

IWMV 2014

# GPS Refinement and Camera Orientation Estimation from a Single Image and a 2D Map

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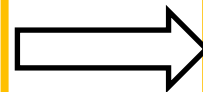
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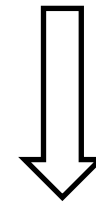
# Outline

- Introduction
- Approach
- Experimental Results
- Conclusions

# Motivation



1. Minimal Image Analysis
2. "Refine" Location

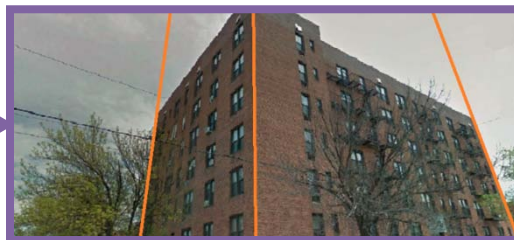
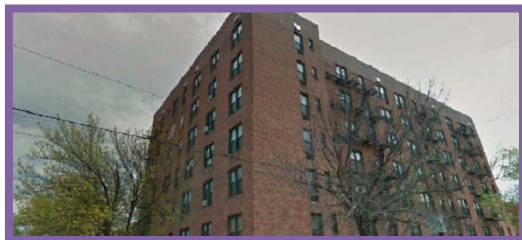
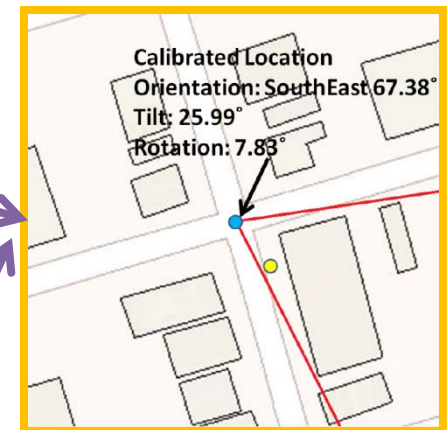
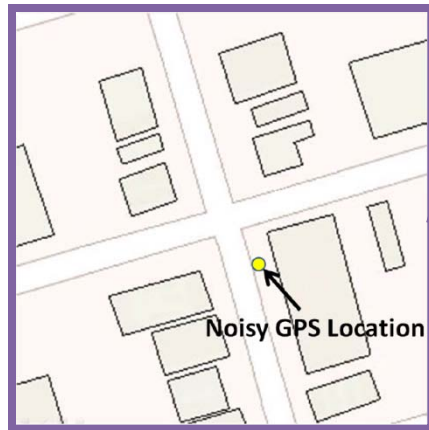


Lightweight but intelligent way  
of combining GPS & image



[Zandbergen et al. JoN11]

