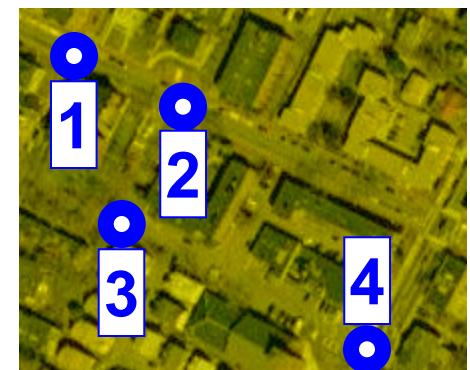
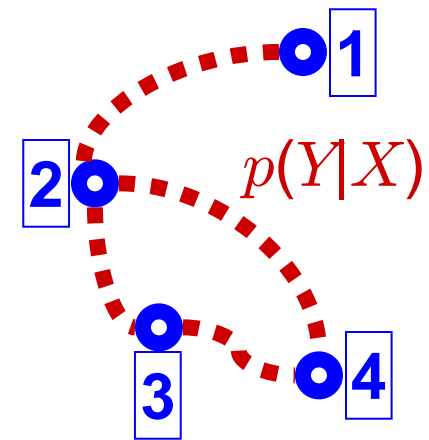




# Network Topology and Geometry

- Complementary:
  - *Topology* of the camera graph: connectivity and transitions between cameras
    - Fuel truck #538 was seen in camera 3 at 5:39pm, in camera 4 at 5:41pm,...
  - *Geometry*: where cameras are looking
    - Fuel truck #538 was heading toward the power plant between 5:39pm and 5:41pm



*Note: all images adjusted for presentation purposes*



# Motivating Scenario

- Large network of cameras
  - *i.e.* hundreds or thousands
  - Location unknown, *e.g.*
    - Existing installations
    - Very rapid physical installation requirements
- Regular traffic instrumented with GPS receivers (patrols, service vehicles, *etc.*)
- ...need to know camera locations



# Cameras as Tripwires

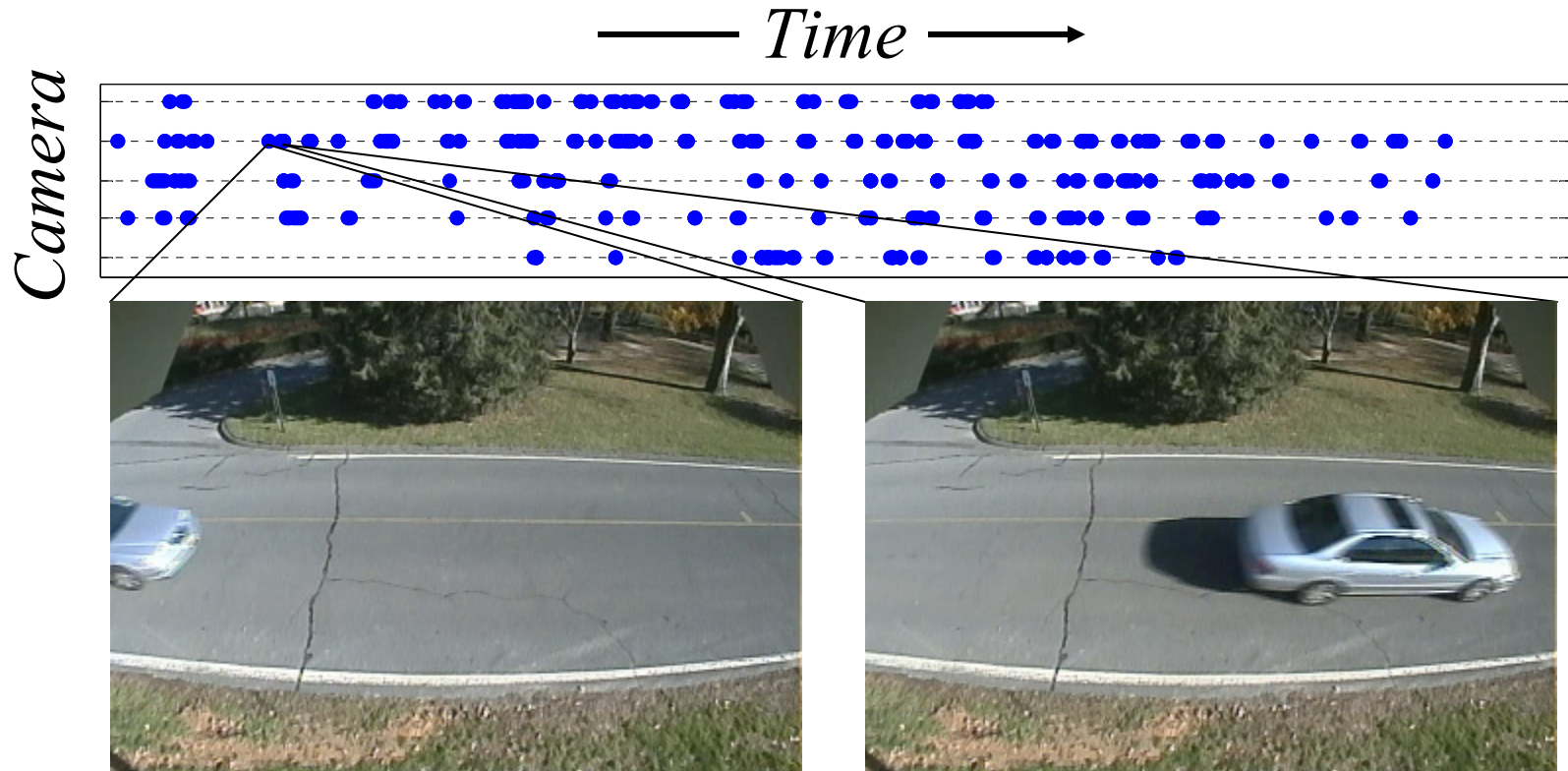


- This paper:
  - Narrow field-of-view (relative to GPS resolution)
  - Camera as a tripwire



