

FOSS4G 2017

# **Visualization and analysis of active transportation patterns derived from public webcams**

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# Public webcams

Rich source of spatio-temporal information

- weather, traffic, changes in environment, phenology, ...
- active transportation behavior in urban areas



# AMOS

## The Archive of Many Outdoor Scenes

- collection of long-term timelapse imagery from publicly accessible outdoor webcams around the world
- 1,128,087,180 images taken from 29945 webcams
- a project of the Media and Machines Lab Washington University in St. Louis
- online browsing of images and download available
- metadata and tags to improve discoverability of webcams

# From image to information

How to get from image to information useful for analysis?

## Artificial intelligence

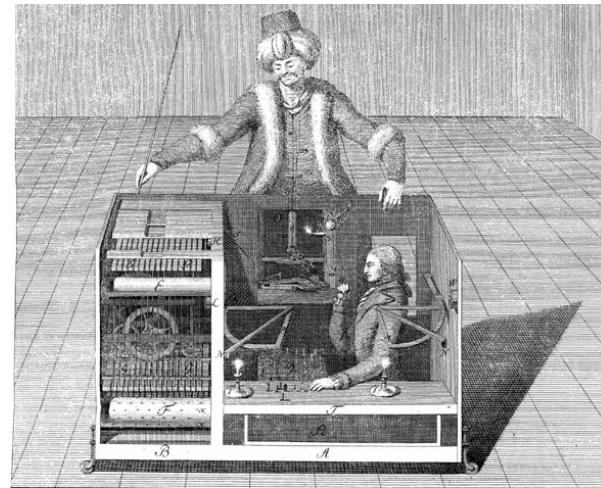
- machine learning
- neural networks



<https://xkcd.com/1838>

## Artificial artificial intelligence

- Amazon Mechanical Turk
- crowdsourcing marketplace platform

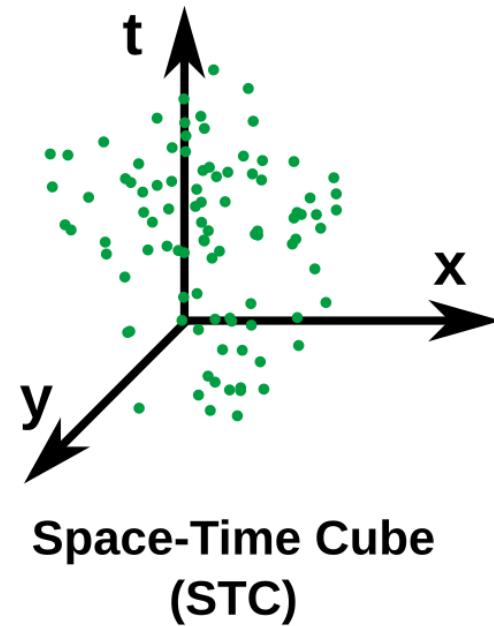
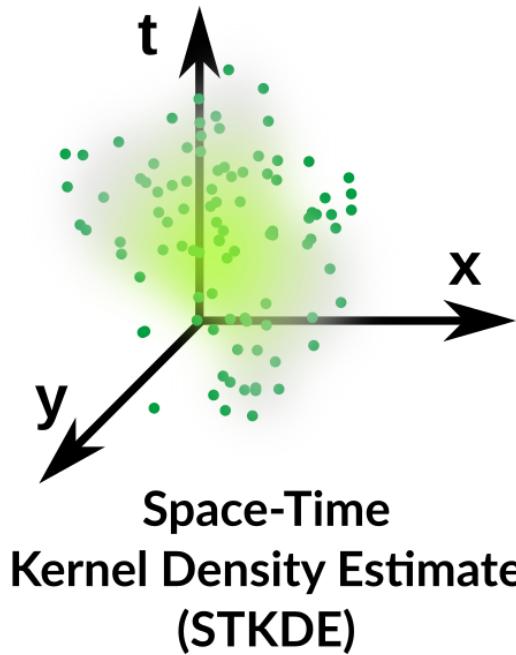
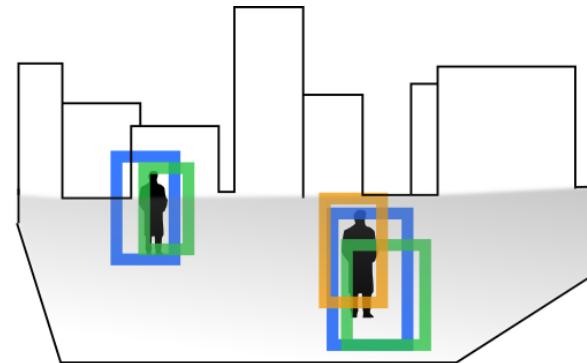
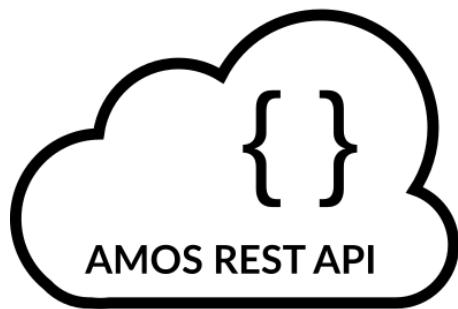


fake chess-playing machine (late 18th century)

# mTurk HITs (Human Intelligence Tasks)



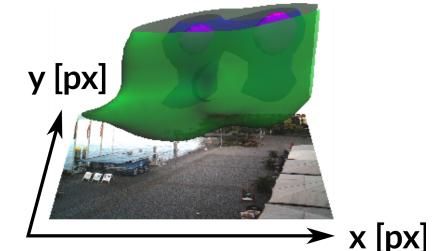
# HITs processing workflow



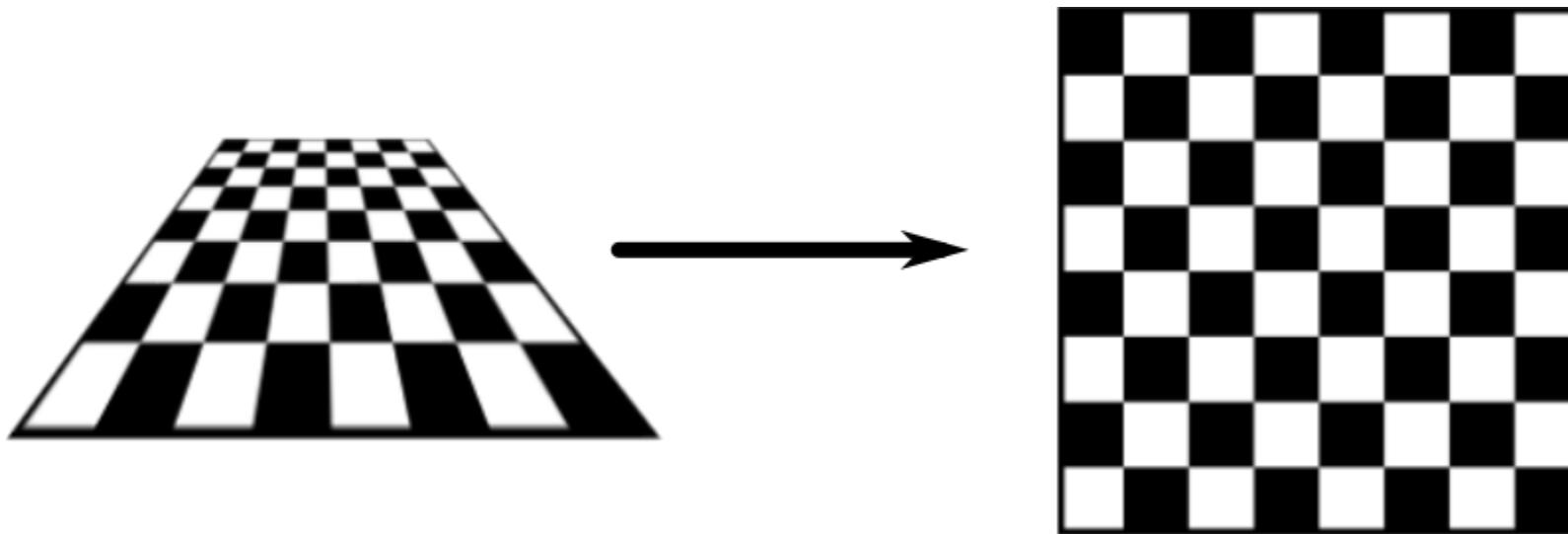
# Georeferencing

Using coordinate system of the webcam image:

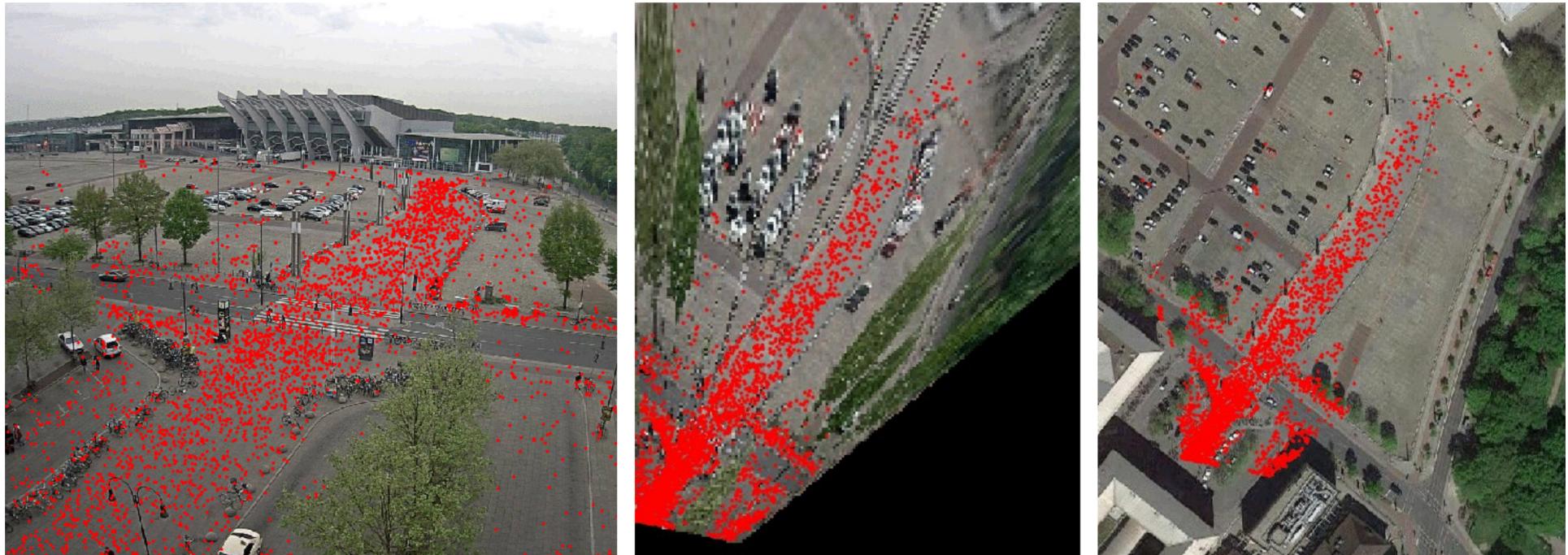
- distances in the image represent varying distances in reality
- we can't integrate other geospatial datasets (streets, POIs) or information from other webcams



Solution is to compute **projective transformation** by matching 4+ stable features in the webcam image to the same features in the orthophoto.

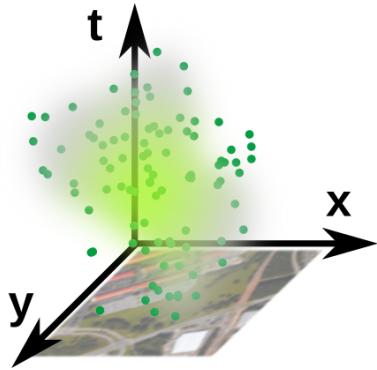


# Georeferencing: example



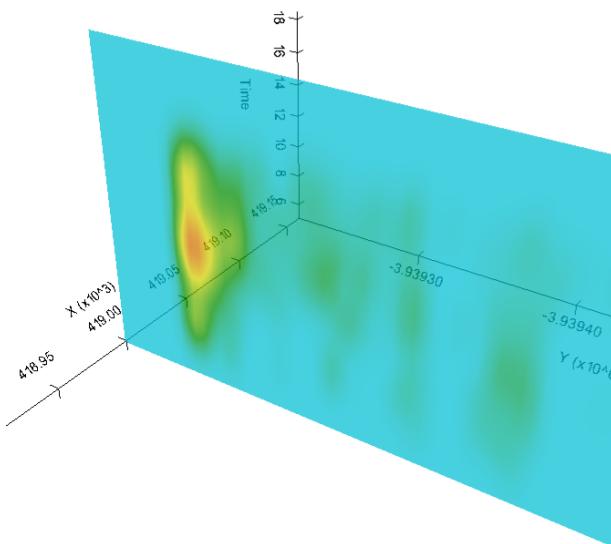
Caveats: some webcams change orientation, many objects such as benches, traffic marking are unsuitable as GCPs, stable objects such as statues can move too

# STC visualization

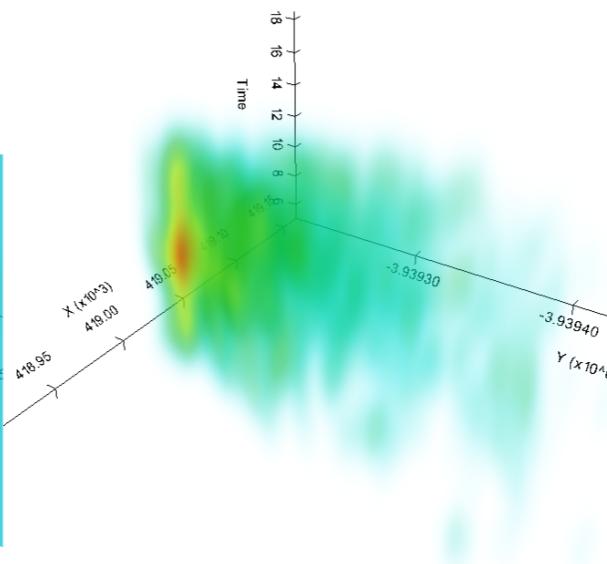


Space-time density of pedestrians represented as a 3D volume, computed using multivariate Kernel Density Estimation (KDE) with different spatial and temporal bandwidths