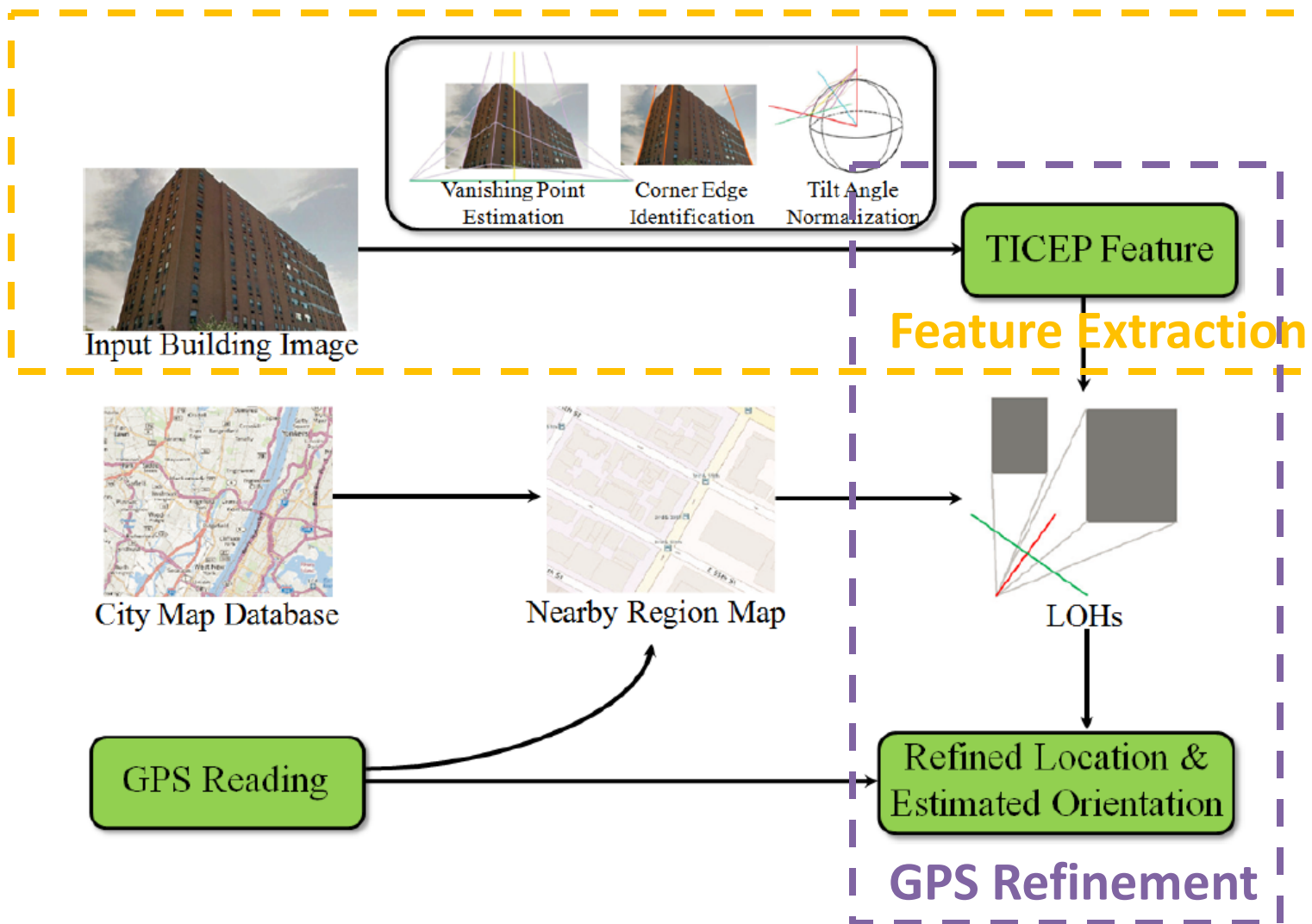
# Introduction



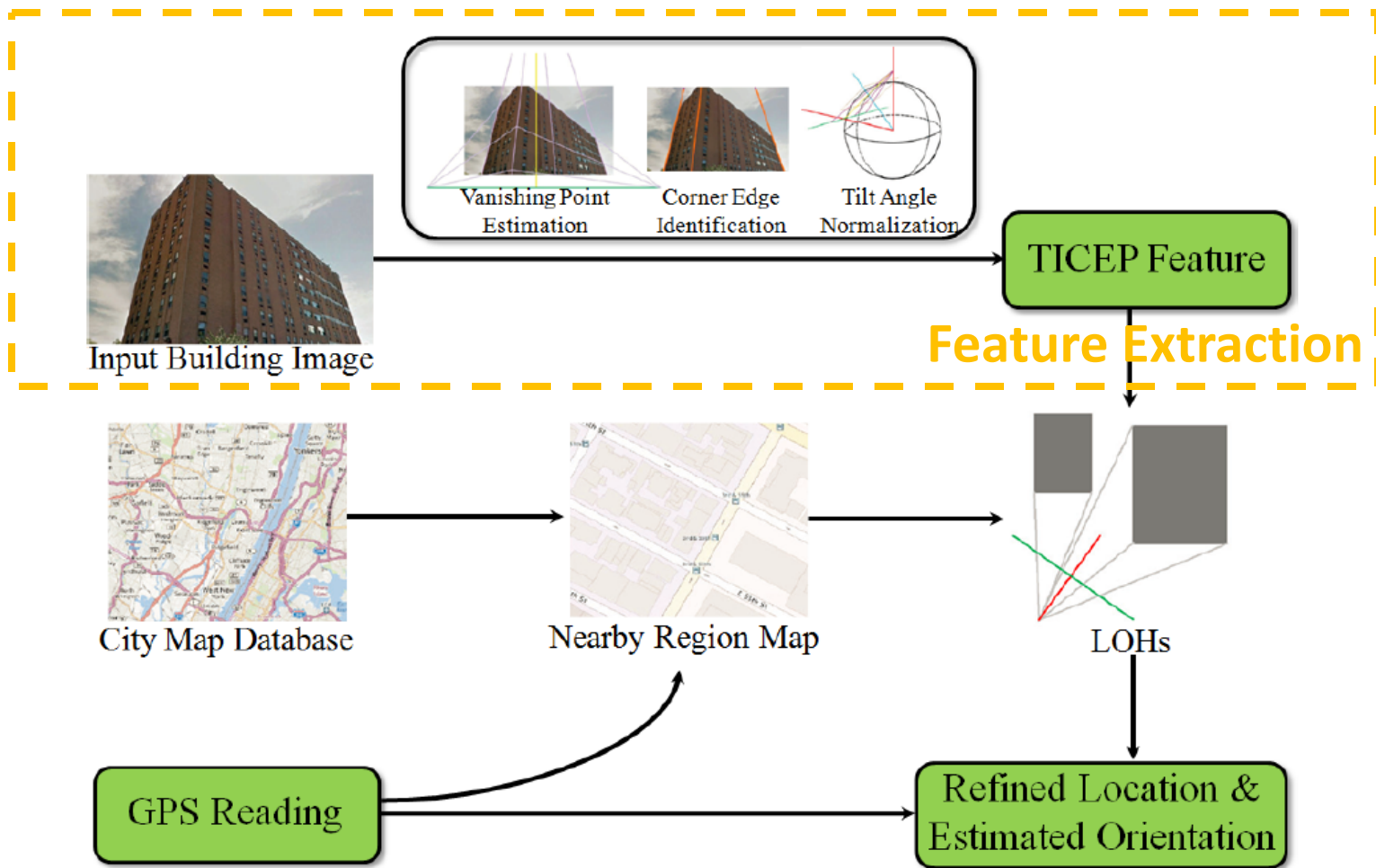
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# Approach



# Approach



# Feature Extraction

1. Estimate vanishing points from line segments of the segmented image.



[Gioi et al. PAMI10] [Tardif et al. ICCV09]