# Input Data (1)

- Time instants when each camera observed a vehicle entering or exiting:  $\{(t_{cj})\}$ 
  - Vehicle identity not known

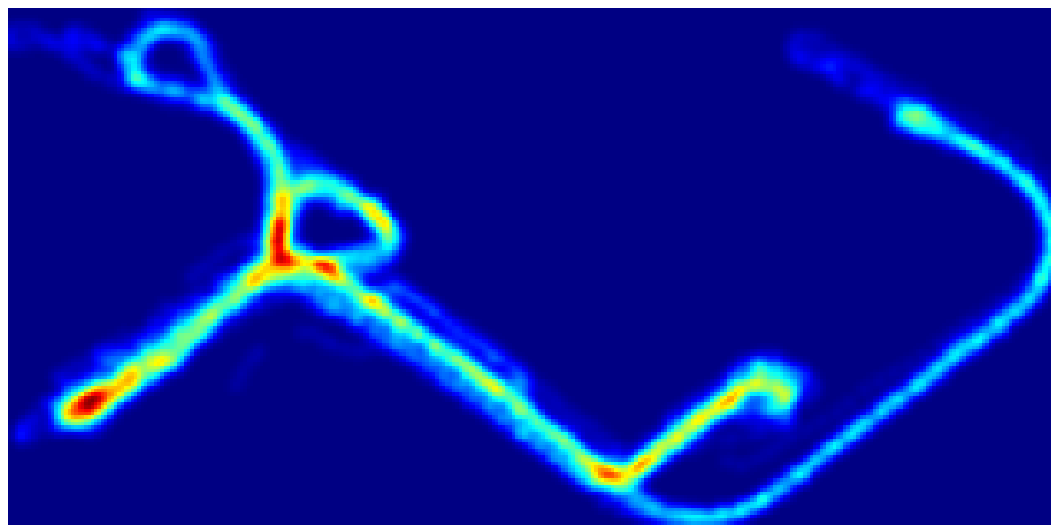




## Input data (2)

- GPS Tracks (5 vehicles):  $\{(lat_{vi}, lon_{vi}, t_{vi})\}$ 
  - Not known: when a particular vehicle is seen in a particular camera

$p(vehicle @ lat, lon)$  abbreviated as  $p(lat, lon)$

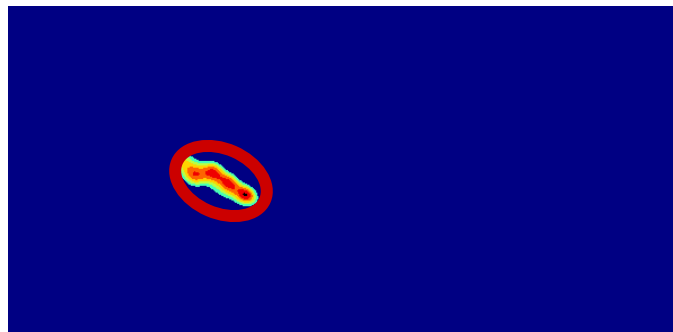




# Estimation: What We Want

$$\hat{p}(lat, lon | lat, lon \in camera)$$

*...but, we don't know when a specific instrumented vehicle is visible*

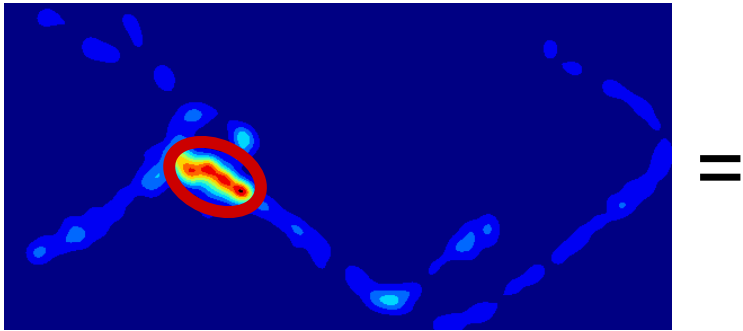


**Camera location:** probability  $(lat, lon)$  being in the field of view  
=  $p(\text{vehicle being at } (lat, lon) \text{ when the camera is tripped})$



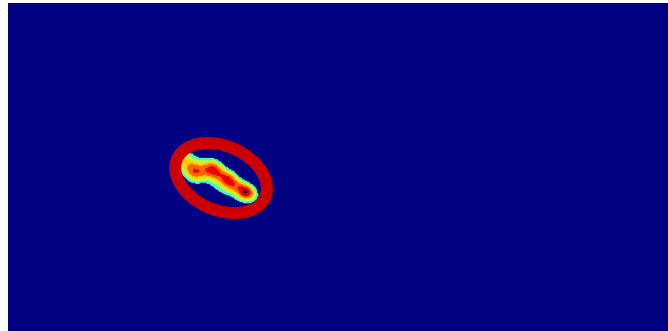
# Estimation: What We Get

$$\tilde{p}(lat, lon | lat, lon \in camera) = (1 - \alpha)\hat{p}(lat, lon | lat, lon \in camera) + \alpha p(lat, lon)$$

