adaptive Traffic Signal Control", Patent Pending, Appl. No. 14/308,238, 2014.
  Xie, X-F., S. Smith, T.-W. Chen. Real-time traffic control for sustainable urban living. In
- Xie, X-F., S. Smith, G. Barlow, "Schedule-Driven Coordination for Real-Time Traffic Network Control", International Conference on Automated Planning and Scheduling, 323-331, 2012.

IEEE International Conference on Intelligent Transportation Systems, 1863-1868, 2014.

• Xie, X-F., S. Smith, L. Lu, G. Barlow, "Schedule-Driven Intersection Control", Transportation Research Part C: Emerging Technologies, 24:168-189, 2012.

## **Accommodating Multi-Model Traffic**

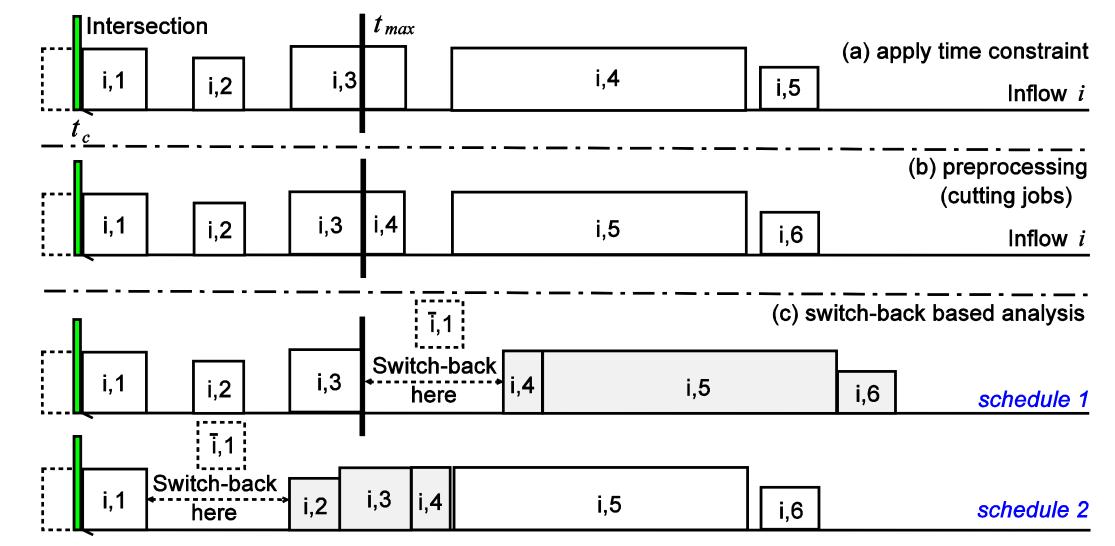
#### **Multi-Model Formulation**

normalized cost of job  $j = \sum_{m \in M} n_m^j V_m O_m L_m$ 

m: a traffic mode in set  $M=\{Ped, Veh, ...\}$ ; n: the number of entities V: relative time value; O: average occupancy; L: coordination flag

#### **Maximal Wait Time Constraint**

- Set a maximum wait time limit (at  $t_{max}$ ) as pedestrian is detected
- Augment the scheduling process with phase switching analysis

