

# What Makes London Work Like London?



*Sawsan Al-Halawani*



*Yongliang Yang*



*Peter Wonka*

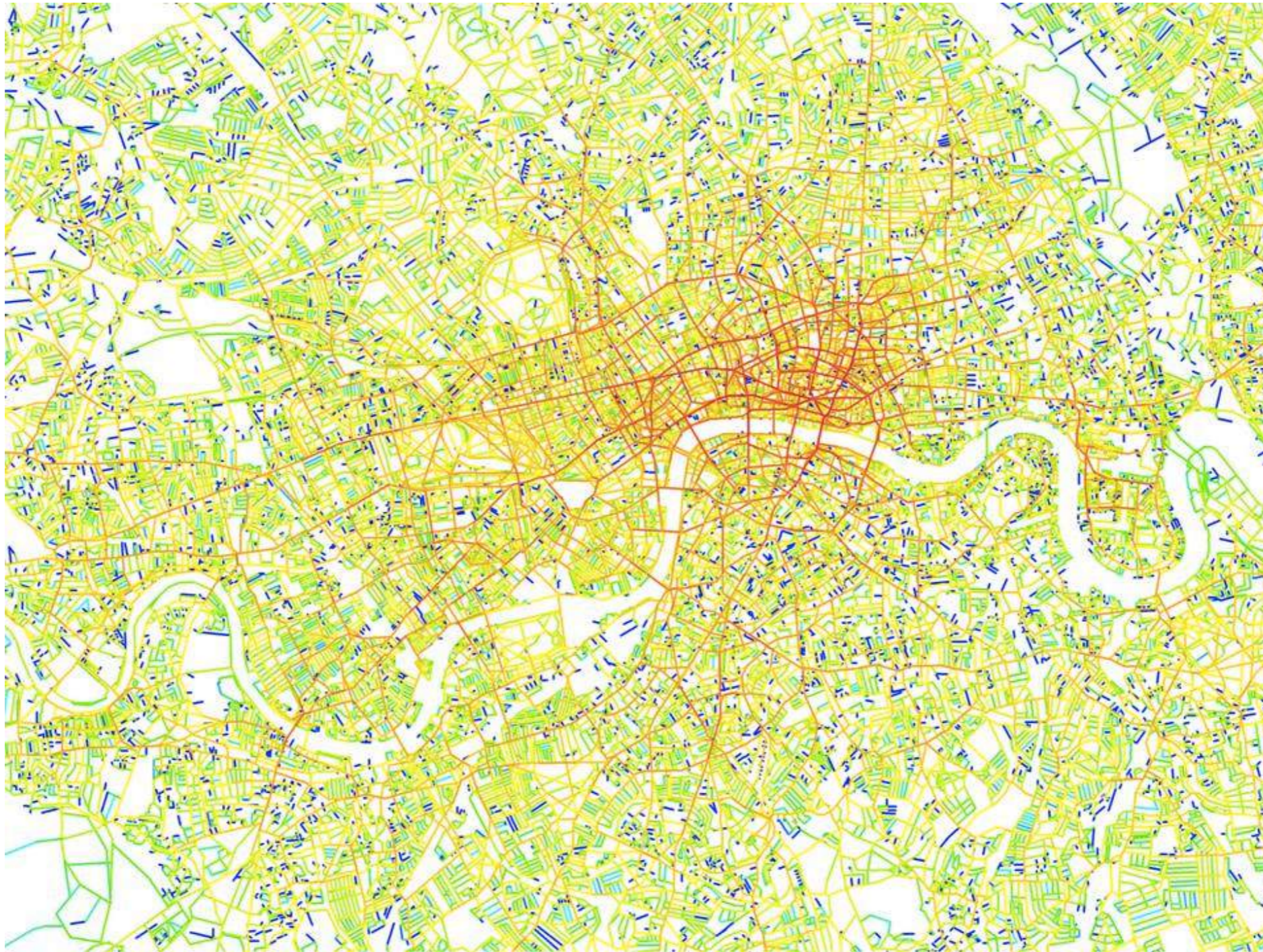
*Niloy J. Mitra*



# Urban Environments



# How do Cities Behave?



[SpaceSyntax]

# What are the Good Features?

Paris?

New York?

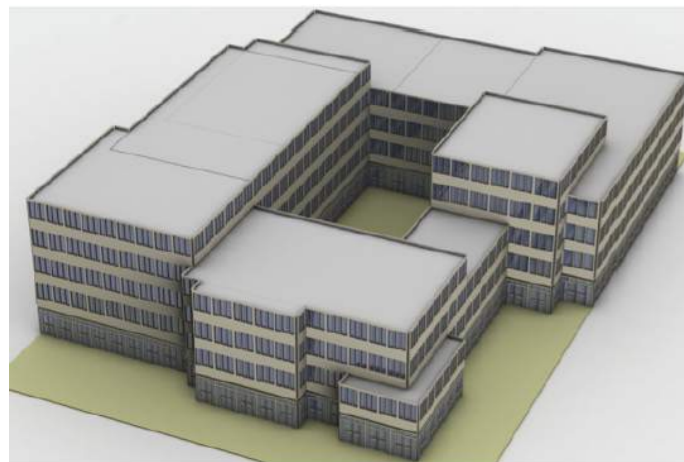
London?



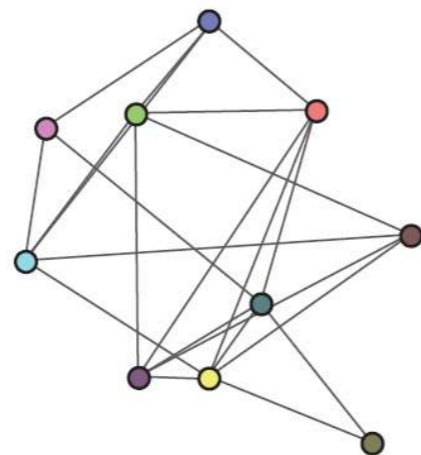
Hong Kong?

Moscow?

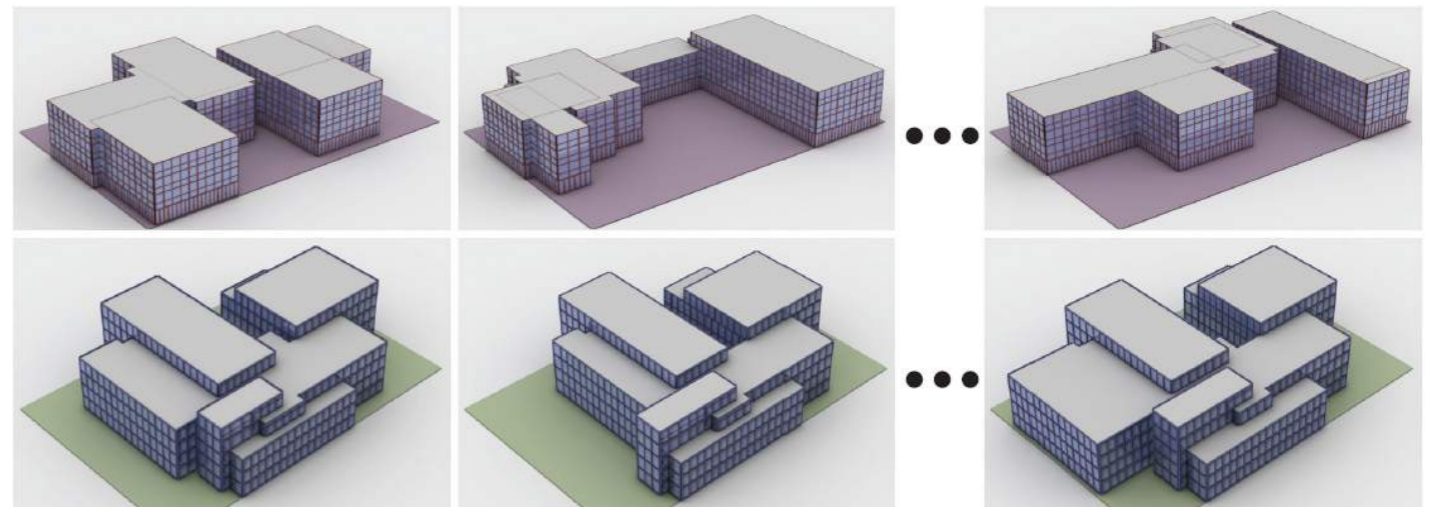
# Virtual Cities



1 of 10 initial good layouts



portal graph



[Bao et al., Siggraph 2013]