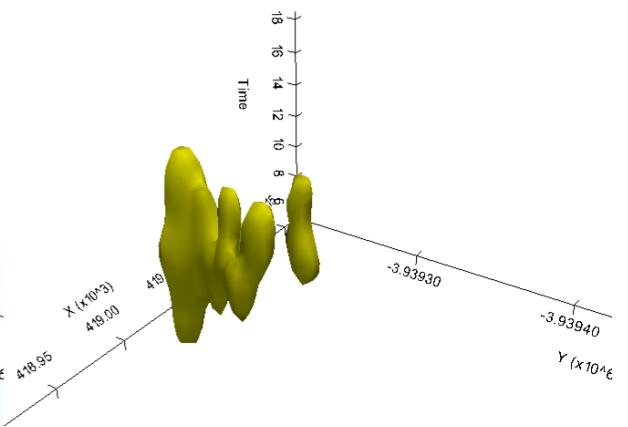
**slice**



**volume rendering**



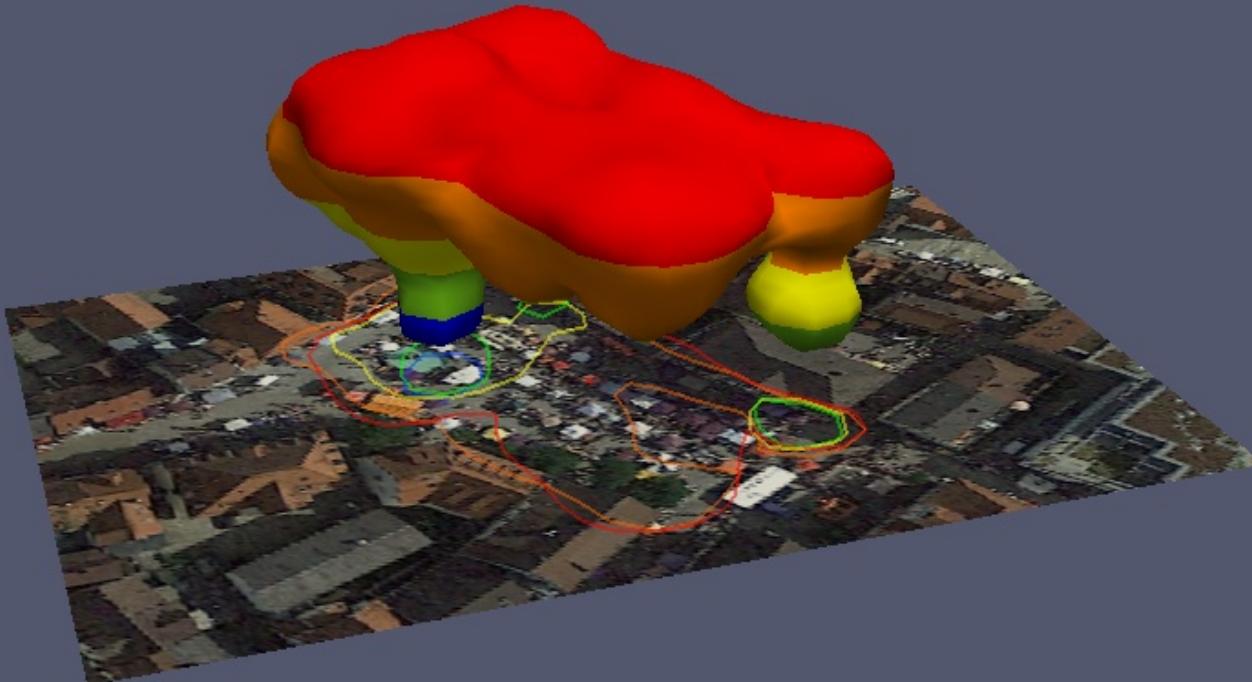
**isosurface**



# Pedestrian density visualization

webcam 9706 (July), Ehingen, Germany

Camera 9706 in 2014



- evening (after 5 pm)
- afternoon (1 - 5 pm)
- noon (11 am - 1 pm)
- morning (9 - 11 am)
- before 9 am

Isosurface (people per  $100\text{ m}^2\text{h}$ )

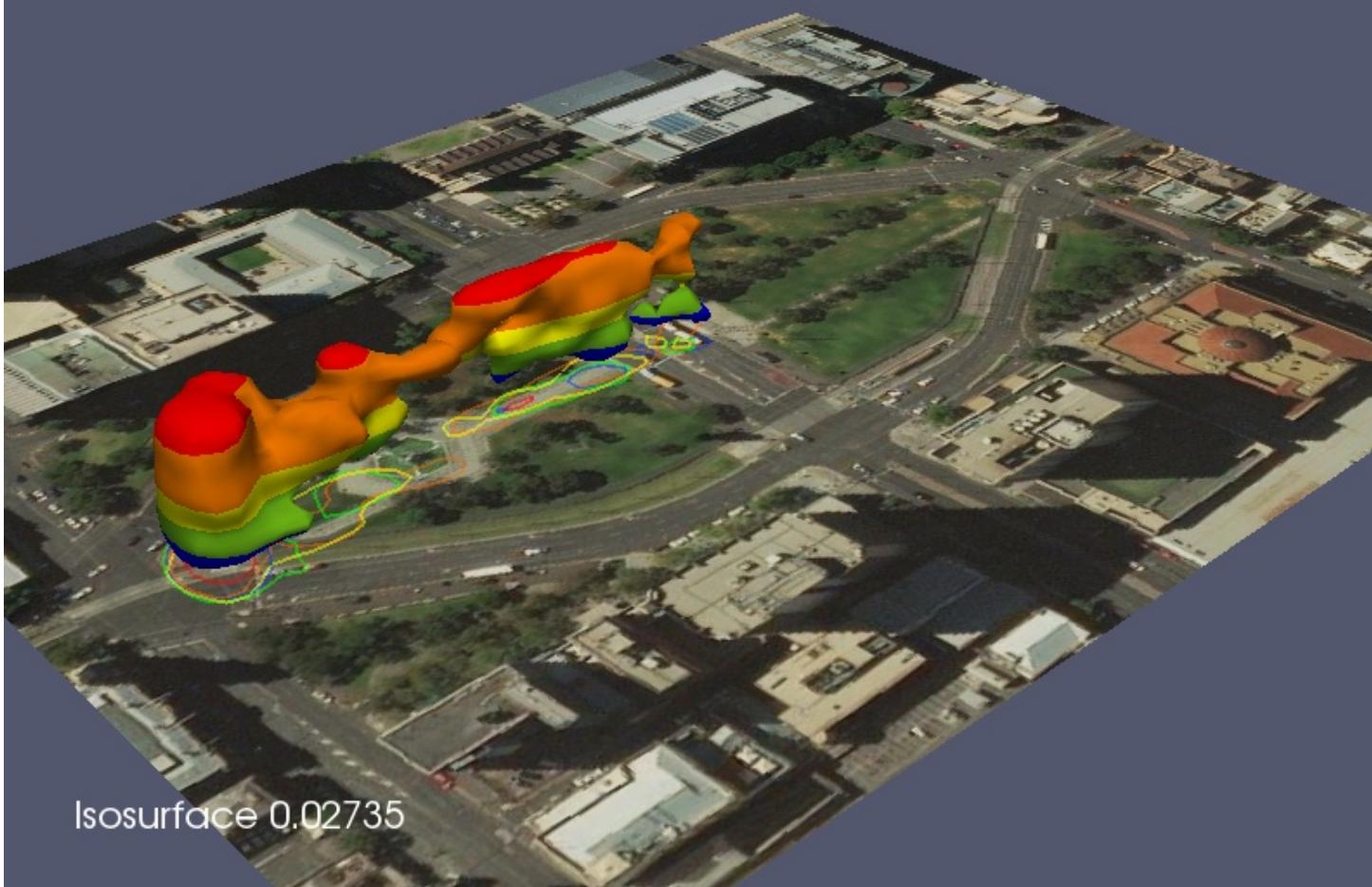
Rotate

Isosurface 0.12124

# Effects of plaza reconstruction

webcam 3760 in 2012 (Jul - Sep), Victoria Square, Adelaide, Australia

Camera 3760 in 2012



- evening (after 5 pm)
- afternoon (1 - 5 pm)
- noon (11 am - 1 pm)
- morning (9 - 11 am)
- before 9 am

Isosurface (people per  $100 \text{ m}^2\text{h}$ )