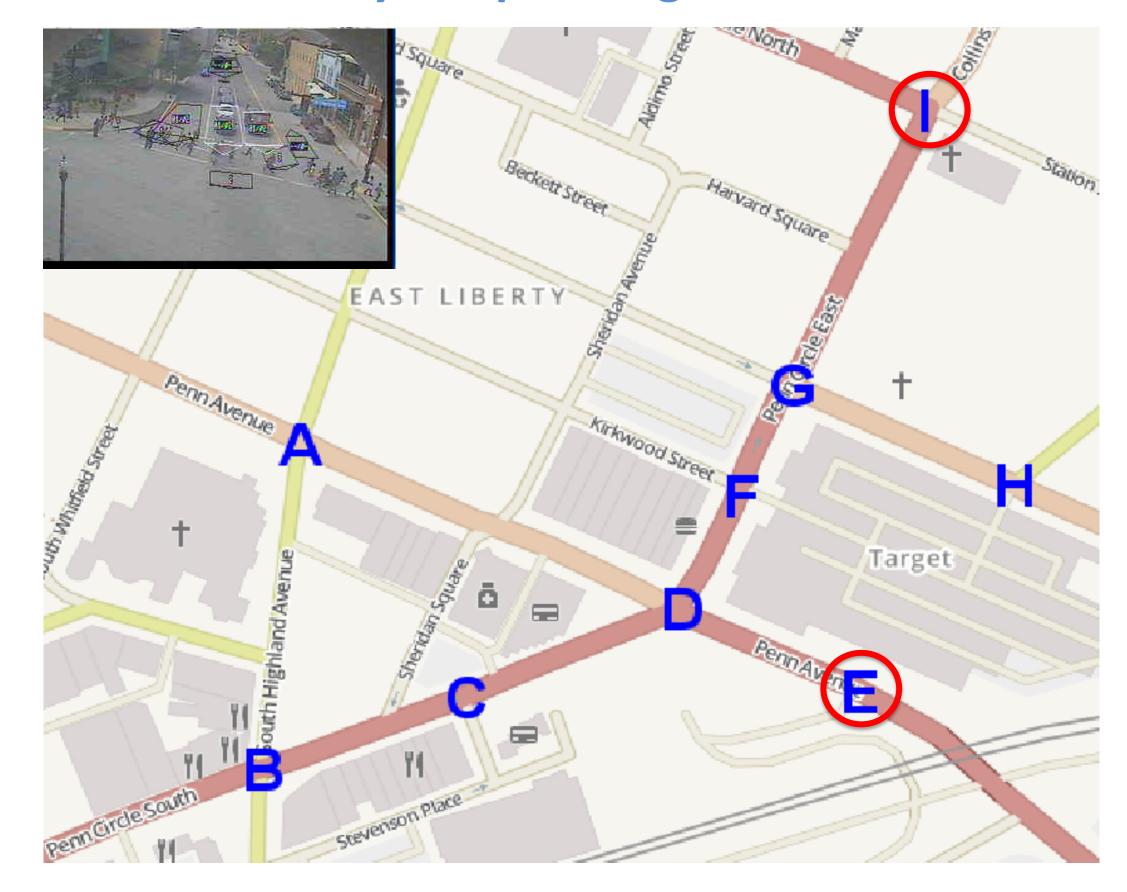


#### **Vehicle-Pedestrian Mixed Coordination Protocol**

- Coordinate major vehicle flow through a "subordinate" neighbor
- Response to pedestrians waiting at side streets of the neighbor