# 'Virtual Urbanity'



*Environment and Planning B: Planning and Design* 2008, volume 35, pages 881–901

doi:10.1080/09693200802000000

**The connectivity of streets: reach and directional distance**

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Received 26 July 2006; in revised form 3 April 2007

**Abstract.** We introduce two measures of connectivity that are applicable to standard GIS-based representations of street networks. The *reach* of a point measures the total street length covered by all paths extending out from that point that are no longer than a given threshold value. The *directional distance* of a street network from a point is measured according to the minimum number of direction changes required to reach any part of the network from that point, consistent with typical measures used in space syntax. However, our measure of directional distance requires no prior commitment as to the relational elements that make up the network. Any part of the network which is accessible from a point without a change of direction greater than a given threshold angle is treated as a single directional element for the purposes of computation. Street segments are characterized by the reach and directional distance of their midpoints. Networks are characterized by the average directional distance of the corresponding street segments. The measures render explicit the interplay between metric and topological properties of networks. Preliminary studies show that the measures discriminate well between different morphologies of street networks. When used to compare urban morphologies they are well correlated with standard measures used in the literature, with the added advantage that they can discriminate between street segments within the same urban area. Using field observations we also show that the measures can be used to model the effect of spatial configuration upon movement in ways which compare favorably to standard space syntax.

**Introduction**  
In the most general sense, connectivity is about relatedness. In this paper we discuss the specific form of relatedness that arises according to the structure of street networks. We do not limit the idea of connectivity to some local measure, such as the number of intersections along a street, or the number of streets that come together at an intersection; these are best denoted by the term 'degree', as it pertains to the node of a graph representing relationships between elements. The aims of this paper are twofold. First, to introduce measures of street connectivity that can be computed on the basis of standard GIS representations of street networks, such as the street centerline maps that are readily available for all cities in the US. Second, to rethink some of the measures of street connectivity associated with space syntax in a way which takes into account recent advances in the field, as well as criticisms raised by authors who have discussed space syntax in this journal in recent years. In addressing these aims we set the foundations for future research aimed at testing theoretical hypotheses. This paper is focused upon the definition and clarification of descriptive concepts and their computational implications. Still, we present the results of a pilot field study indicating that the new measures postdict the distribution of pedestrian movement as well as standard syntactic measures. We also discuss the relationship of the new measures to standard morphological measures used in the literature.

[Bakolas '07]

[Peponis et al. '07]

Original Article

**Understanding the link between street connectivity, land use and pedestrian flows**

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<sup>b</sup>College of Architecture, Georgia Institute of Technology, Atlanta, GA 30332-0155, USA; E-mail: john.peponis@coa.gatech.edu; brian.stone@coa.gatech.edu  
\*Corresponding authors.

**Abstract.** The distribution of pedestrian movement by street segment in three areas in Atlanta is modeled in relation to measures of street connectivity and land use. Although land use accounts for the pronounced differences in average pedestrian volumes per area, the connectivity of the street network affects the distribution of pedestrians on a street-by-street basis within each of them. The measures of connectivity that are used describe the density of street connections and the extent to which streets are sinuous or aligned. This study enhances previous findings, particularly those using space syntax, by better controlling for the effects of land use as compared to the effects of street connectivity and network layout. Asserting the independent role of street network design is important given that streets act as the long-term framework within which land use change over time. The measures of street connectivity are easy to implement on a GIS platform to support the evaluation and development of design and regulatory frameworks that promote walking, whether it be in the interest of public health, in reducing automobile dependence or in supporting vibrant urban communities. *URBAN DESIGN International* (2011) 16, 125–141. doi:10.1080/10574812.2011.561000 published online 16 March 2011

**Keywords:** street connectivity; pedestrian movement; Atlanta; land use

**Introduction: Does the Spatial Structure of Street Networks have Independent Effects on Pedestrian Movement?**  
The reduction of automobile dependence and the inducement of non-auto commuting have emerged as commonly shared city planning and urban design aims. Along with the ideals of smart growth and new urbanism, they are reshaping urban form across the United States. The studies of impact of the built environment on individual travel behavior that are reviewed below have generally focused on population densities, land use mix and the qualities of urban design. The latter has often been treated with reference to the immediate condition of individual streets, ranging from the dimensions and design of sidewalks to the frontages of retail or the prevailing levels of environmental comfort that may encourage pedestrian movement (Badland and Schofield, 2005; Ewing et al., 2006; Gehl et al., 2006; Ewing and Handy, 2009). Pedestrian safety, of course, is also shown to be a major factor in determining physical activity levels (Boarnet et al., 2005). Safe and pleasant conditions encourage walking (Brown et al., 2007).  
These are undoubtedly important factors. However, an intuitive distinction can be drawn between urban environments in which pedestrian presence and walking are contained within a well-circumscribed enclave (that is, a shopping mall or a small pedestrian-friendly development) or directed towards well-defined local destinations (that is, a school or a transit station) and environments where pedestrian movement is distributed over larger areas, with a mixture of longer and shorter pedestrian paths, multiple and overlapping rather than converging trajectories and varied intensities. It would seem that in order to understand the latter and design towards them,

[Ozibil et al. '11]

**What Makes Paris Work Like Paris?**

**Abstract.** The distribution of pedestrian movement by street segment in three areas in Atlanta is modeled in relation to measures of street connectivity and land use. Although land use accounts for the pronounced differences in average pedestrian volumes per area, the connectivity of the street network affects the distribution of pedestrians on a street-by-street basis within each of them. The measures of connectivity that are used describe the density of street connections and the extent to which streets are sinuous or aligned. This study enhances previous findings, particularly those using space syntax, by better controlling for the effects of land use as compared to the effects of street connectivity and network layout. Asserting the independent role of street network design is important given that streets act as the long-term framework within which land use change over time. The measures of street connectivity are easy to implement on a GIS platform to support the evaluation and development of design and regulatory frameworks that promote walking, whether it be in the interest of public health, in reducing automobile dependence or in supporting vibrant urban communities. *URBAN DESIGN International* (2011) 16, 125–141. doi:10.1080/10574812.2011.561000 published online 16 March 2011

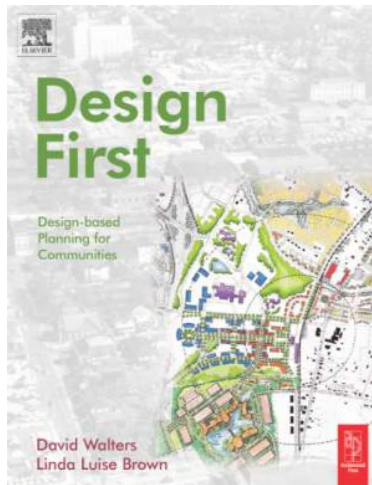
[Doerch et al. '12]