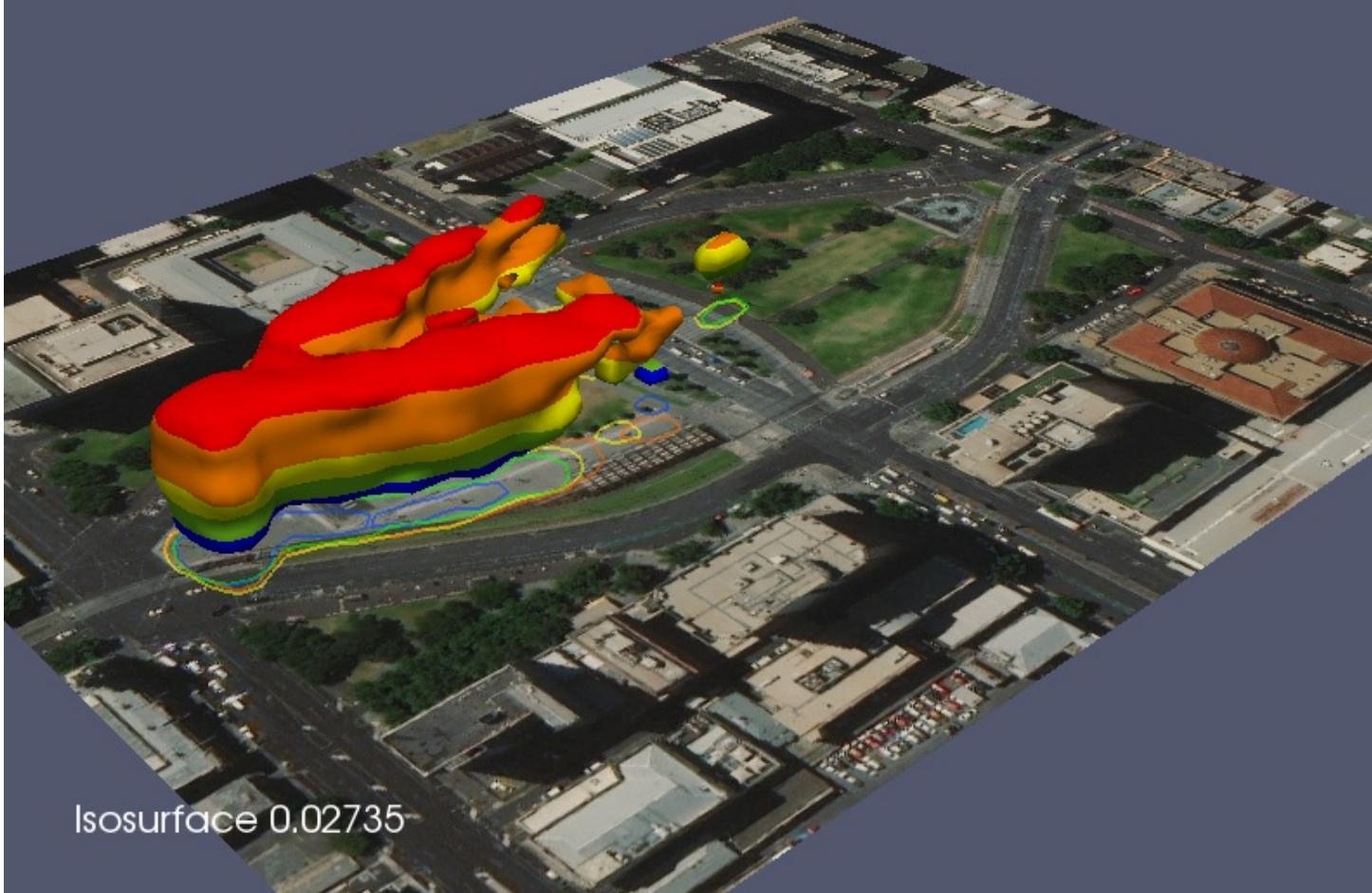
Rotate



# Effects of plaza reconstruction

webcam 3760 in 2014 (Jul - Sep), Victoria Square, Adelaide, Australia

Camera 3760 in 2014



- evening (after 5 pm)
- afternoon (1 - 5 pm)
- noon (11 am - 1 pm)
- morning (9 - 11 am)
- before 9 am

Isosurface (people per  $100 \text{ m}^2\text{h}$ )

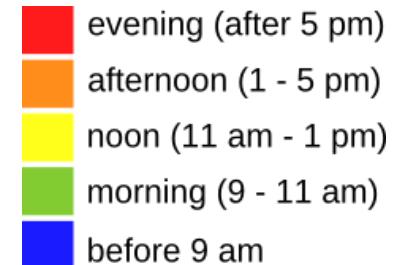
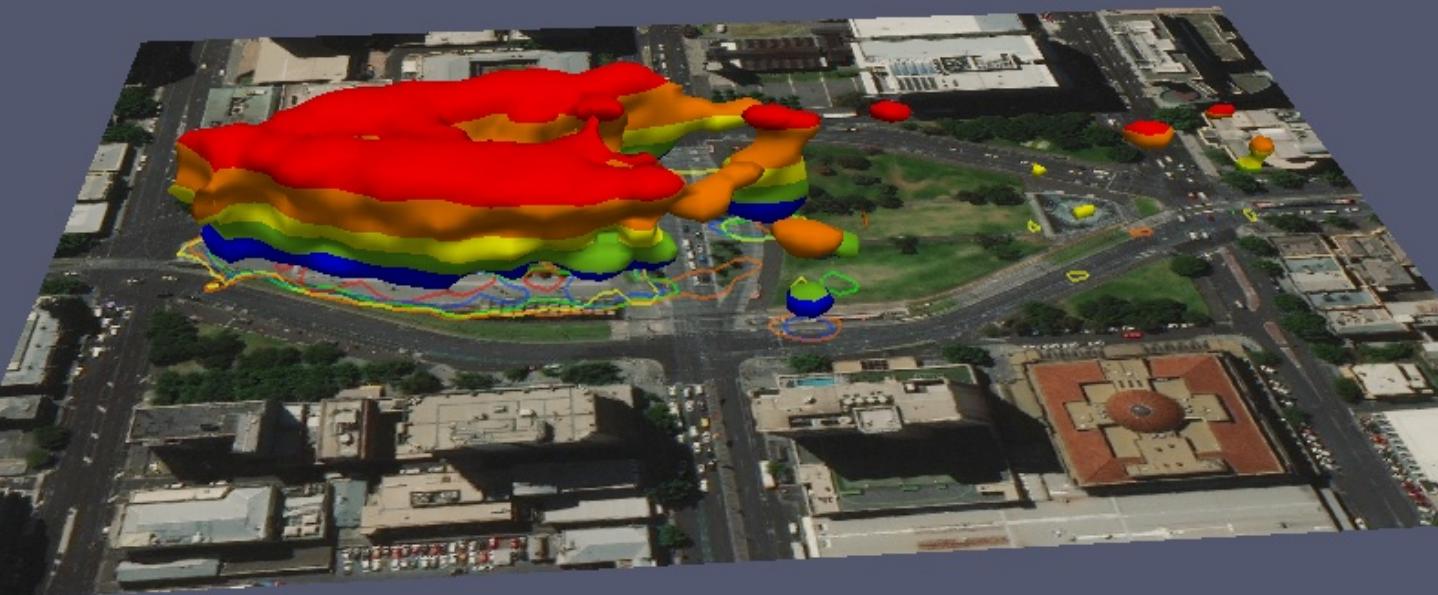
Rotate

# Change in pedestrian density (2014 minus 2012)

Positive values ~ increase in density in 2014

Negative values ~ decrease in density in 2014

Camera 3760 in 2014



Isosurface (people per 100 m<sup>2</sup>h)