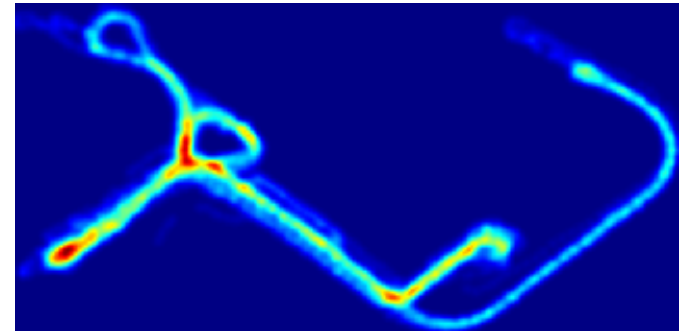


=

$(1 - \alpha)$



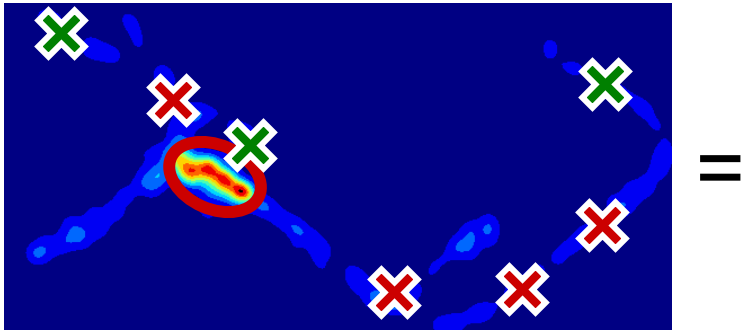
+  $\alpha$





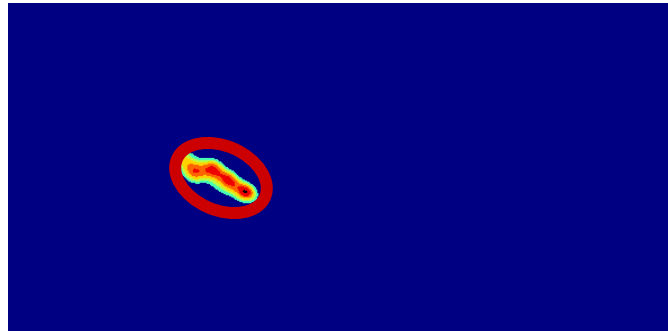
# Camera Sees Nothing

$$\tilde{p}(lat, lon | lat, lon \in camera) = (1 - \alpha)\hat{p}(lat, lon | lat, lon \in camera) + \alpha p(lat, lon)$$

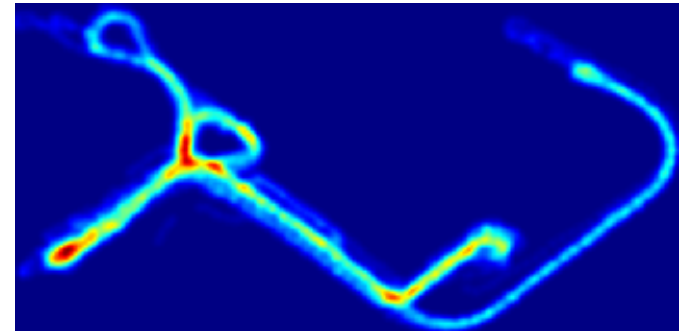


=

$(1 - \alpha)$



+  $\alpha$



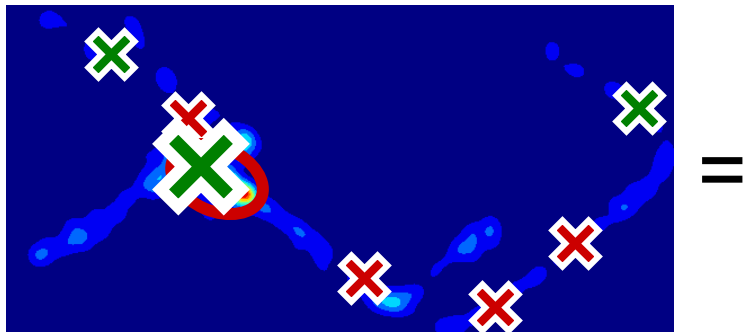
- ✕ GPS-instrumented vehicle
- ✕ Non-instrumented vehicle



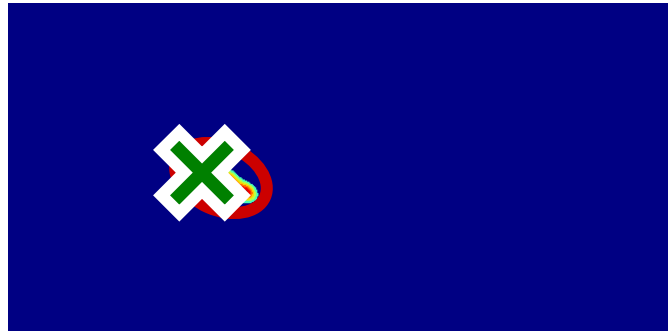


# Camera Sees a GPS Vehicle

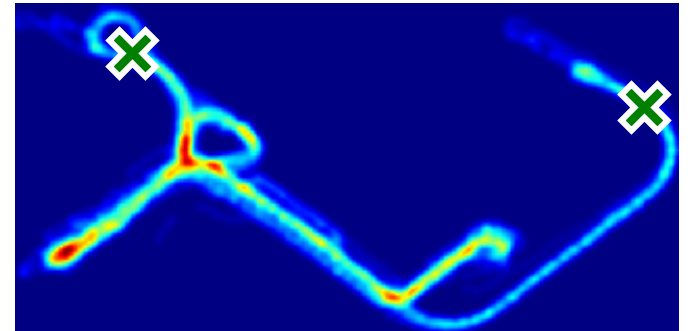
$$\tilde{p}(lat, lon | lat, lon \in camera) = (1 - \alpha)\hat{p}(lat, lon | lat, lon \in camera) + \alpha p(lat, lon)$$