# Street Network Analysis

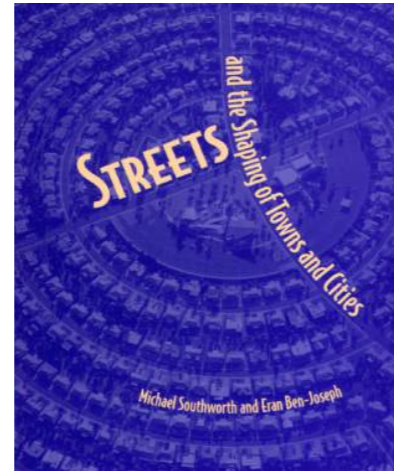
Street network  
descriptors

# Related Work

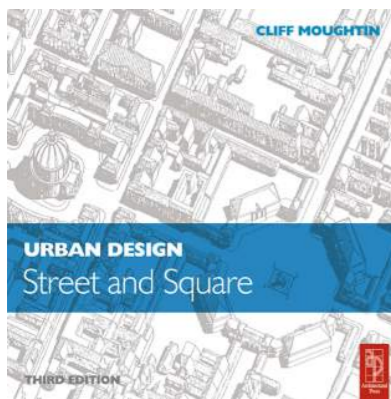
## Urban Analysis



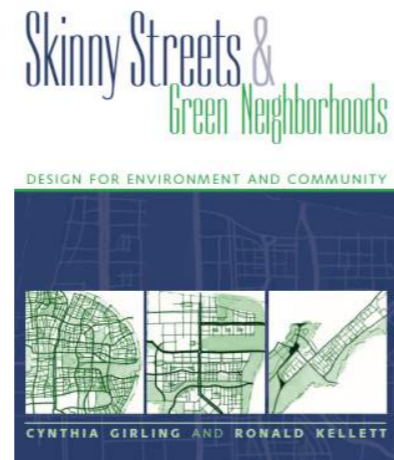
Walters & Brown  
2004



Southworth &  
Ben-Joseph 2003



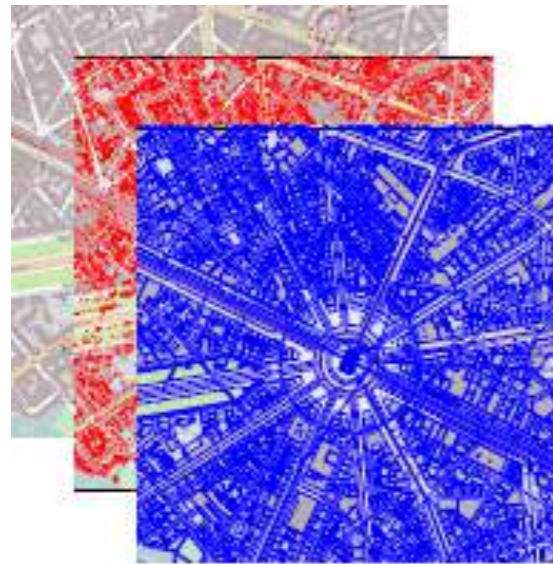