Rotate

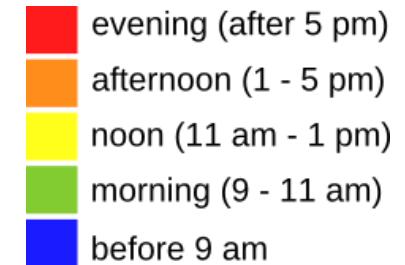
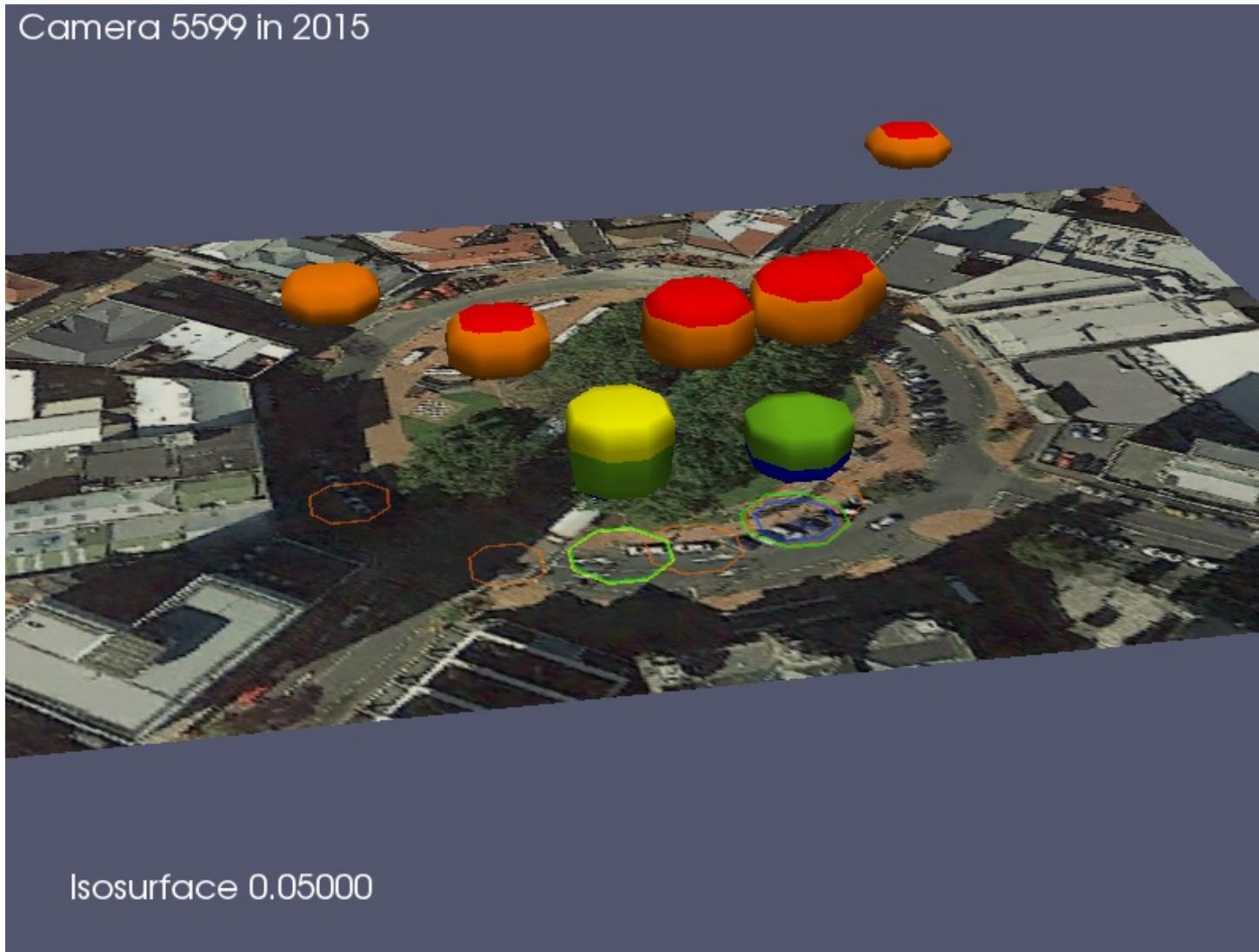


Isosurface 0.00647

# High density of pedestrians and vehicles (webcam 5599)

if ( $P > \text{percentile}^P_{99}$  AND  $V > \text{percentile}^V_{99}$ ,  $V + P$ )

Camera 5599 in 2015



Rotate



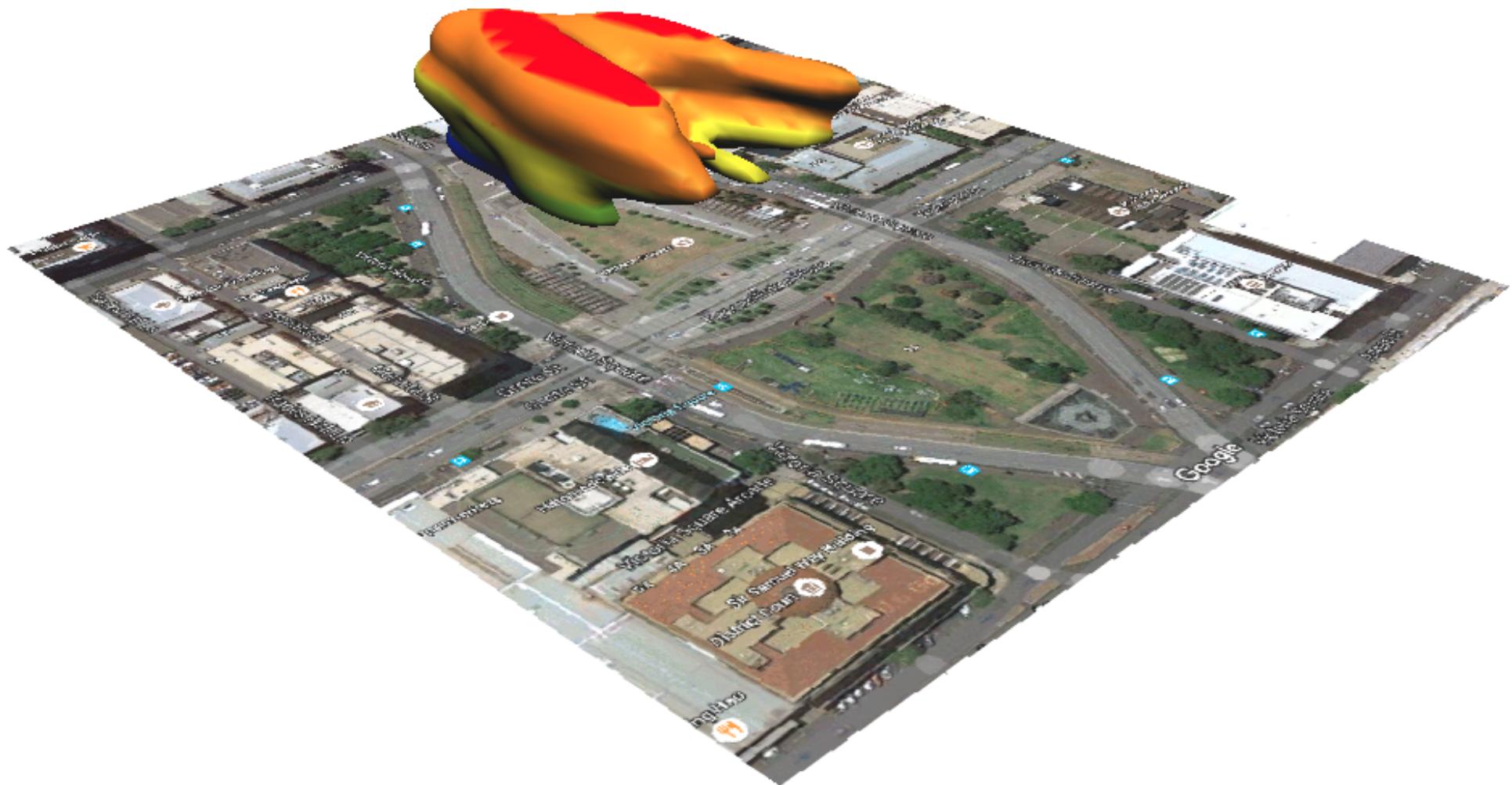
# Software

- Python libraries
- Jupyter Notebook for data exploration
- Georeferencing: scikit-image, GRASS GIS
- KDE: SciPy, Statsmodels
- Rendering: GRASS GIS, ParaView, Blender

[github.com/petrasovaa/amos-visualization](https://github.com/petrasovaa/amos-visualization)