# Feature Extraction

2. Identify vertical building boundary/intersecting corner edges.

Boundary:

$$Scr_{BCE}(j) = Scr_c(j) + Scr_p(j) + Scr_l(j)$$



Horizontal Color  
Gradient

Segment Vertical  
Steepness

Adjacent Horizontal  
Line Condition

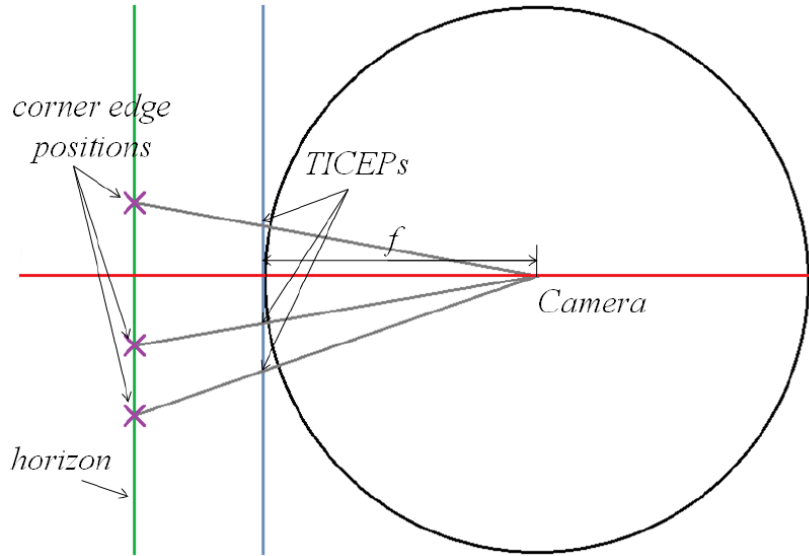
Intersecting:

Longest vertical line segment where lines from different horizontal *vps* meet.