Integration: MTC(n of Ped, wait time limit) or Coordination Protocol

# The East Liberty Adaptive Signal Testbed



#### **Simulation Results: Wait Time under Different Control Strategies**

| $\lambda = 1/(2.5 \text{ seconds})$ |   |   | $\lambda = 1/(10 \text{ seconds})$   |   |  | $\lambda = 1/(40 \text{ seconds})$  |  |   |
|-------------------------------------|---|---|--|---|--|---|--|---|
| pw                                  | vw                                      | ww  | pw   | vw  | ww   | pw  | vw   | ww  |
| 46.18                               | 36.20                                   | 38.85   | 47.85  | 36.20   | 37.12  | 43.69   | 36.20  | 36.36   |
| 52.83                               | 49.81                                   | 50.61   | 53.02  | 49.81   | 50.06  | 40.63   | 38.36  | 38.40   |
| 57.52                               | 22.04                                   | 31.46   | 59.23  | 21.58   | 24.57  | 56.94   | 21.66  | 22.38   |
| 21.74                               | 22.74                                   | 22.47   | 24.16  | 22.20   | 22.36  | 28.31   | 21.83  | 21.97   |
| 17.14                               | 22.76                                   | 21.27   | 16.26  | 22.73   | 22.22  | 14.80   | 22.44  | 22.28   |
| 12.50                               | 23.49                                   | 20.57   | 16.07  | 22.76   | 22.23  | 21.36   | 22.33  | 22.31   |
|                                     | <i>pw</i> 46.18 52.83 57.52 21.74 17.14 | pw         vw           46.18         36.20           52.83         49.81           57.52         22.04           21.74         22.74           17.14         22.76 | pw         vw         ww           46.18         36.20         38.85           52.83         49.81         50.61           57.52         22.04         31.46           21.74         22.74         22.47           17.14         22.76         21.27 | pw         vw         ww         pw           46.18         36.20         38.85         47.85           52.83         49.81         50.61         53.02           57.52         22.04         31.46         59.23           21.74         22.74         22.47         24.16           17.14         22.76         21.27         16.26 | pw         vw         ww         pw         vw           46.18         36.20         38.85         47.85         36.20           52.83         49.81         50.61         53.02         49.81           57.52         22.04         31.46         59.23         21.58           21.74         22.74         22.47         24.16         22.20           17.14         22.76         21.27         16.26         22.73 | pw         vw         ww         pw         vw         ww           46.18         36.20         38.85         47.85         36.20         37.12           52.83         49.81         50.61         53.02         49.81         50.06           57.52         22.04         31.46         59.23         21.58         24.57           21.74         22.74         22.47         24.16         22.20         22.36           17.14         22.76         21.27         16.26         22.73         22.22 | pw         vw         ww         pw         vw         ww         pw           46.18         36.20         38.85         47.85         36.20         37.12         43.69           52.83         49.81         50.61         53.02         49.81         50.06         40.63           57.52         22.04         31.46         59.23         21.58         24.57         56.94           21.74         22.74         22.47         24.16         22.20         22.36         28.31           17.14         22.76         21.27         16.26         22.73         22.22         14.80 | pw         vw         ww         pw         vw         ww         pw         vw           46.18         36.20         38.85         47.85         36.20         37.12         43.69         36.20           52.83         49.81         50.61         53.02         49.81         50.06         40.63         38.36           57.52         22.04         31.46         59.23         21.58         24.57         56.94         21.66           21.74         22.74         22.47         24.16         22.20         22.36         28.31         21.83           17.14         22.76         21.27         16.26         22.73         22.22         14.80         22.44 |

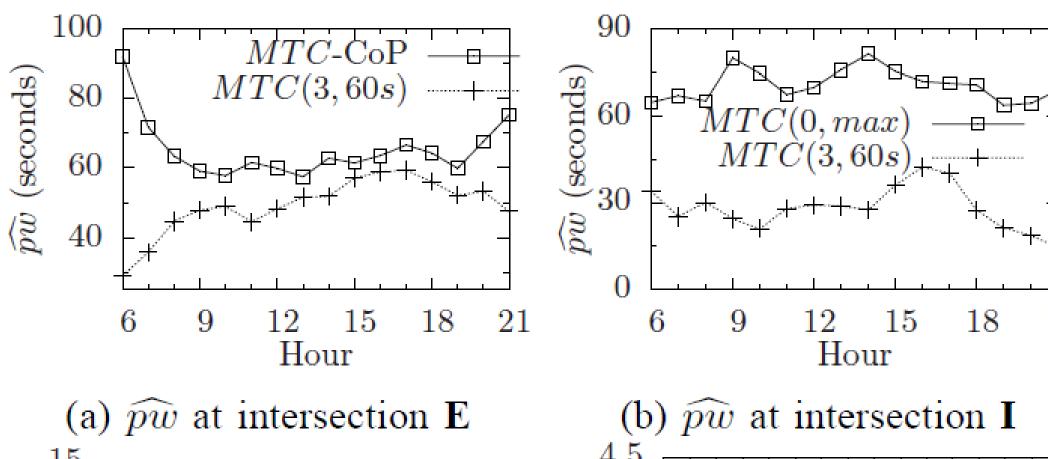
| Intercontion     | $\lambda = 1$ | $\lambda = 1/(2.5 \text{ seconds})$ |       |       | $\lambda = 1/(10 \text{ seconds})$ |       |       | $\lambda = 1/(40 \text{ seconds})$ |       |  |
|------------------|---------------|-------------------------------------|-------|-------|------------------------------------|-------|-------|------------------------------------|-------|--|
| Intersection I   | pw            | vw                                  | ww    | pw    | vw                                 | ww    | pw    | vw                                 | ww    |  |
| Fixed-Time       | 34.75         | 36.20                               | 35.83 | 36.92 | 36.20                              | 36.26 | 32.05 | 36.20                              | 36.11 |  |
| Vehicle-Actuated | 12.00         | 37.25                               | 30.66 | 12.66 | 37.29                              | 35.30 | 13.01 | 36.58                              | 36.06 |  |
| MTC(0, max)      | 55.55         | 20.63                               | 29.75 | 57.24 | 20.59                              | 23.56 | 53.84 | 20.62                              | 21.35 |  |
| MTC(0,60s)       | 23.76         | 20.88                               | 21.63 | 27.22 | 20.88                              | 21.39 | 29.37 | 20.94                              | 21.13 |  |
| MTC(3,60s)       | 13.40         | 20.97                               | 19.00 | 14.84 | 20.72                              | 20.24 | 17.79 | 20.65                              | 20.58 |  |
| MTC(actual, 60s) | 9.07          | 21.60                               | 18.32 | 14.91 | 21.32                              | 20.80 | 26.27 | 20.77                              | 20.89 |  |