$(1 - \alpha)$



$+ \alpha$

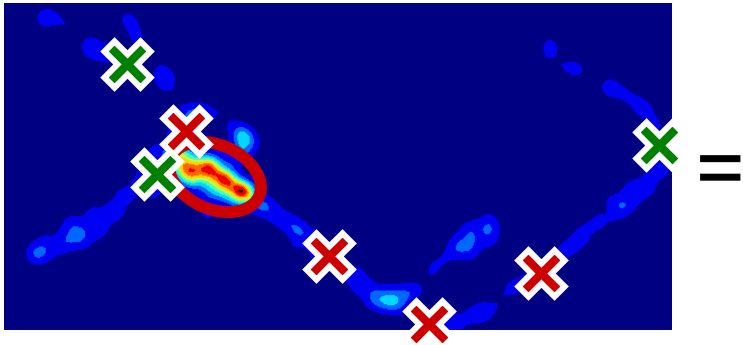


- ✕ GPS-instrumented vehicle
- ✕ Non-instrumented vehicle

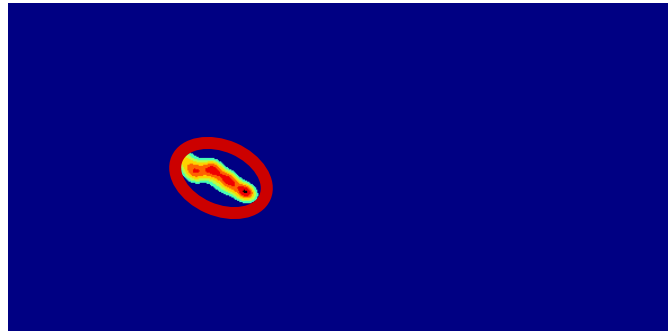


# Camera Sees Nothing

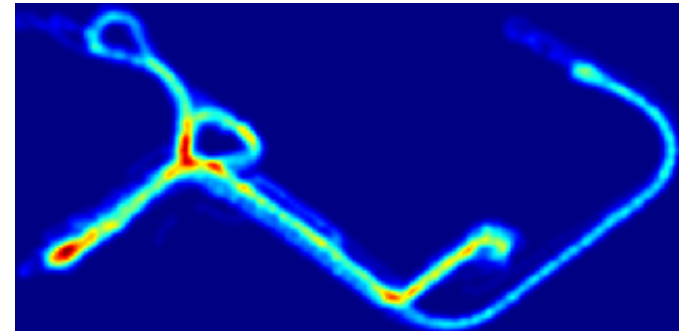
$$\tilde{p}(lat, lon | lat, lon \in camera) = (1 - \alpha)\hat{p}(lat, lon | lat, lon \in camera) + \alpha p(lat, lon)$$



$(1 - \alpha)$



$+ \alpha$

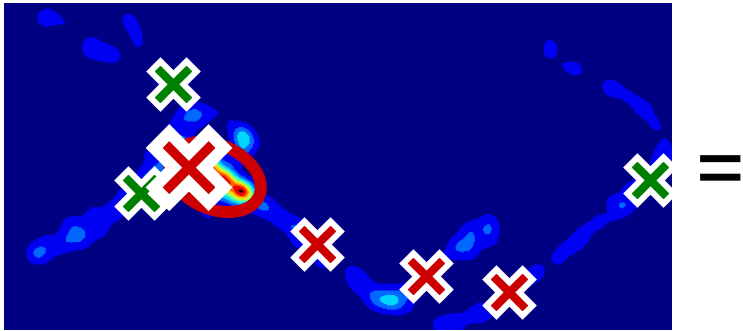


- ✕ GPS-instrumented vehicle
- ✕ Non-instrumented vehicle

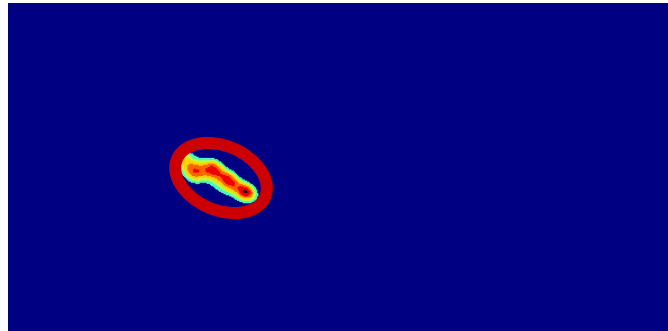


# Camera Sees a Distracter

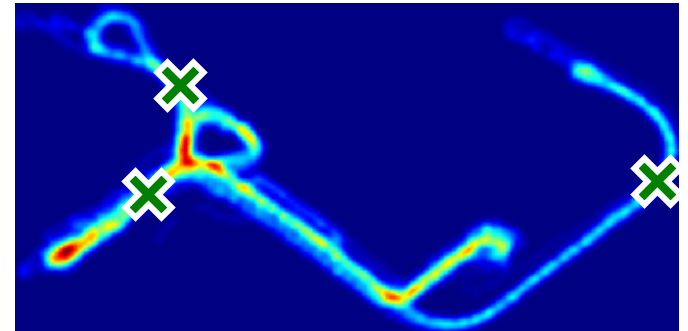
$$\tilde{p}(lat, lon | lat, lon \in camera) = (1 - \alpha)\hat{p}(lat, lon | lat, lon \in camera) + \alpha p(lat, lon)$$