Moughtin  
1992



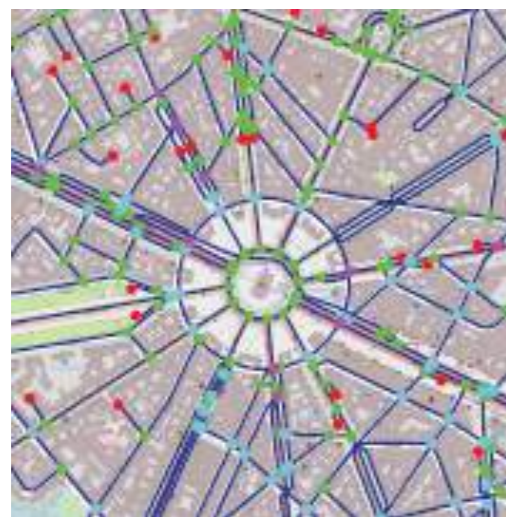
Gerling & Kellett  
2005



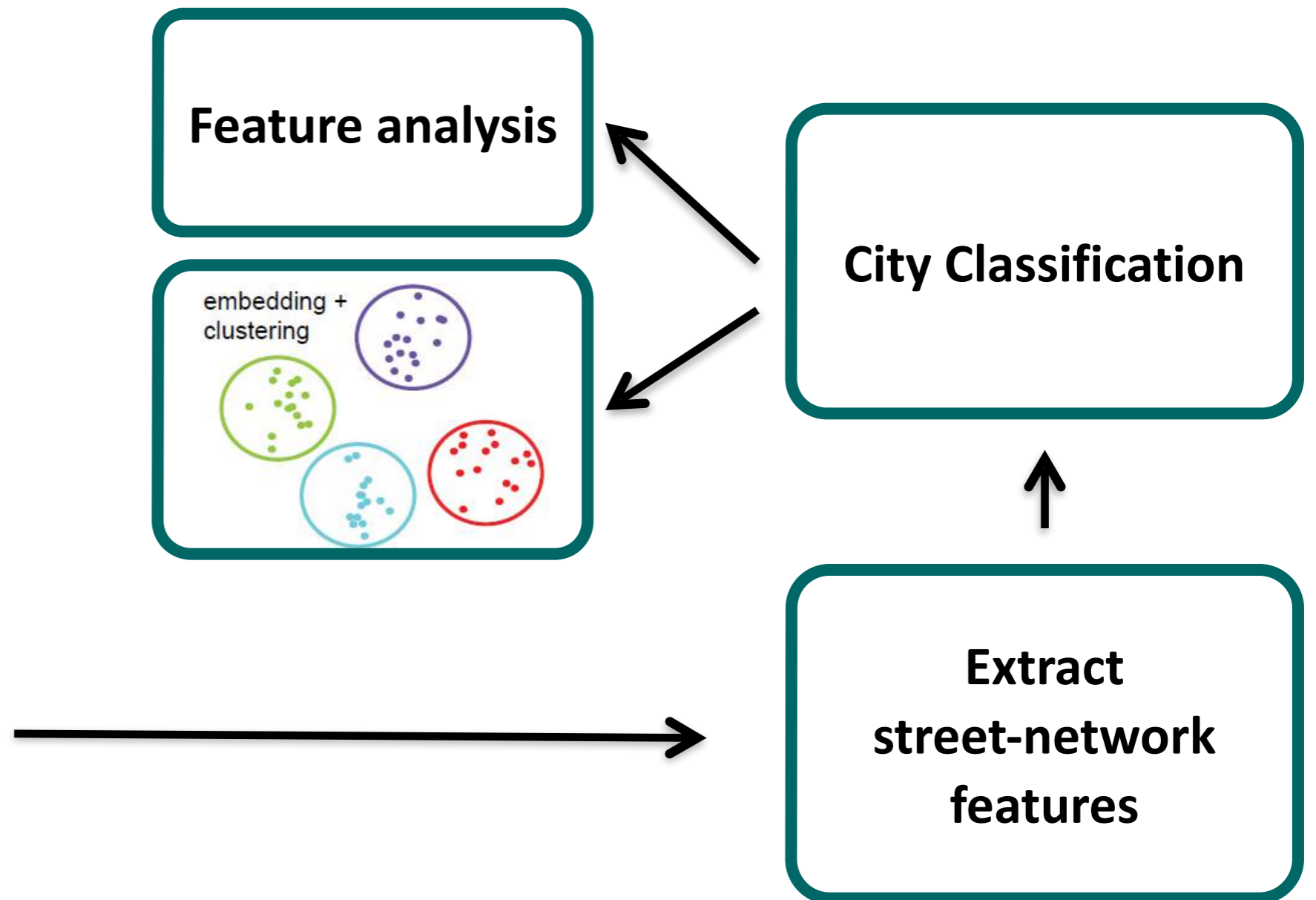
# Analysis Framework



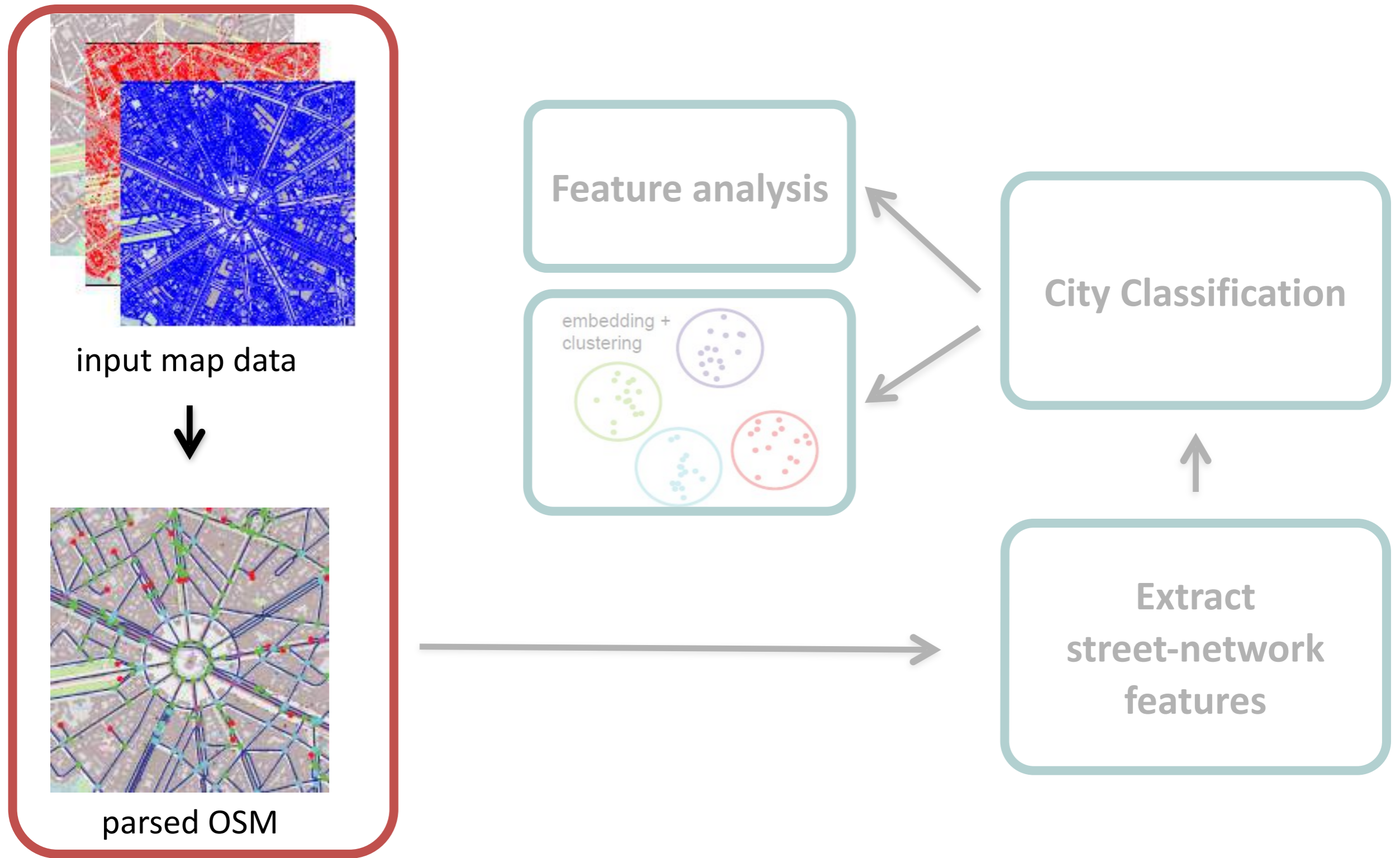
input map data



parsed OSM

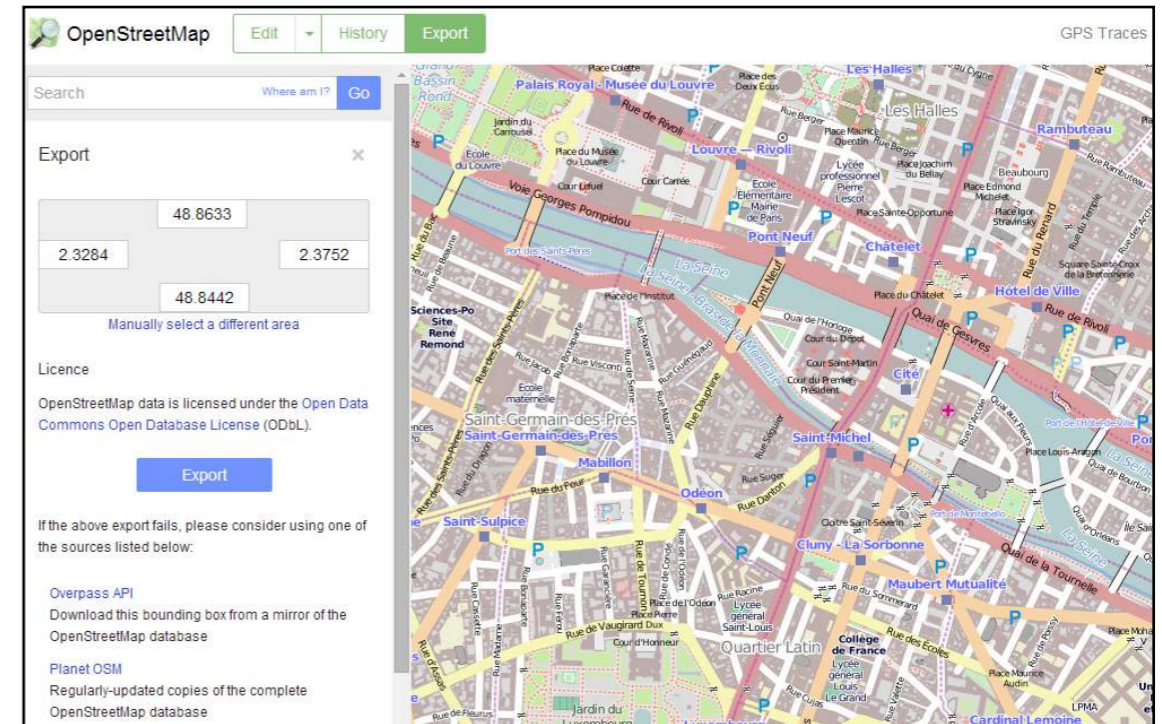