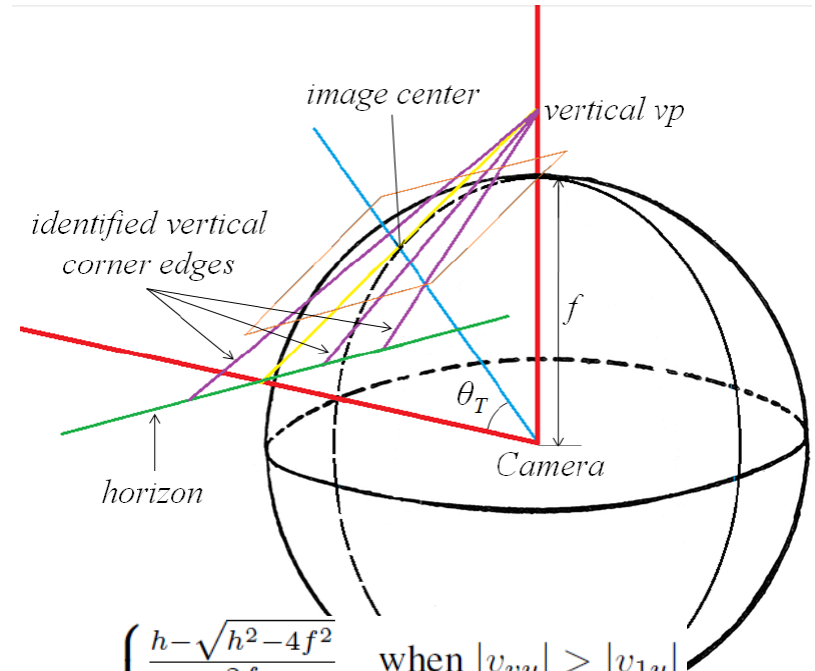
**85.73% Accuracy**

# Feature Extraction

## 3. Compute Tilt-Invariant Corner Edge Position by normalizing the tilt angle.



$$TICEP_i = p_{ix} \cos(\theta_T)$$

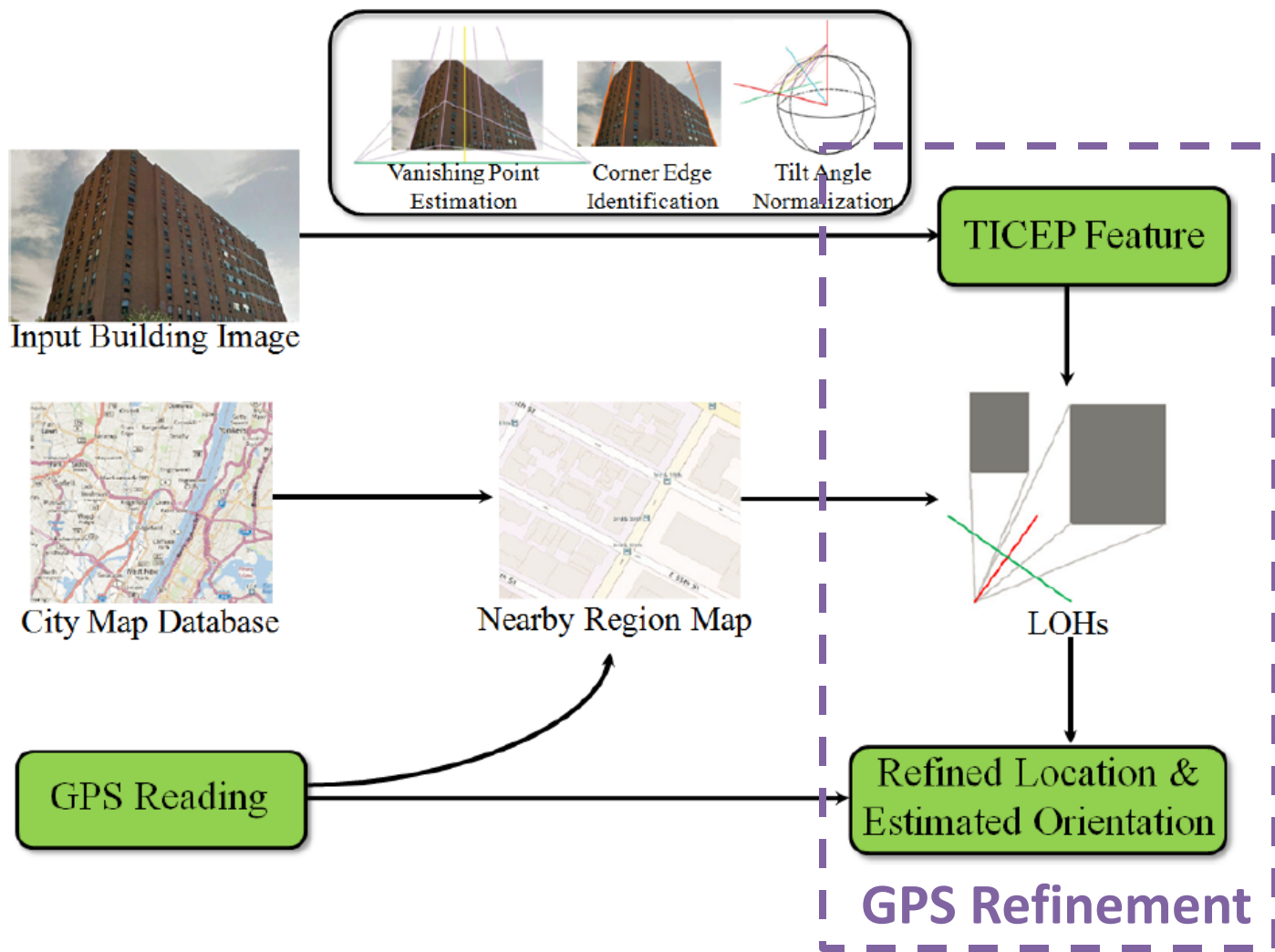


$$\tan(\theta_T) = \begin{cases} \frac{h - \sqrt{h^2 - 4f^2}}{2f} & \text{when } |v_{vy}| > |v_{1y}| \\ \frac{h + \sqrt{h^2 - 4f^2}}{2f} & \text{when } |v_{vy}| \leq |v_{1y}| \\ 0 & \text{when } v_{vy} = -\infty \end{cases}$$