$(1 - \alpha)$



$+ \alpha$



- ✕ GPS-instrumented vehicle
- ✕ Non-instrumented vehicle

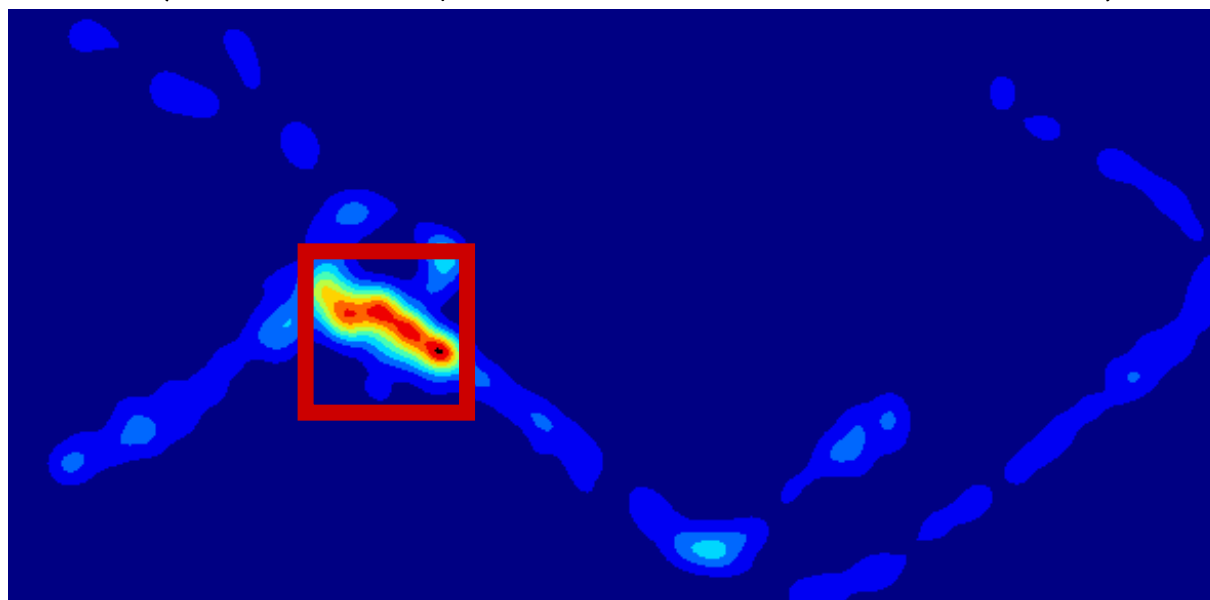


# Best Cluster of Peaks

$$\tilde{p}(lat, lon | lat, lon \in camera) = (1 - \alpha)\hat{p}(lat, lon | lat, lon \in camera) + \alpha p(lat, lon)$$

---

$$\tilde{p}(lat, lon | lat, lon \in camera)$$

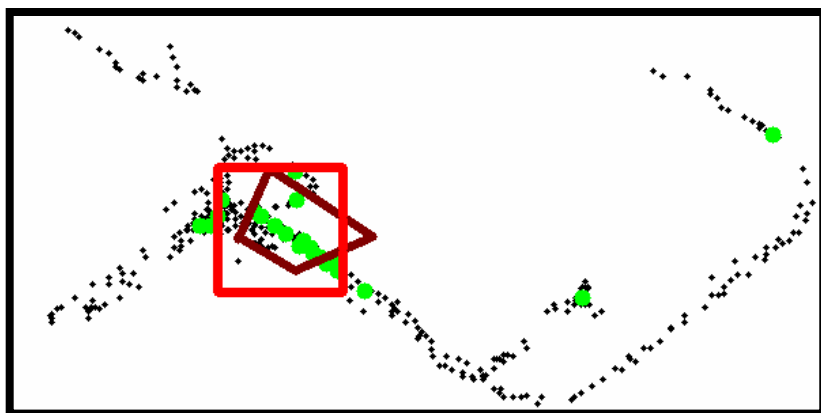


$h(\hat{p}) \ll h(p) \rightarrow$  look for peaks

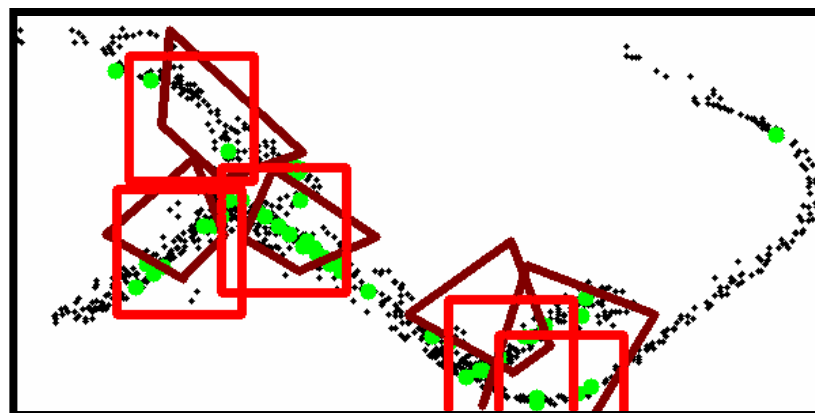


# Results

Camera 2



Superimposed Results



- Bright red squares: estimated camera fields of view
- Dark red trapezoids: ground truth (rough)
- Light green dots: peaks in  $\tilde{p}(x, y|c)$
- Dark green dots: non-peak votes in  $\tilde{p}(x, y|c)$



# Conclusions

- No given correspondence
- Topology
  - Tripwire data → network topology and transitions
  - Can model appearance changes
- Geometry
  - Tripwire data + GPS side information → camera locations



Questions...