# Analysis Framework



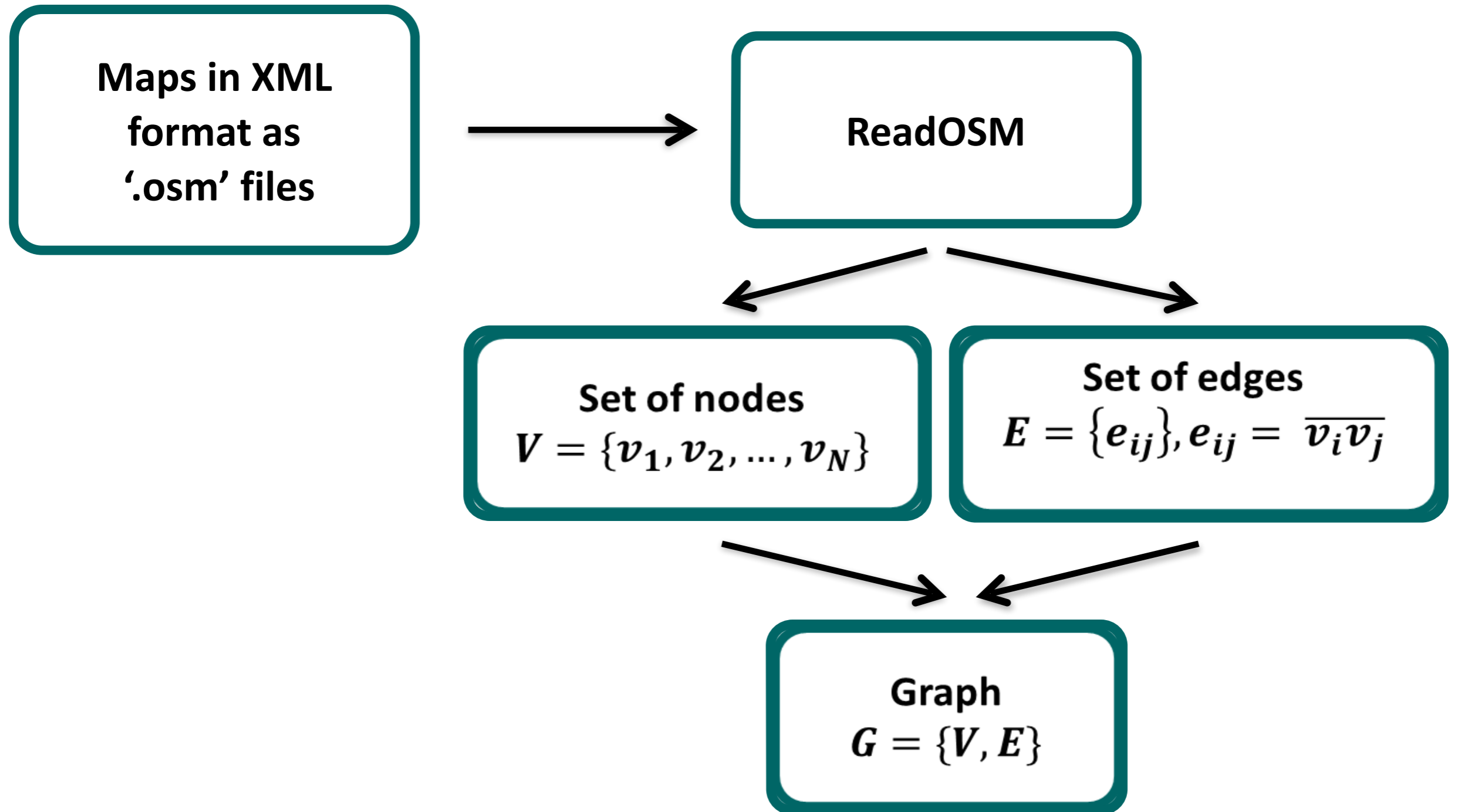
# Data Gathering

- 10 cities
- 3 scales
  - $\{0.25\text{km}^2, 1\text{km}^2, 4\text{km}^2\}$
- 100 samples

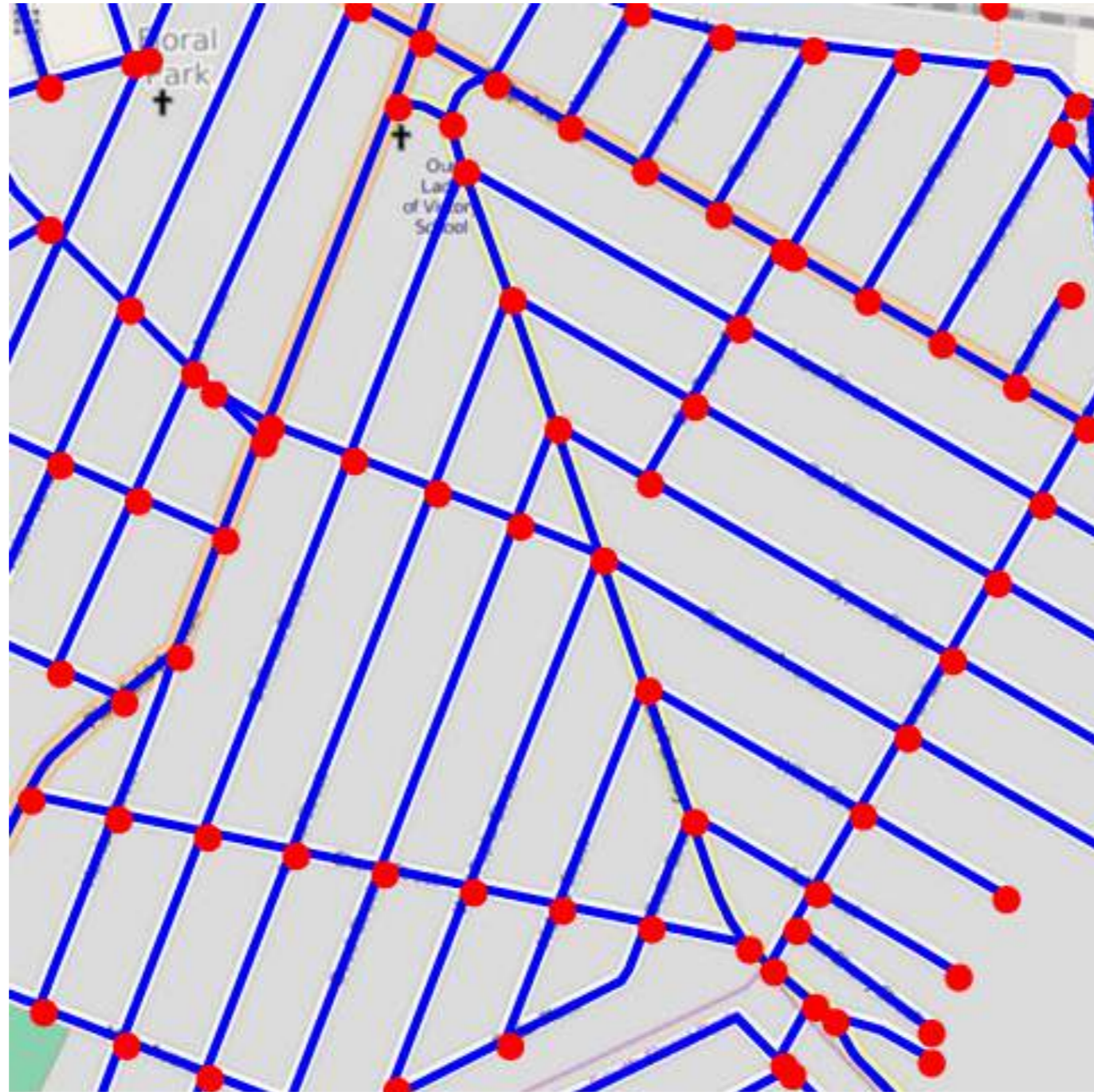


Beijing, Camp Durant, Cardiff, London, Los Angeles, Moscow, New York, Paris, Toronto, Vienna