$$f = \sqrt{-v_{vy}v_{1y}}$$

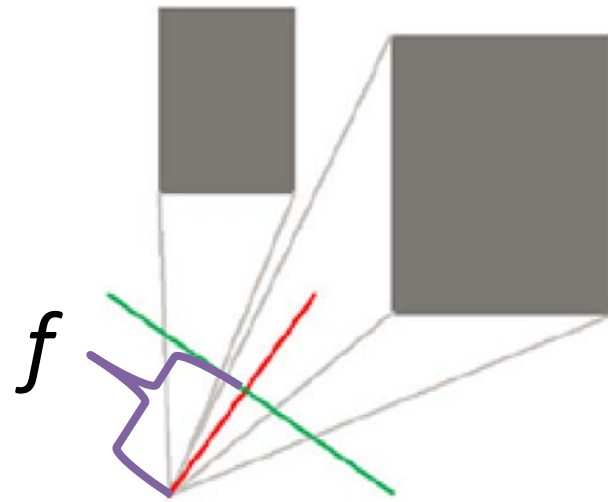
$$h = |v_{vy}| + |v_{1y}|$$

# Approach



# GPS Refinement

Given a set of corner edge positions, and a set of locations on the map, a Location-Orientation Hypothesis can be computed.



$$(\mathbf{x}_{LOH}, \mathbf{n}_{LOH}) = \arg \min_{(\mathbf{x}, \mathbf{n})} \sum_{1 \leq i \leq N_p} \|\mathbf{q}_i - \mathbf{inter}_i\|^2$$

$$\mathbf{inter}_i = (\mathbf{x} \times \mathbf{c}_{hi}) \times (\mathbf{q}_1 \times \mathbf{q}_2)$$