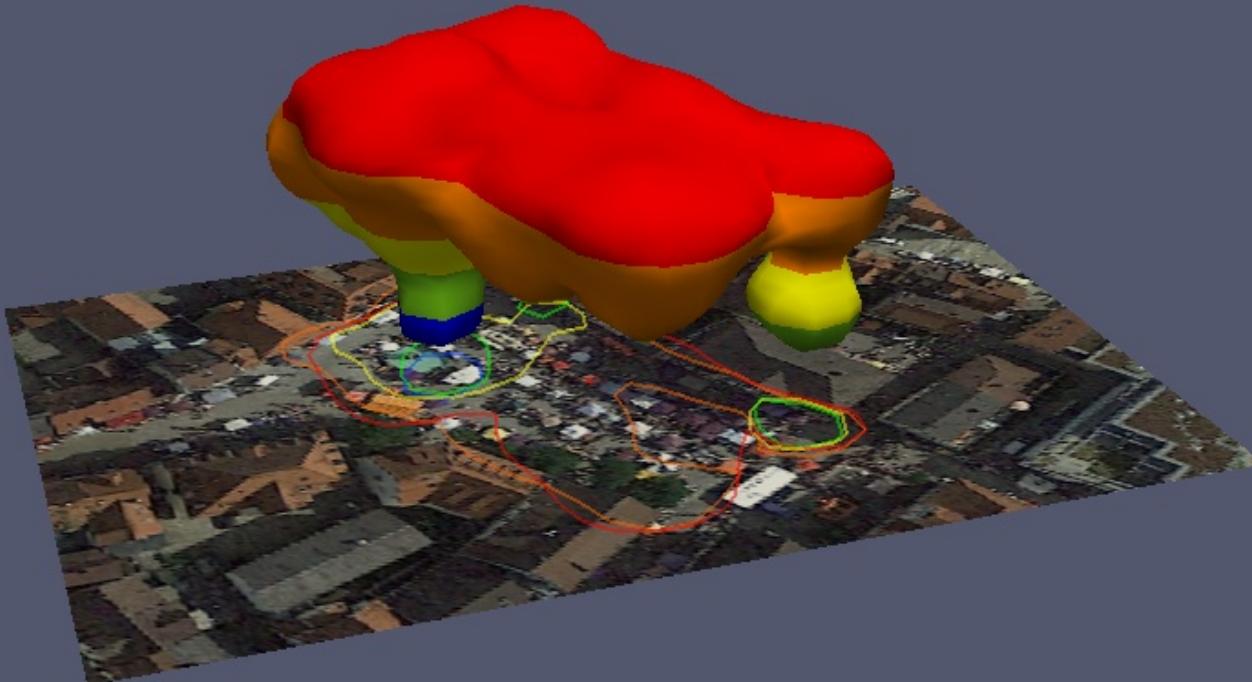
# Visualization: GRASS GIS



# Visualization: ParaView

webcam 9706 (July), Ehingen, Germany

Camera 9706 in 2014



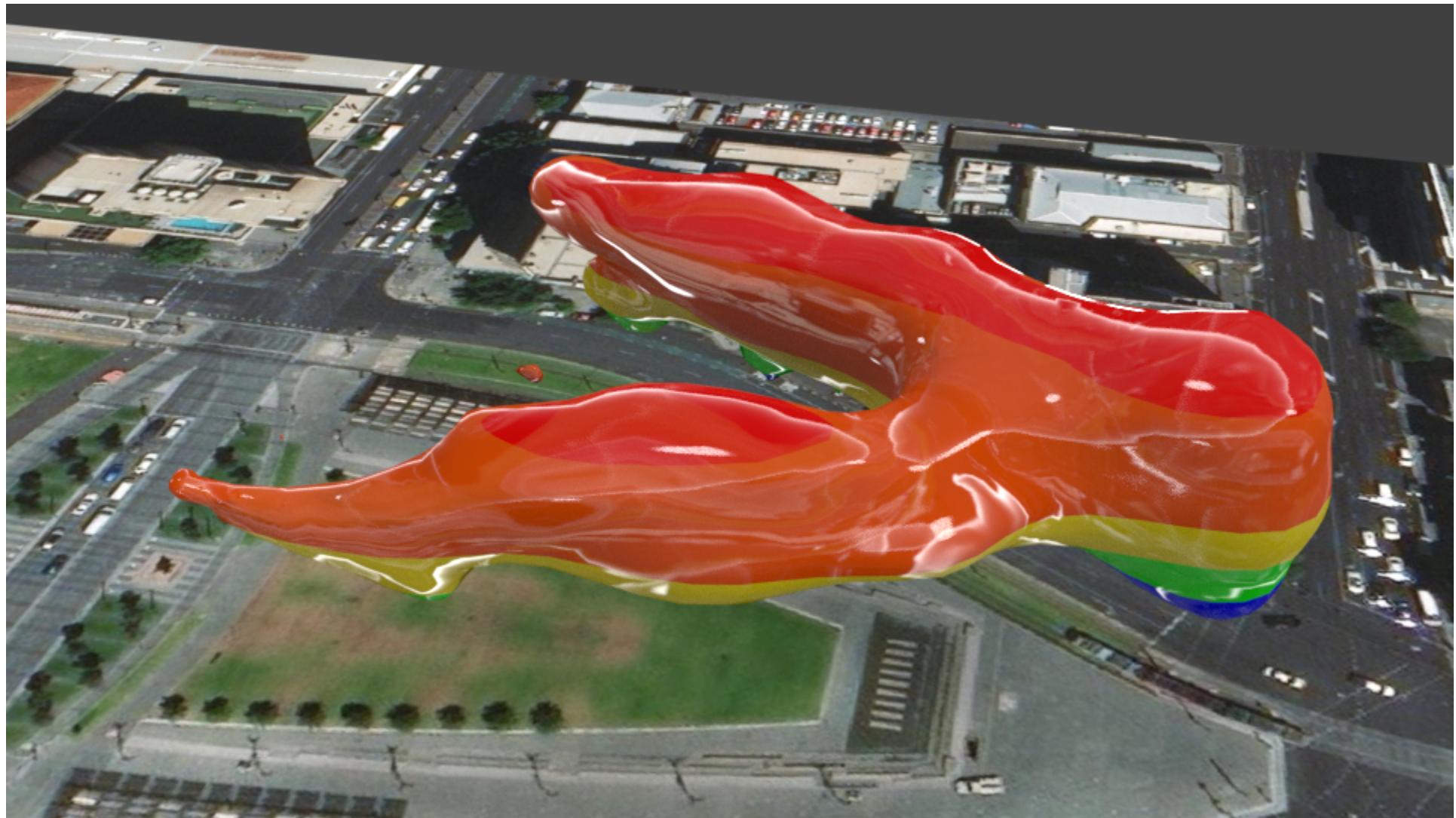
- evening (after 5 pm)
- afternoon (1 - 5 pm)
- noon (11 am - 1 pm)
- morning (9 - 11 am)
- before 9 am

Isosurface (people per  $100 \text{ m}^2\text{h}$ )