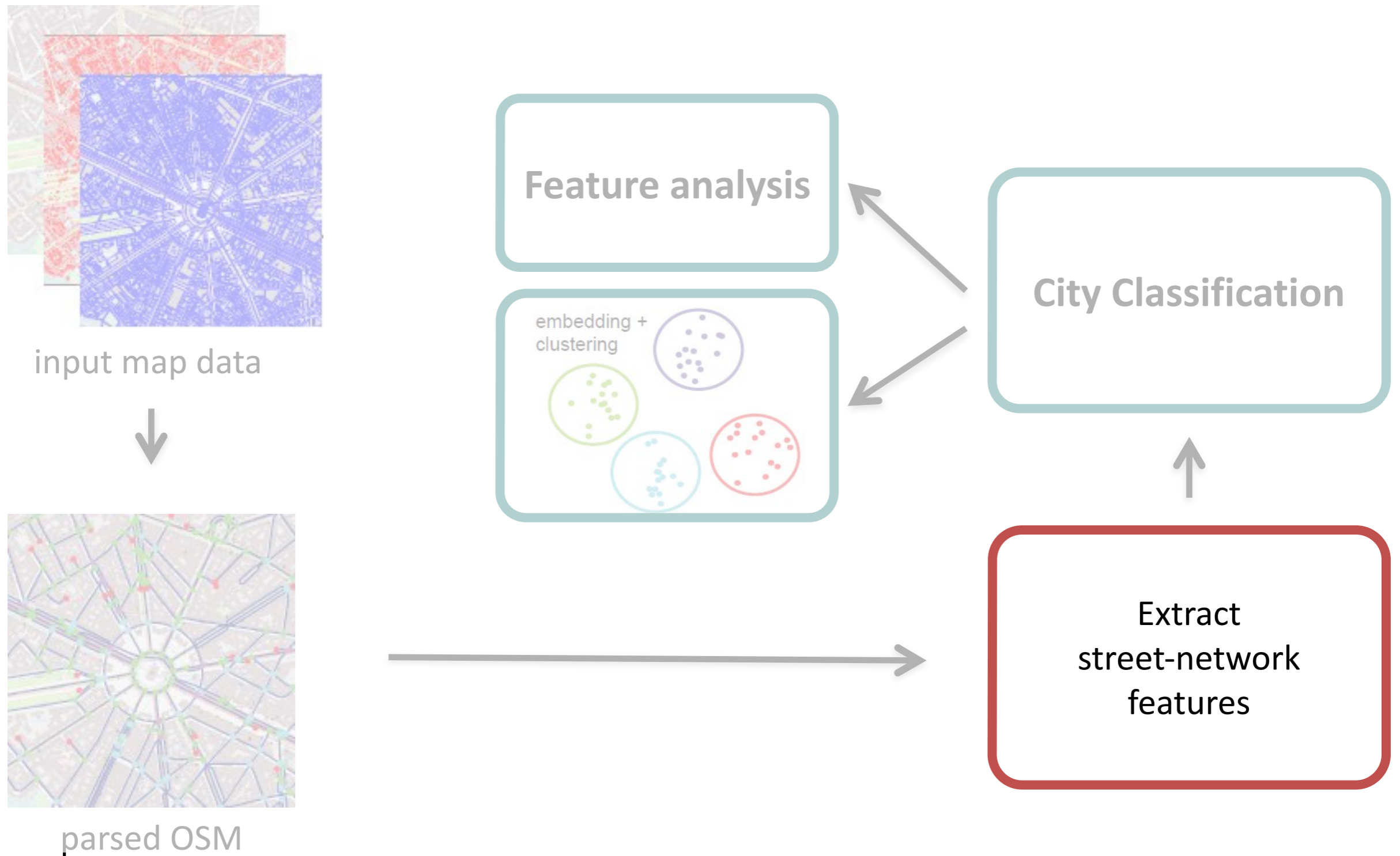
# Encoding Street Networks



# Parsed Street Data



# Algorithm



# Street Network Analysis

## Topological features

- Valence
- Street density
- Connectivity index
- Intersection density
- 4-way crossing ratio

## Geometric features

- Total street length
- Average street length
- Transportation convenience
- Redundancy
- Metric reach
- Travel distance histogram

# Street Network Analysis

## Topological features

- Valence
- Street density
- Connectivity index
- Intersection density
- 4-way crossing ratio

## Geometric features

- Total street length
- Average street length
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- Travel distance histogram



# Topological Features

- **Valence** (of a junction)

- dead end  $t_v = 1$

- T-junction  $t_v = 3$

- 4-way crossing  $t_v = 4$

- others  $t_v > 4$

# Topological Features



Nodes with valence = 1

# Topological Features

- **Street density**
  - # streets per unit area
  
- **Intersection density**
  - # intersection per unit area ( $t_v > 2$ )
  
- **4-way crossing ratio**

# Topological Features

- **Connectivity index**
  - how well is a network connected?

# Street Network Analysis

## Topological features

- Valence
- Street density
- Connectivity index
- Intersection density
- 4-way crossing ratio

## Geometric features

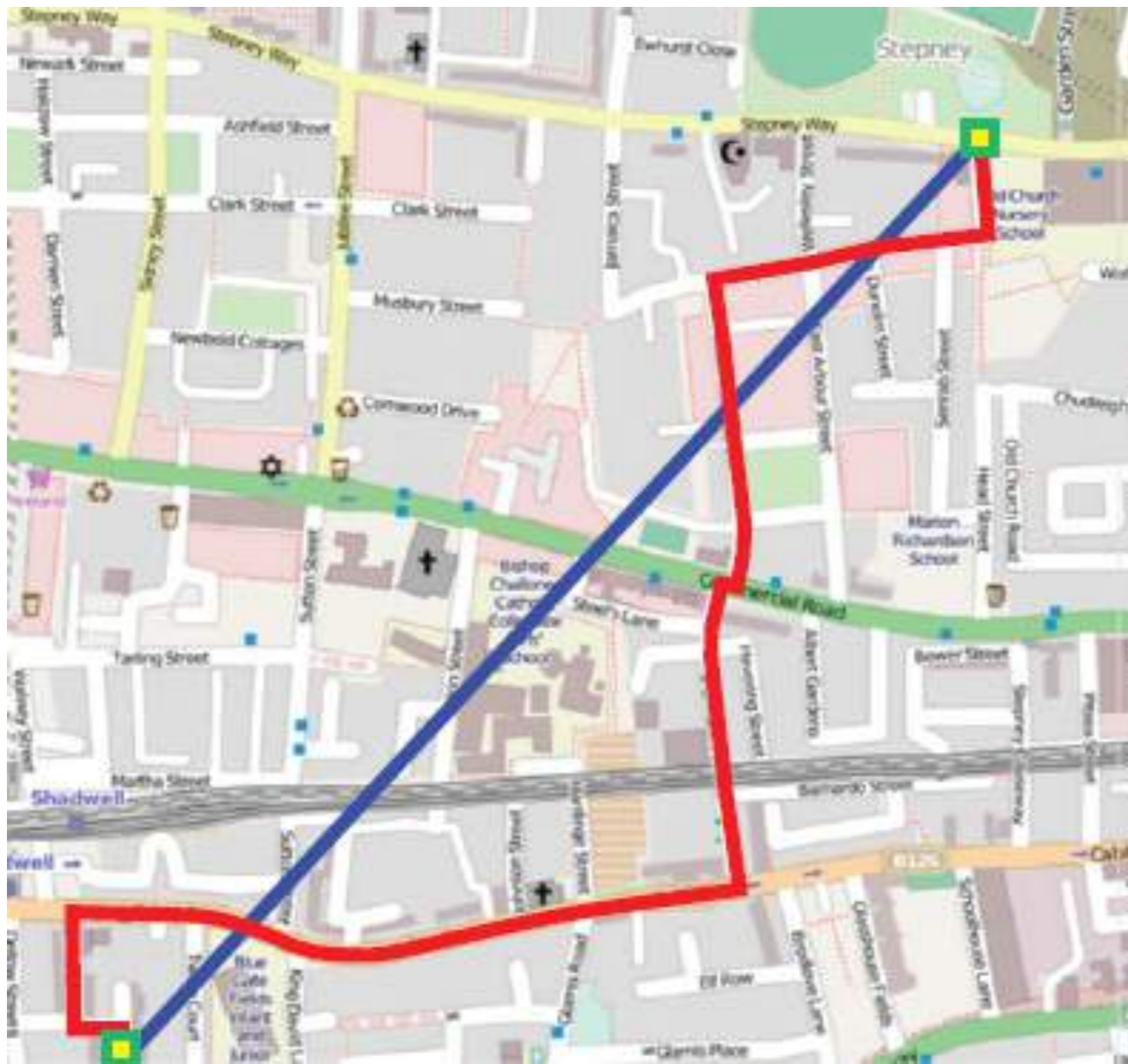
- Total street length
- Average street length
- Transportation convenience
- Redundancy
- Metric reach
- Travel distance histogram