Thank you



Extra Slides...

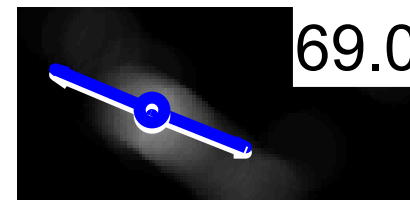
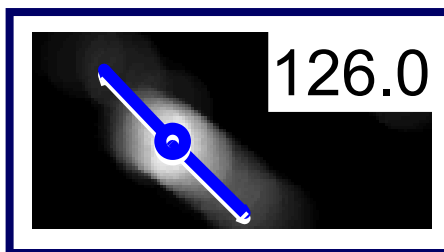
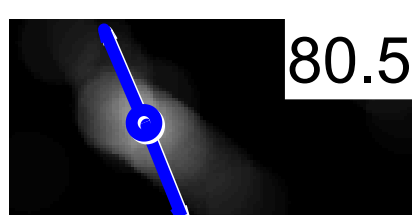
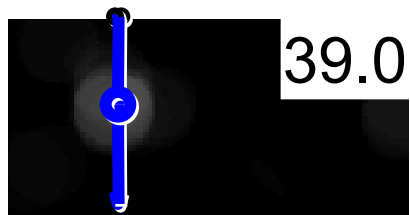
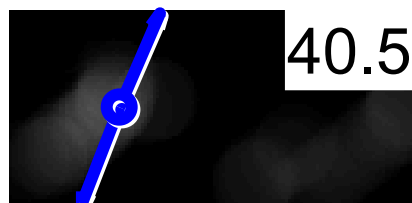
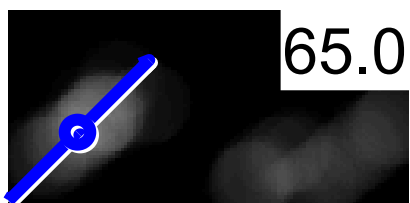
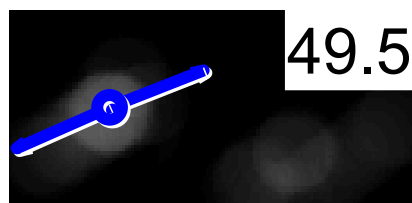
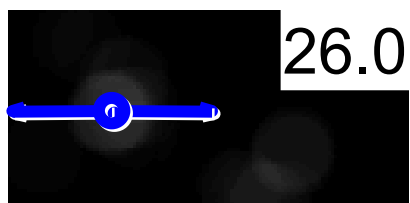