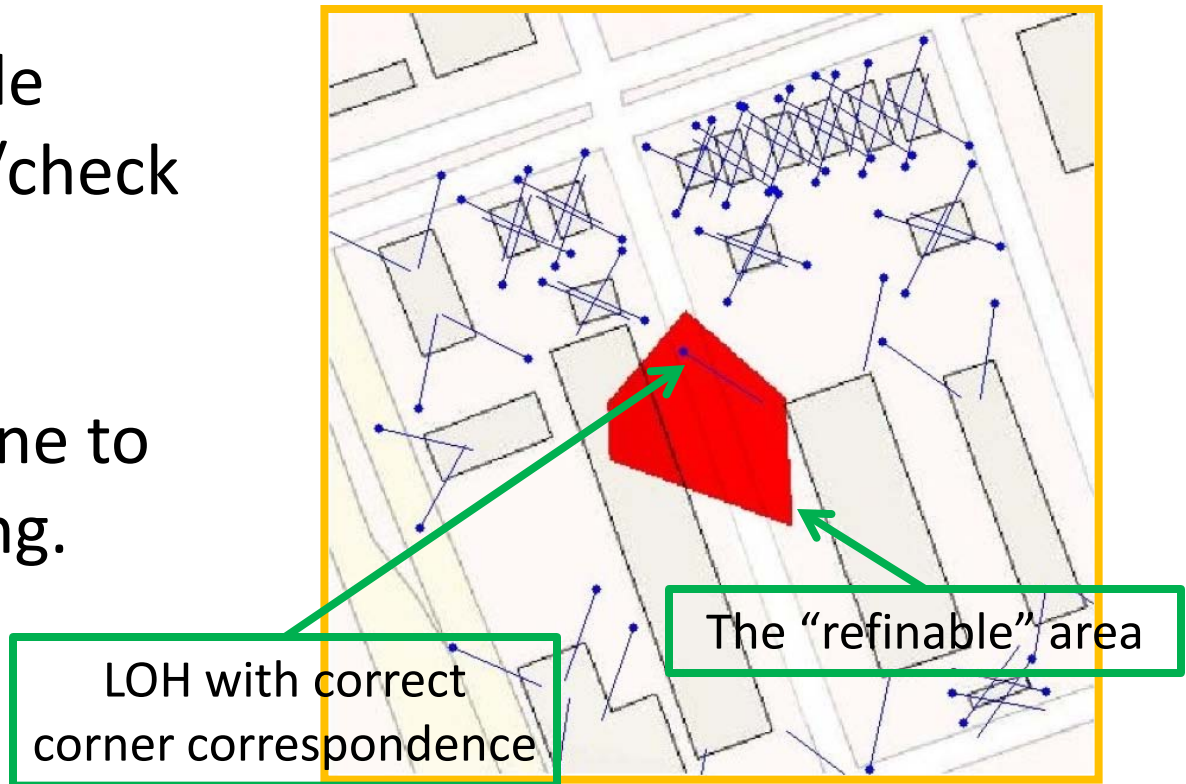
$$\mathbf{q}_i = \mathbf{x} + f\mathbf{n} + TICEP_i\mathbf{n}_\perp$$

# GPS Refinement

Compute a Location-Orientation Hypothesis for every possible corner correspondence on the map.

Discard unreasonable hypotheses (indoor/check visibility).

Select the nearest one to the noisy GPS reading.



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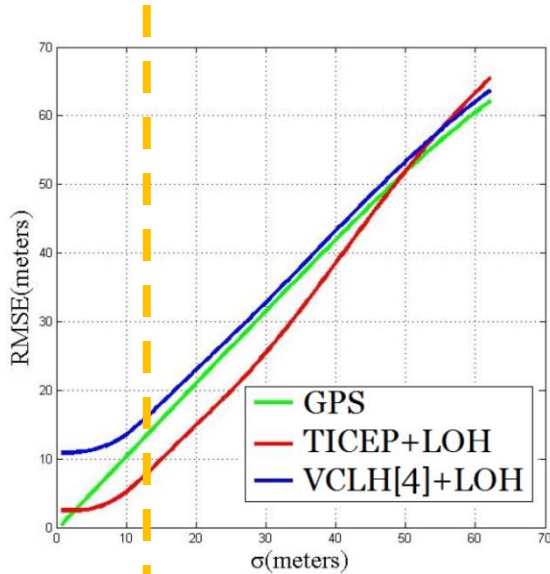
# Experimental Results

RMSE of location and orientation of the Location-Orientation Hypothesis that has correct map correspondence.