# Geometric Features

- **Total street length**
- **Average street length**

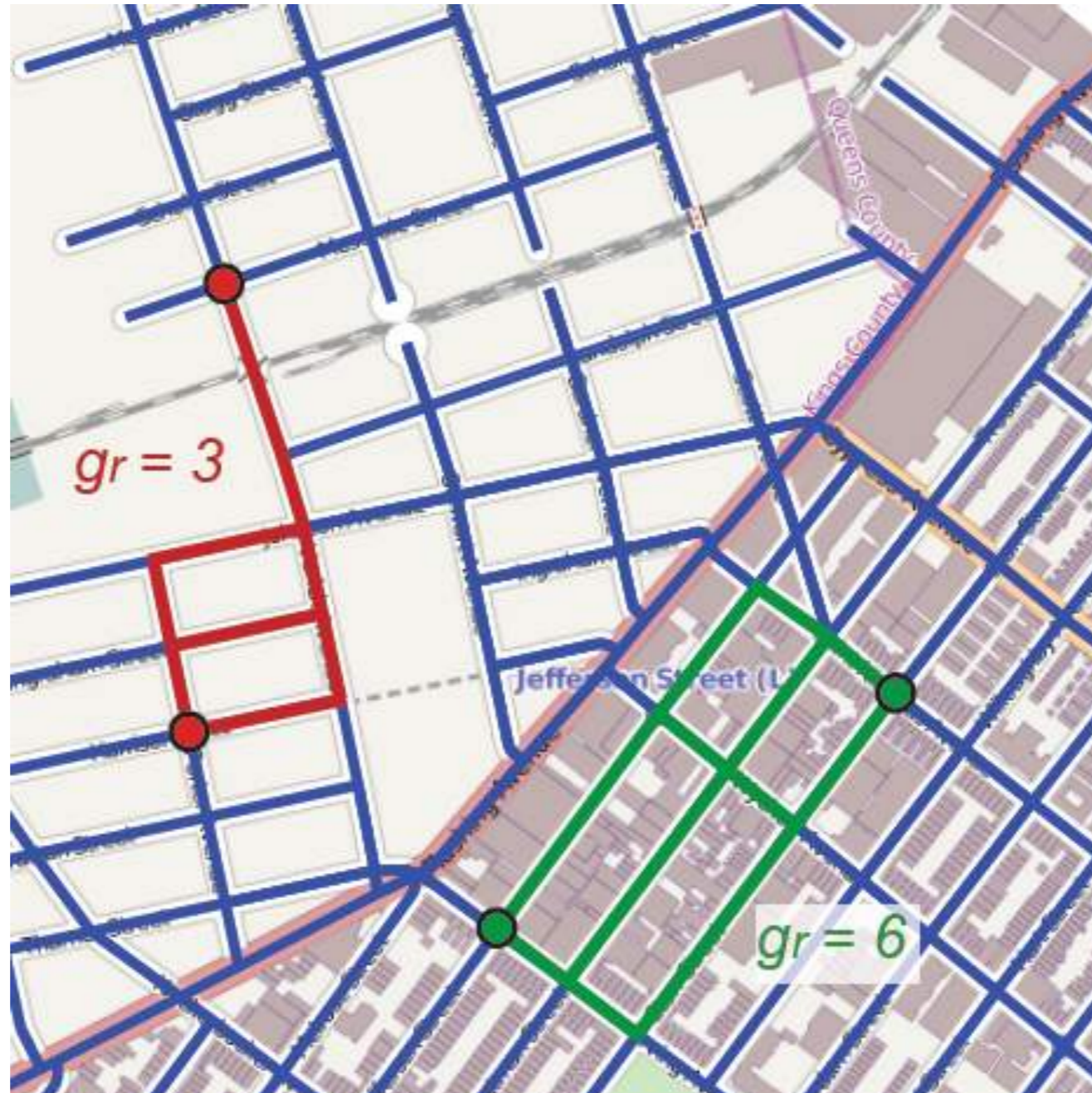
# Geometric Features

## Transportation convenience



# Geometric Features

## Redundancy ( $g_r$ )





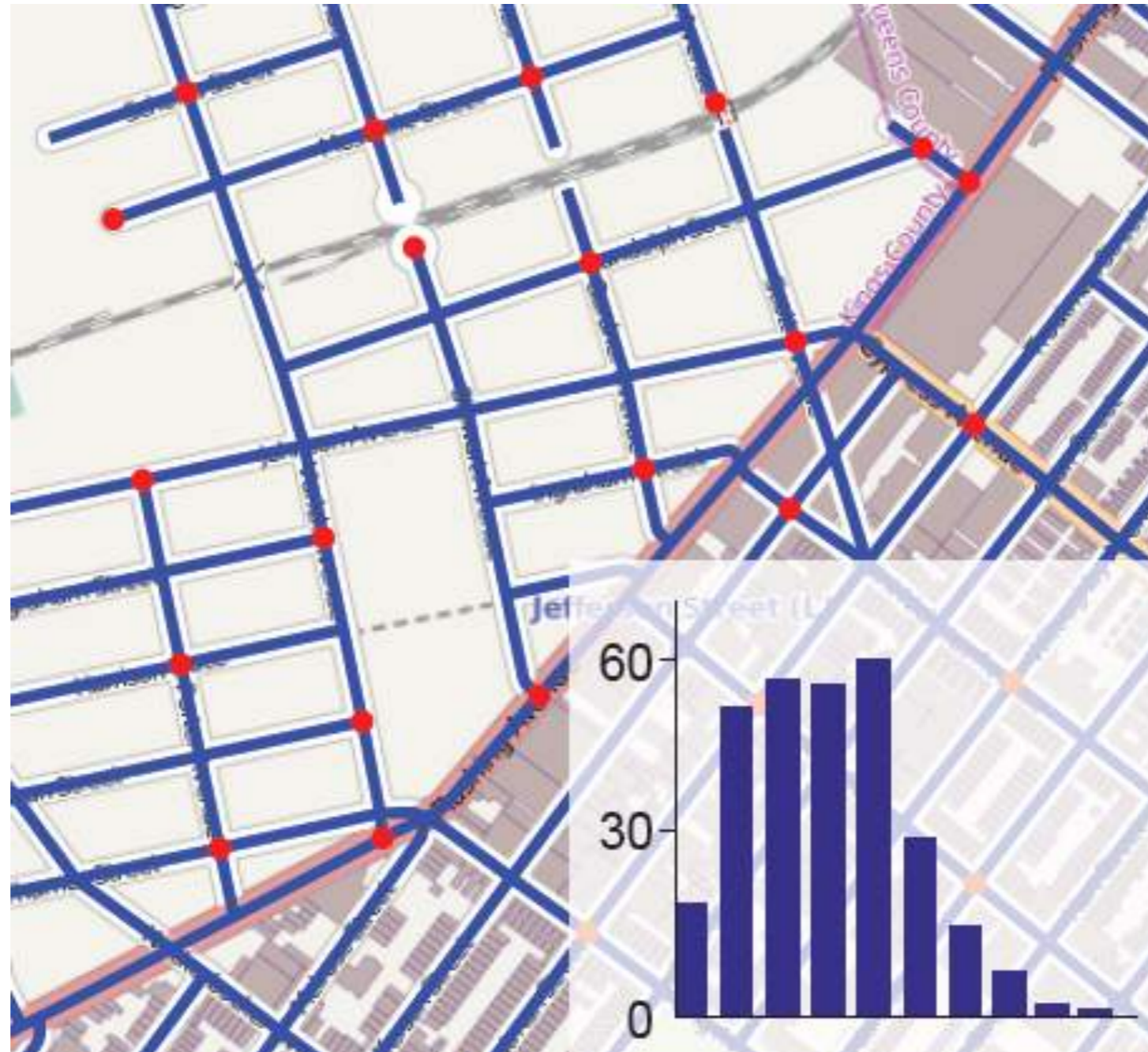
# Geometric Features

Metric reach (*think geodesic fan*)