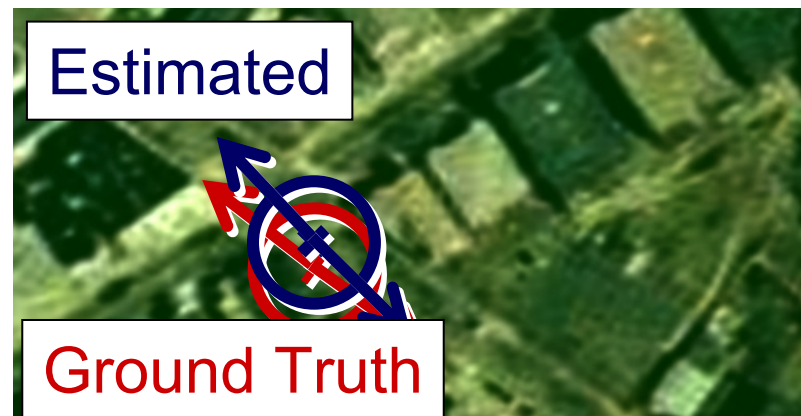
# Location + Pose

## *Voting Spaces*

- Conditioned on Traffic Direction



*Best Estimate Overlaid  
on a Satellite Map\**

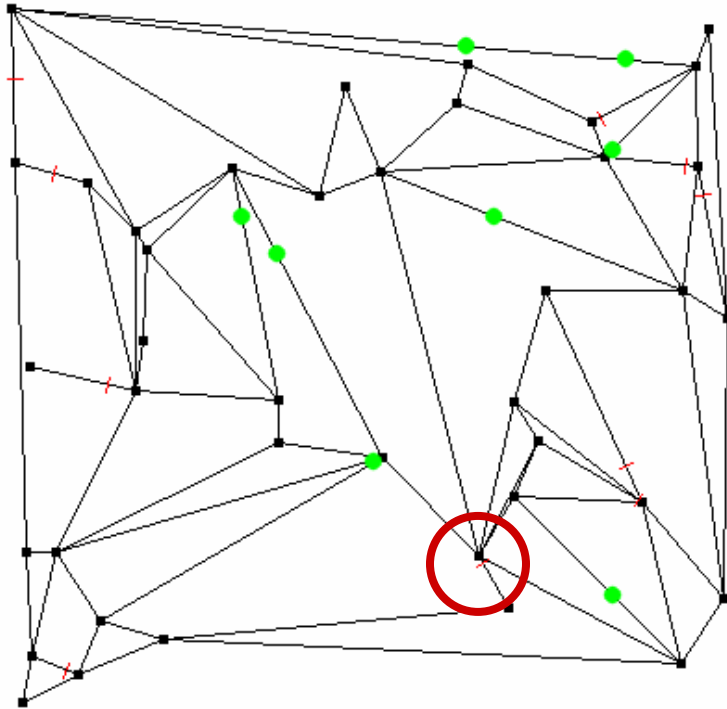


*\* true satellite image substituted*

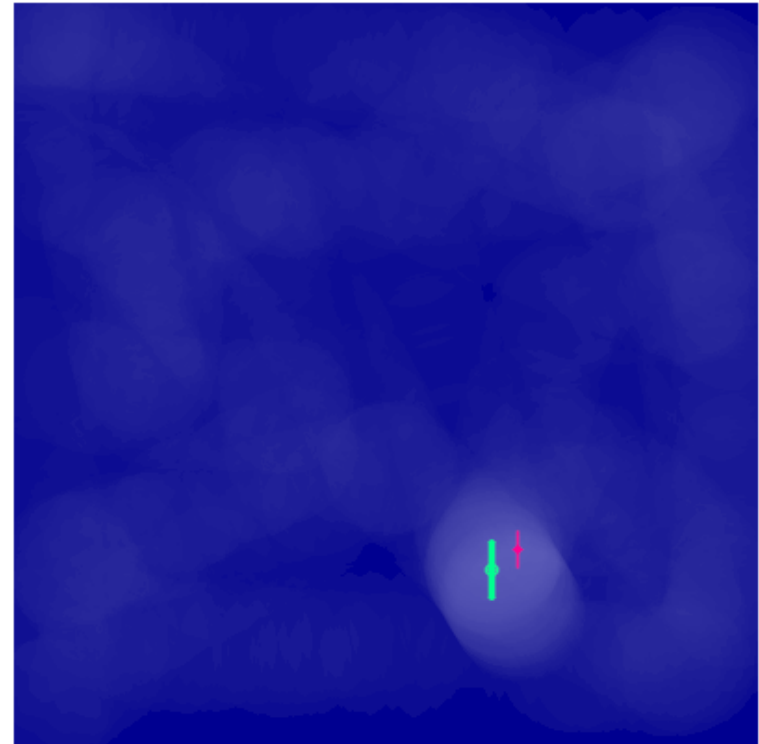


# Sample Simulated Network

- 40 Intersections
- 80 Roads
- 8 Vehicles
- 10 Cameras
- Total road length: 4.2km
- Mean speed: 60kph



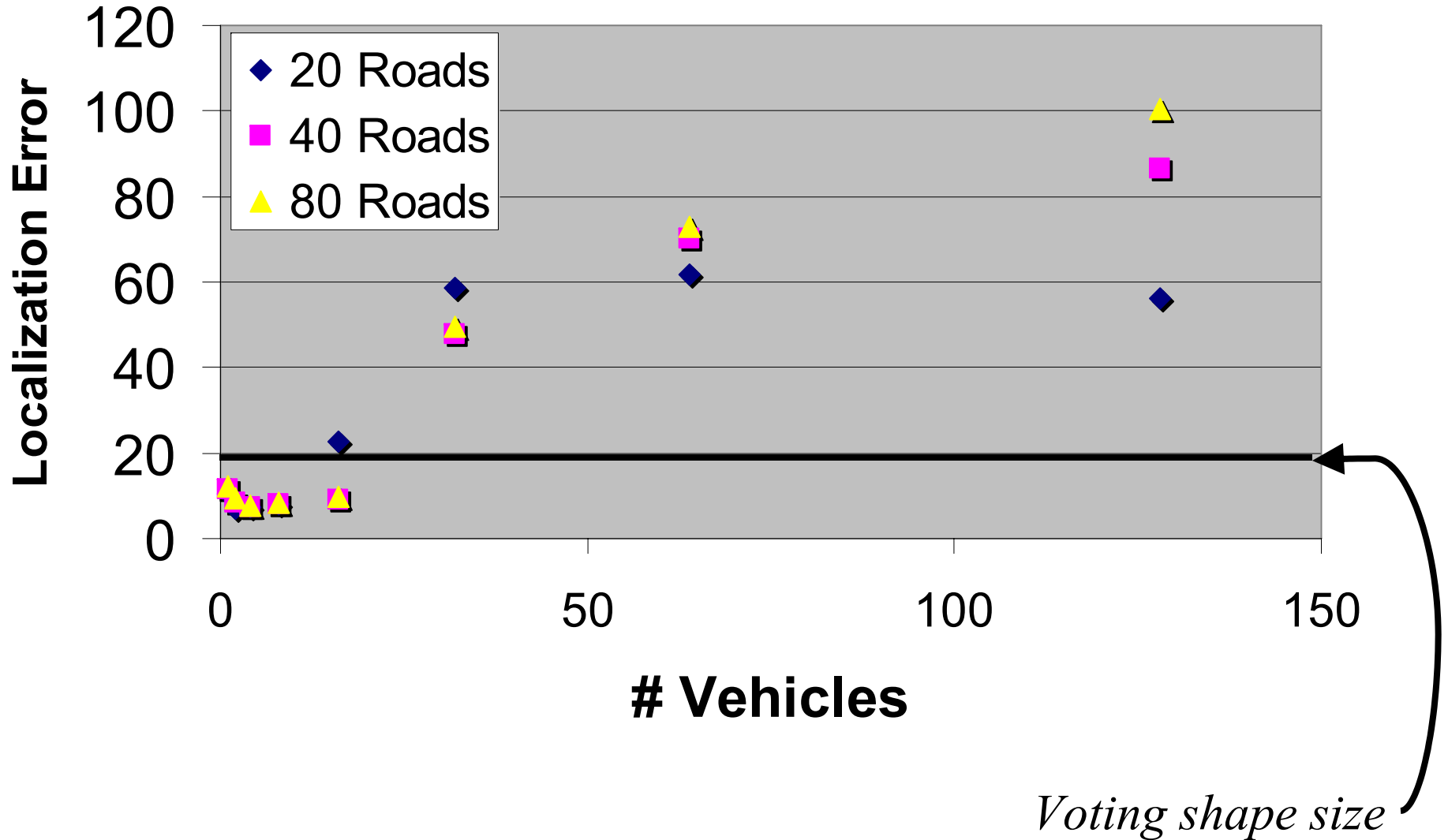
Rendering of Network  
(with one camera circled)