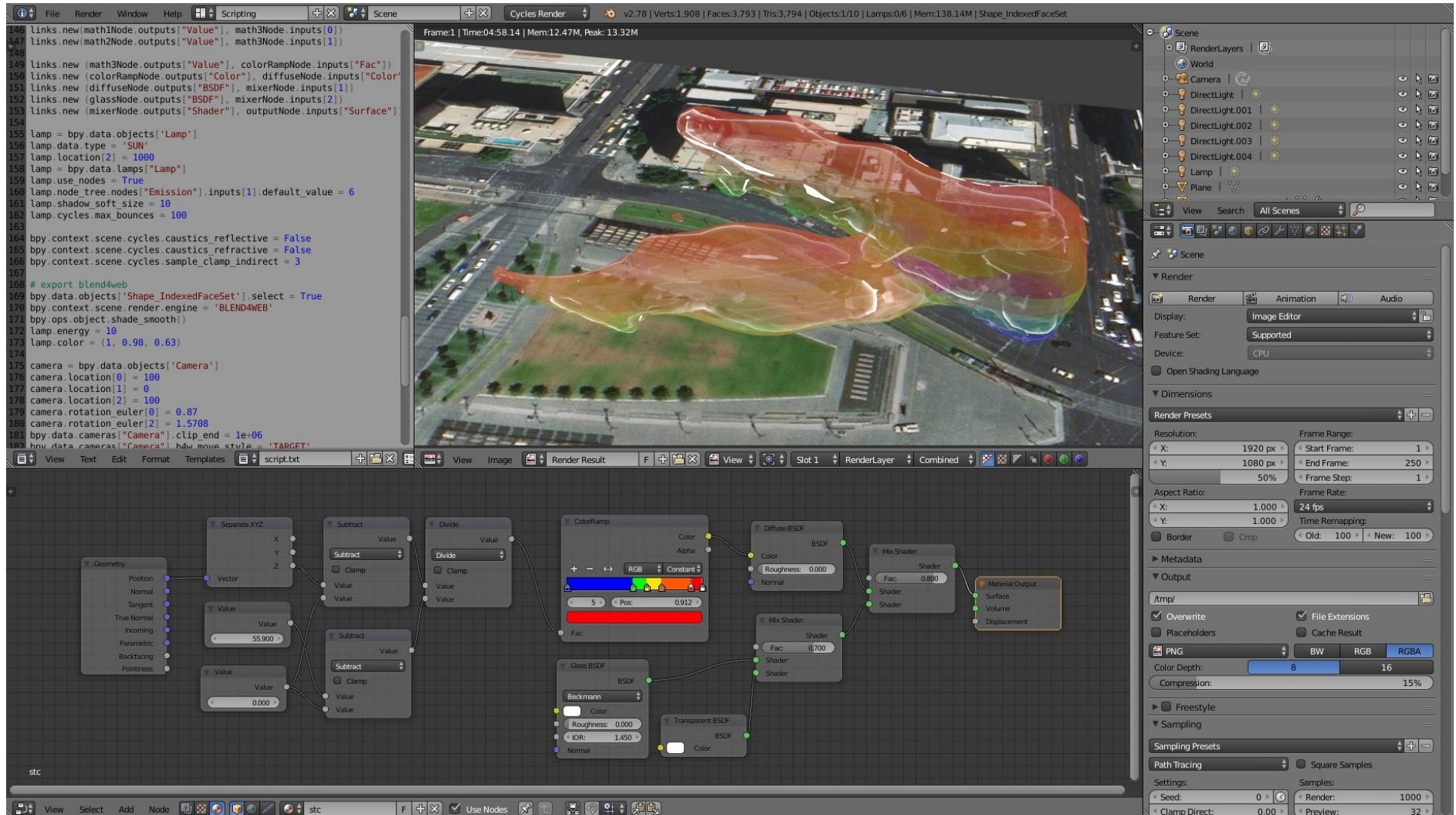
Rotate

Isosurface 0.12124

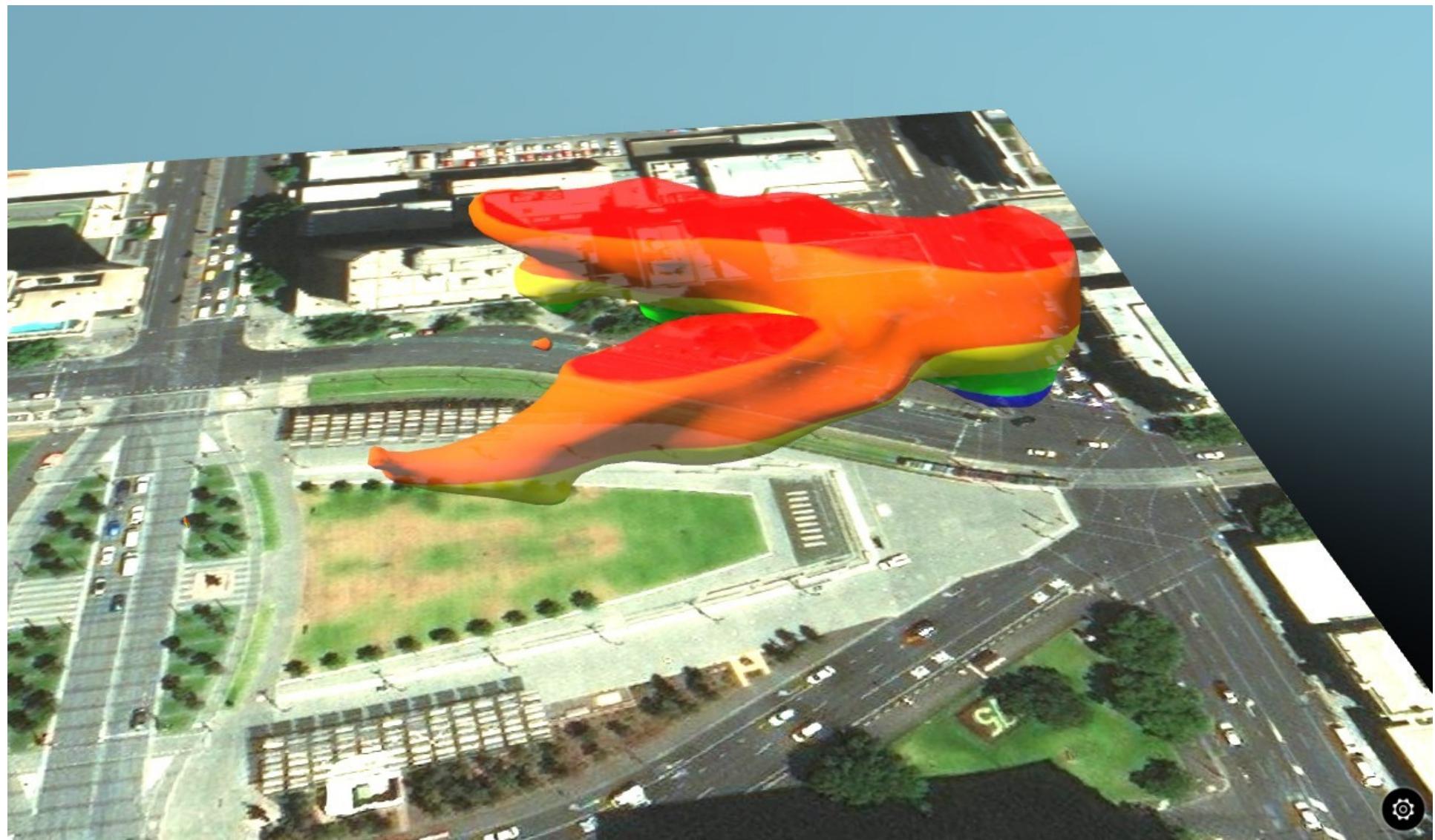
# Visualization: Blender



# Blender



# Visualization: Blend4Web



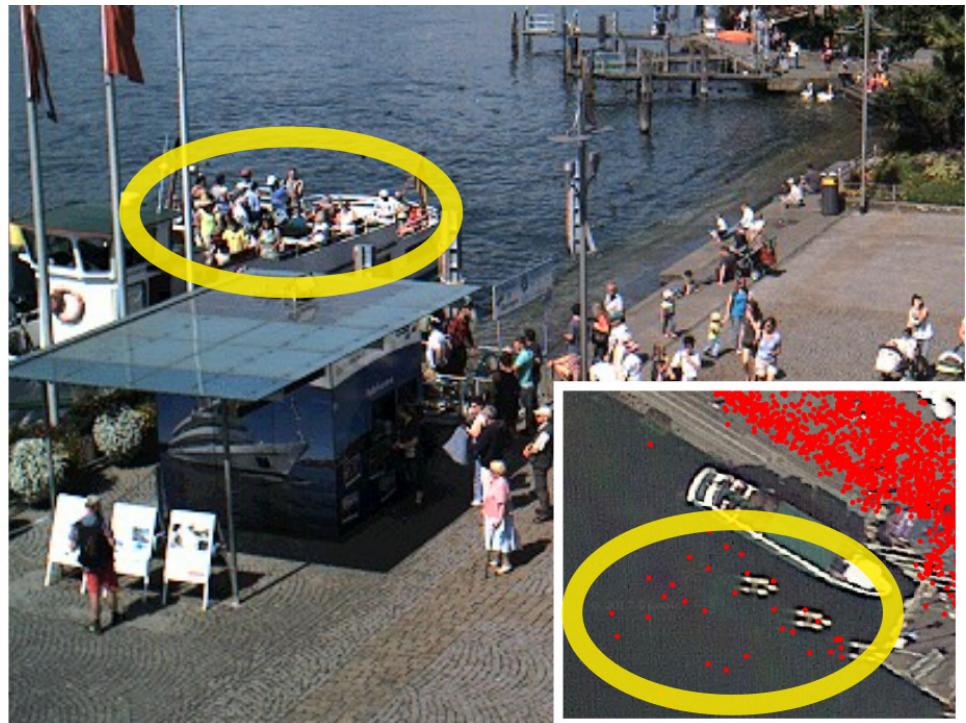
# Conclusion & Future work

- new method for **harvesting and visualization** of spatio-temporal information about active transportation
- new way for cities to **detect and analyze changes** in active transportation behavior in an unintrusive way
- georeferenced data give us the ability to **incorporate other geospatial data and methods** (e.g., solar radiation modeling)
- possible thanks to the **synergy between crowdsourcing technologies** (AMOS, mTurk, open source software)
- **machine learning** techniques trained by mTurk data will enable us to analyze much **larger data volume** in real-time, possibly leading to the discovery of more patterns

# Appendix

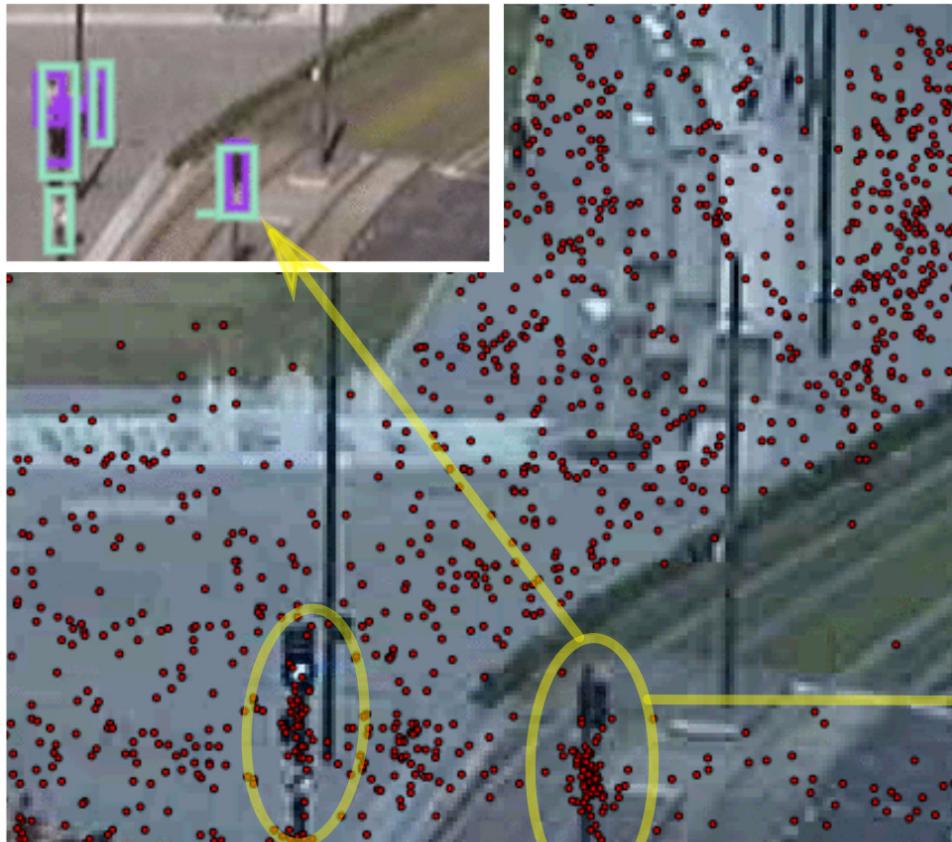
# Challenges: webcam geometry and view

- areas hidden behind trees or other objects