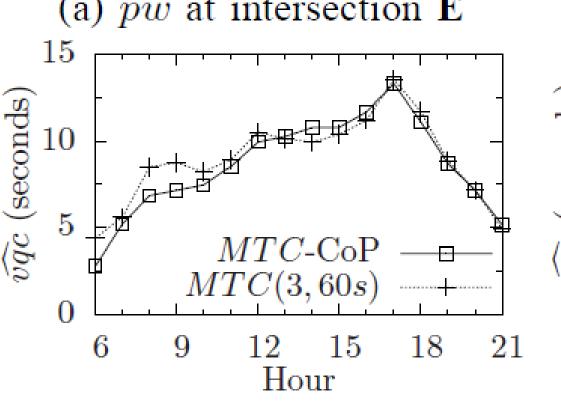
#### Field Pedestrian Arrival Statistics: Gamma( $\theta$ , k) Distribution

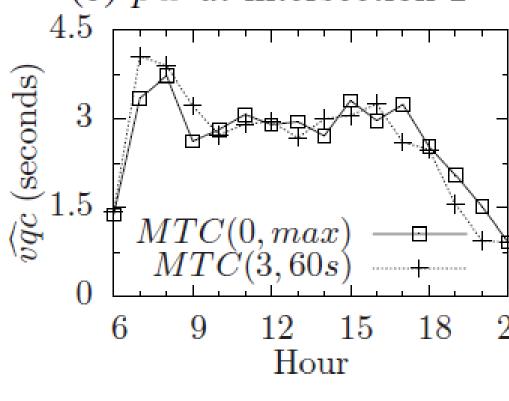
| E    | $\theta$ | k    | sq. err | 1500 - 4PM                                |
|------|----------|------|---------|---|
| 8AM  | 159.3    | 1.17 | 1.5E-4  | \$\frac{1}{8}\$ 1000 -  8AM - 1           |
| 12PM | 135.5    | 1.30 | 9.2E-5  | S 500 - 8PM -                             |
| 4PM  | 96.7     | 1.24 | 1.2E-4  | 0   |
| 8PM  | 216.7    | 1.29 | 5.8E-4  | 0 250 500 750 1000 $pa \text{ (seconds)}$ |
|      |          |      |         |   |
|      |          |      |         | 250                                       |

| I    | $\theta$ | k    | sq. err | 250 - 8AM  |
|------|----------|------|---------|--|
| 8AM  | 218.1    | 1.67 | 3.3E-3  | $\begin{array}{ c c c c c c c c c c c c c c c c c c c$ |
| 12PM | 176.2    | 2.42 | 2.4E-3  | 3 100  |
| 4PM  | 188.2    | 2.12 | 2.8E-3  | 50 - 8PM -   |
| 8PM  | 232.1    | 1.54 | 6.1E-3  | 0 250 500 750 1000 $pa \text{ (seconds)}$              |

### Field Results: pedestrian wait time & vehicle queue clearance time







(c)  $\widehat{vqc}$  at intersection **E** (d)  $\widehat{vqc}$  at intersection **I**