Estimated (red) / Actual (green)  
Camera Location

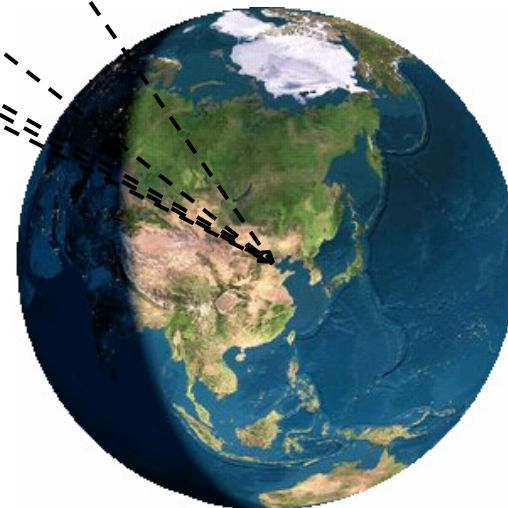
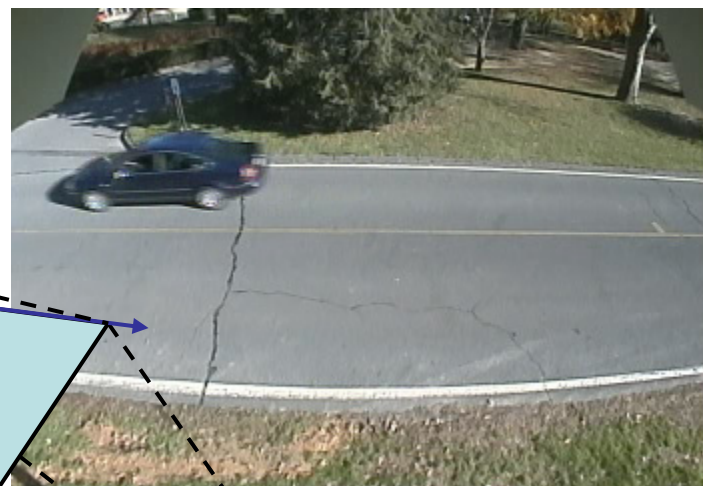
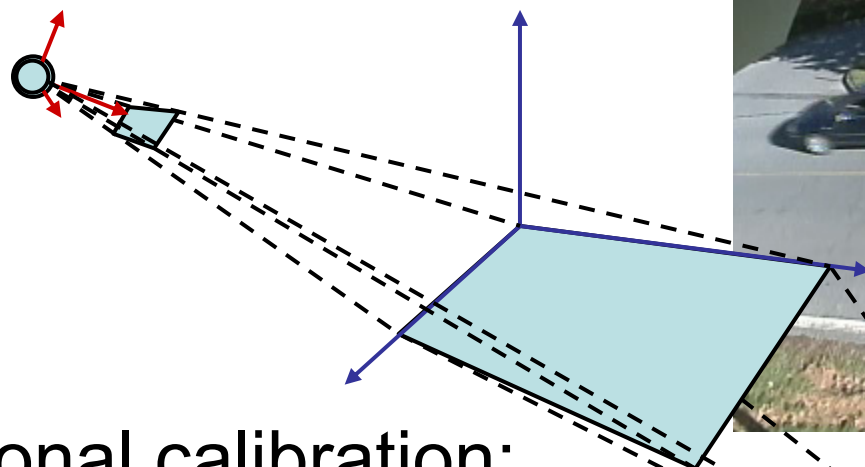


# Simulation Results





# Calibration



- Traditional calibration:
  - pixels  $\leftrightarrow$  object coordinates
- Geodetic calibration:
  - pixels  $\leftrightarrow$  (latitude, longitude)
- **This paper:**
  - **Narrow field-of-view (relative to GPS resolution)**
  - **Camera as a tripwire**



# Why Not Just...

...take a GPS reading on the camera?

- **It's hard:** GPS signals often blocked
- **It's wrong:** Need GPS readings of the imaged area, not of the camera

...manually correspond image  
readings?

- Hazardous environments
- Advertises boundaries of
- Does not scale well to human  
sensors that may be distributed