- assumes pedestrians and vehicles on a horizontal plane, otherwise we get large spatial errors

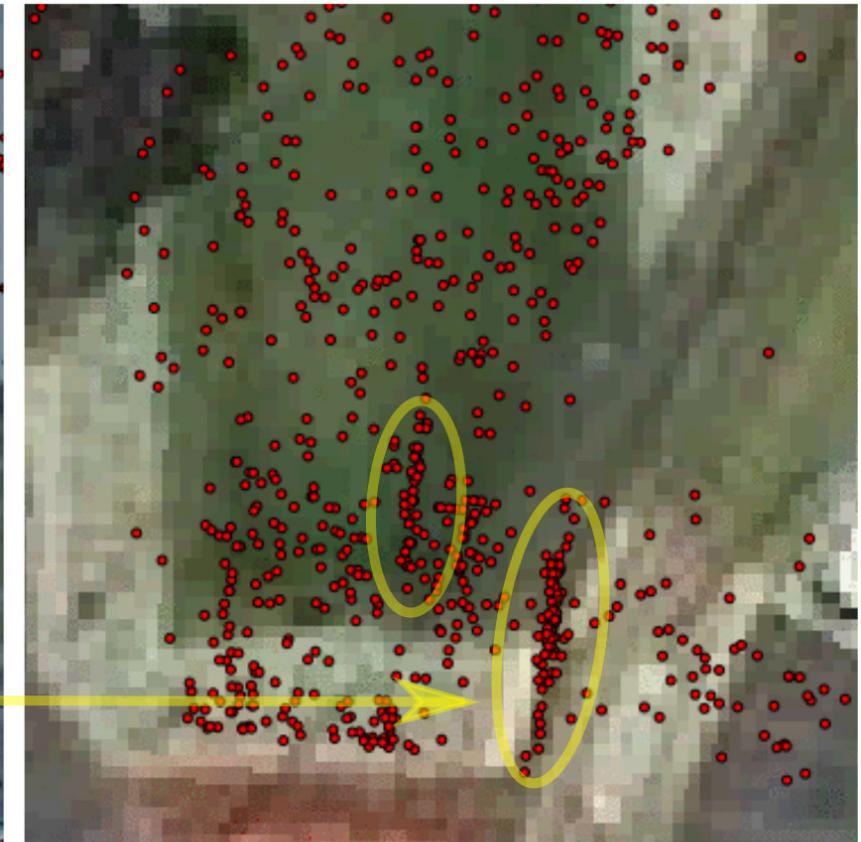


# Challenges: mTurk reliability

Traffic lights, statues mistakenly marked as pedestrians, machine learning approaches would avoid this type of error



Webcam image



Georeferenced

## References:

- Hipp, J. A., Adlakha, D., Gernes, R., Kargol, A., Pless, R., Drive, O. B., Louis, S. (2013). Do You See What I See: Crowdsource Annotation of Captured Scenes, 24–25. <http://doi.org/10.1145/2526667.2526671>
- Hipp, J. A., Manteiga, A., Burgess, A., Stylianou, A., Pless, R. (2016). Webcams, Crowdsourcing, and Enhanced Crosswalks: Developing a Novel Method to Analyze Active Transportation. *Front. Public Health*, 4(97). <http://doi.org/10.3389/fpubh.2016.00097>
- Jacobs, N., Roman, N., Pless, R. (2007). Consistent temporal variations in many outdoor scenes. *Proceedings of the IEEE Computer Society Conference on Computer Vision and Pattern Recognition*. <http://doi.org/10.1109/CVPR.2007.383258>