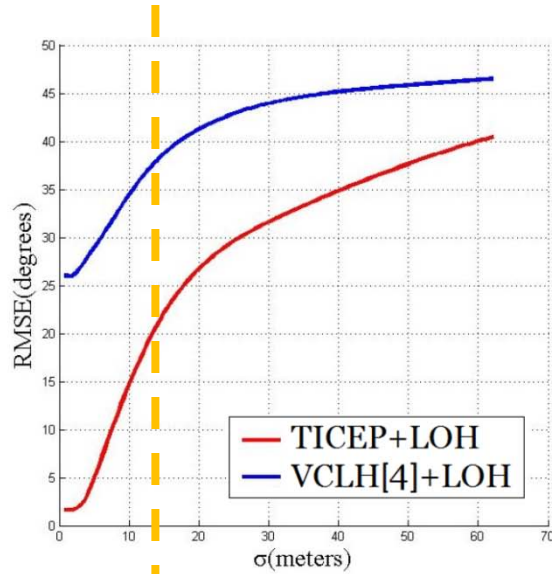
|             | Proposed Method | Using VCLH in [4] |
|-------------|-----------------|-------------------|
| Location    | $2.48m$         | $18.68m$          |
| Orientation | $1.6^\circ$     | $5.9^\circ$       |

[Cham et al. CVPR10]

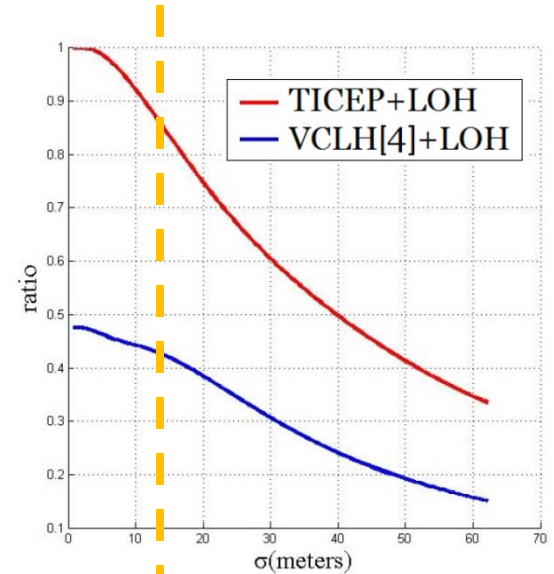
# Experimental Results



Location Error



Orientation Error



% of Correct LOH Selected

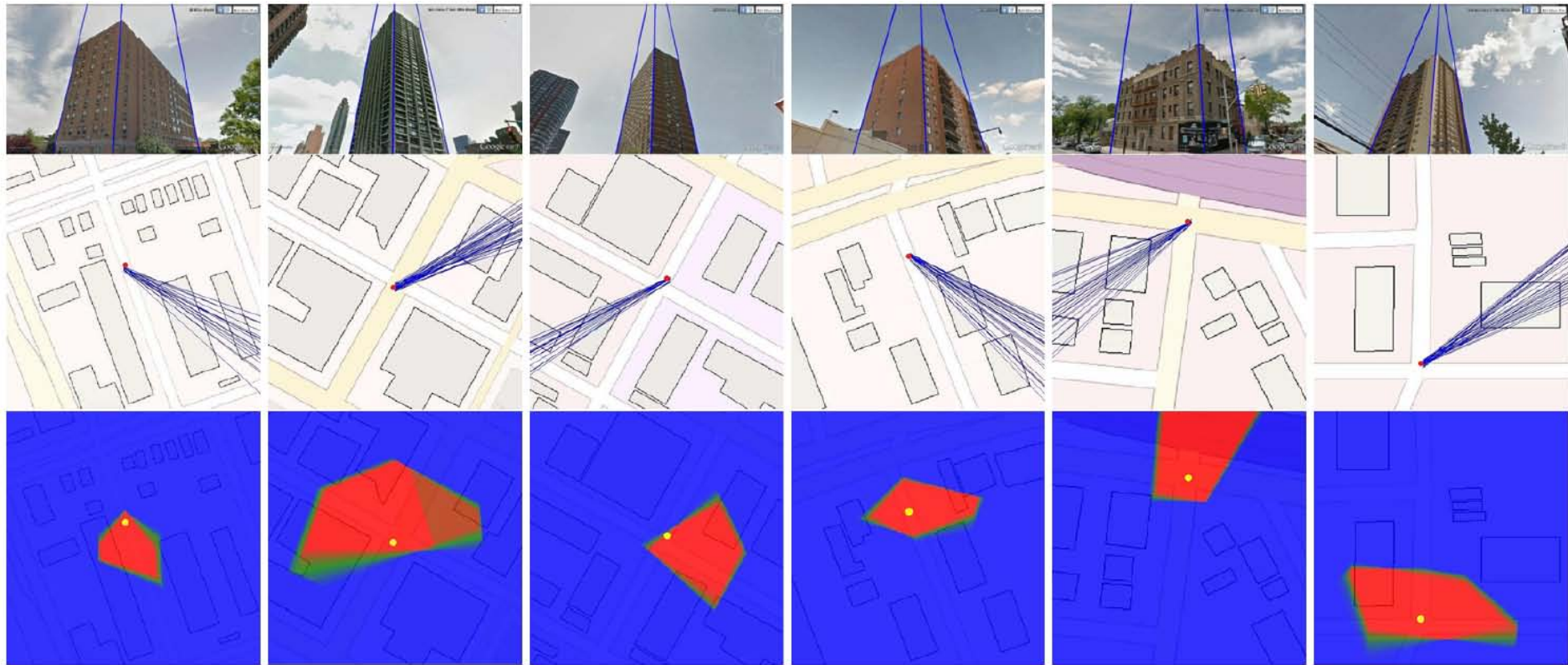
12.5m GPS

6.89m, 17.96°

[Cham et al. CVPR10]

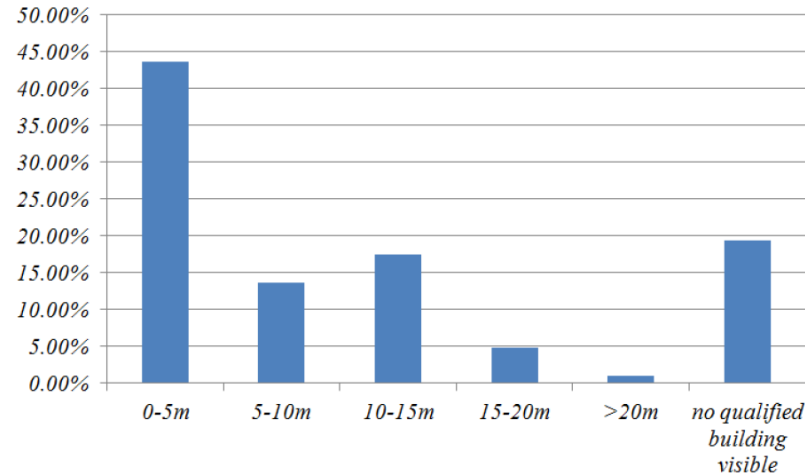
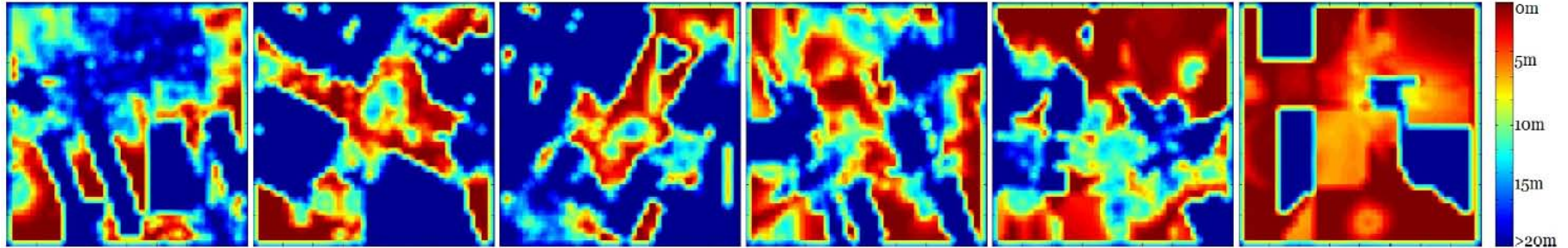


# Experimental Results



Some results and “refinable areas”.

# Experimental Results



Upper bound our refining method can achieve.

**Mean: 6.70m**

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# Conclusions

- We present a framework for refining a noisy GPS location and estimating the camera orientation using a building image, and a 2D map.
- We propose to use Tilt-Invariant Corner Edge Positions as a better feature for representing building structures.
- We propose to use Location-Orientation Hypotheses to describe the interaction between extracted features and the map.

# Conclusions

- A lightweight but intelligent way of combining GPS and image information
  - Minimal Image Analysis
  - Refine GPS Location

Thank you