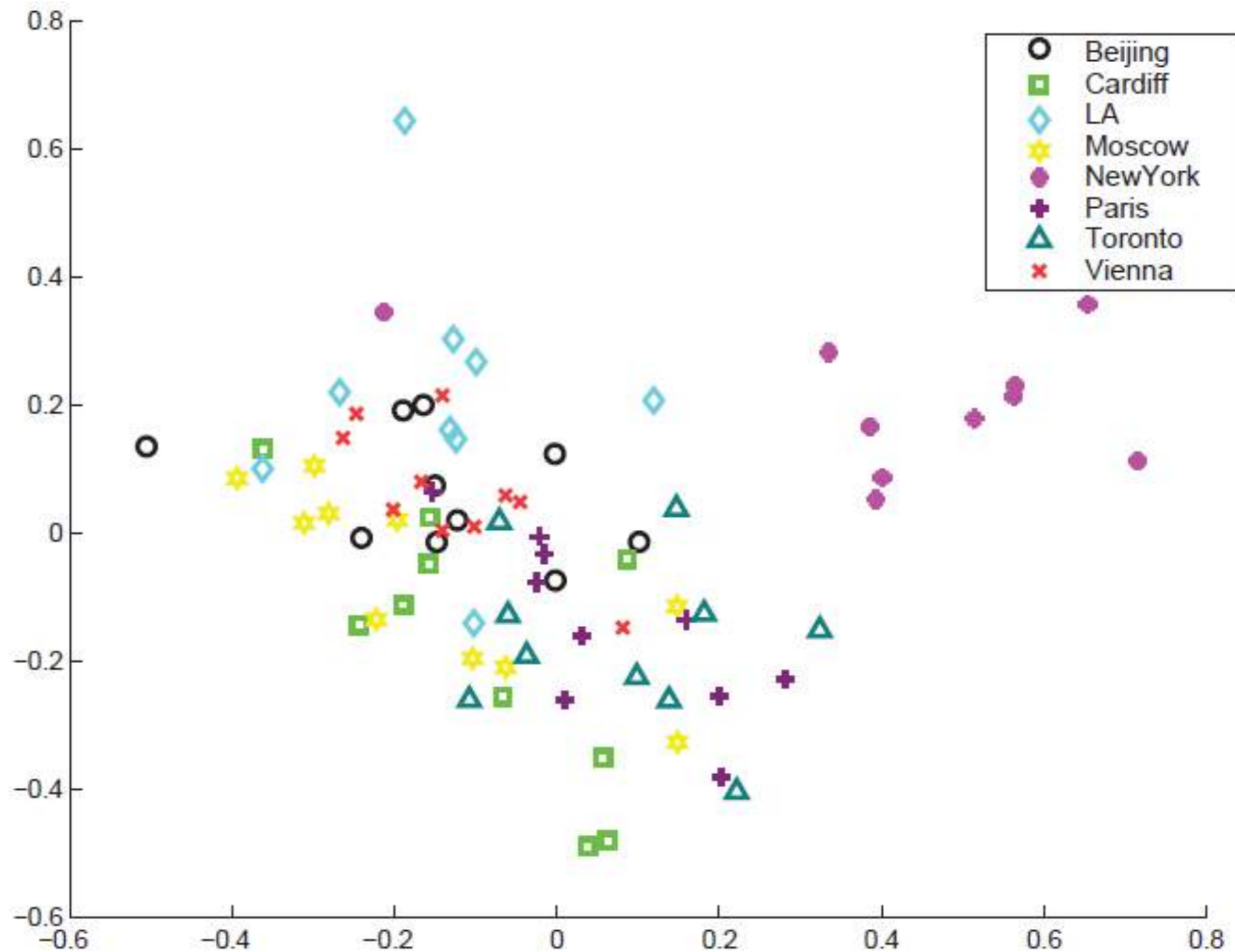


# Geometric Features

Travel distance histogram (*think shape distribution*)



# Bag of Features



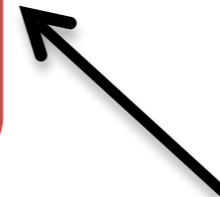
# Analysis and Classification



input map data



parsed OSM



# Good Features

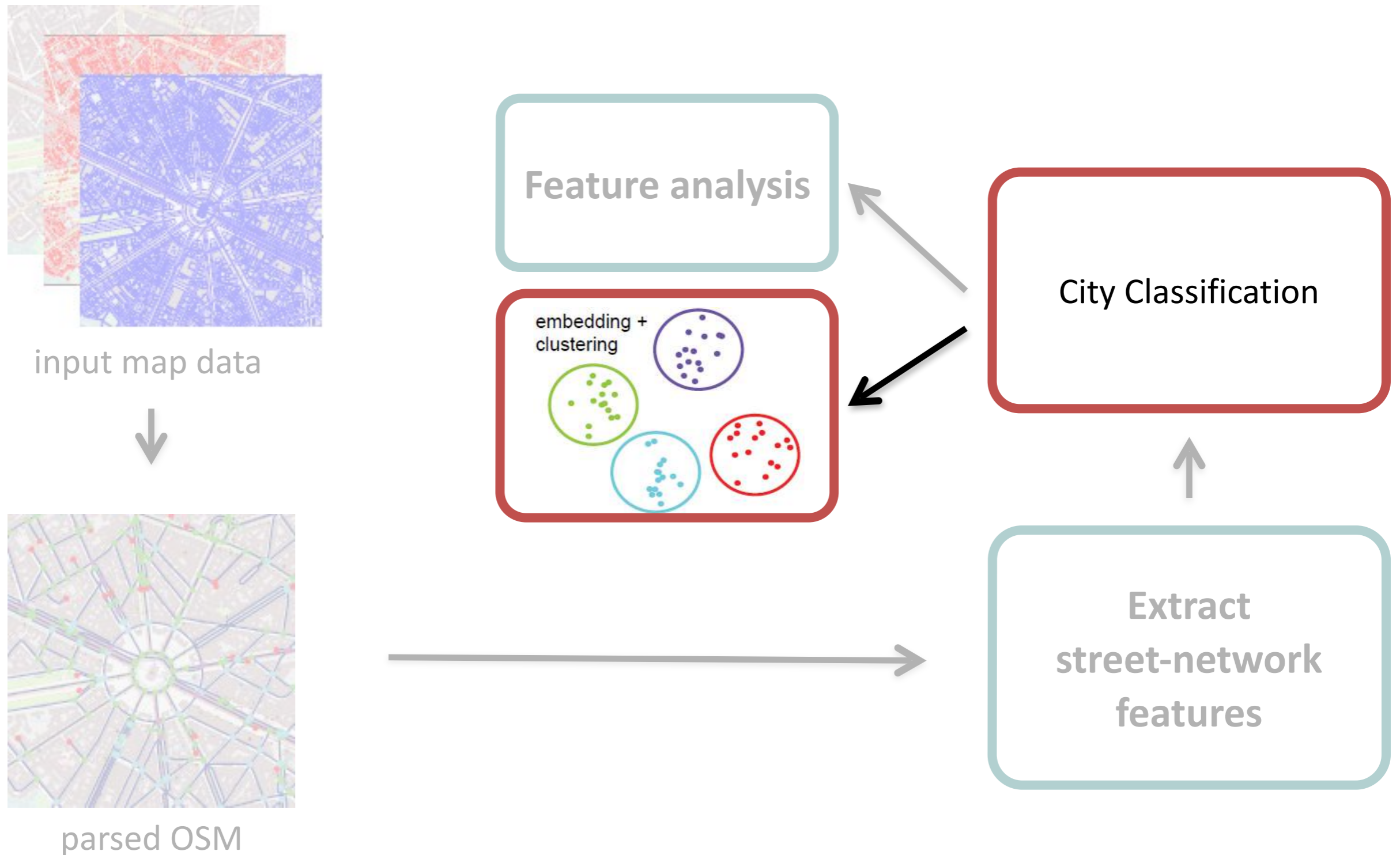
## Inter-city classification

- learn (using SVM) to learn relative weights for the descriptors

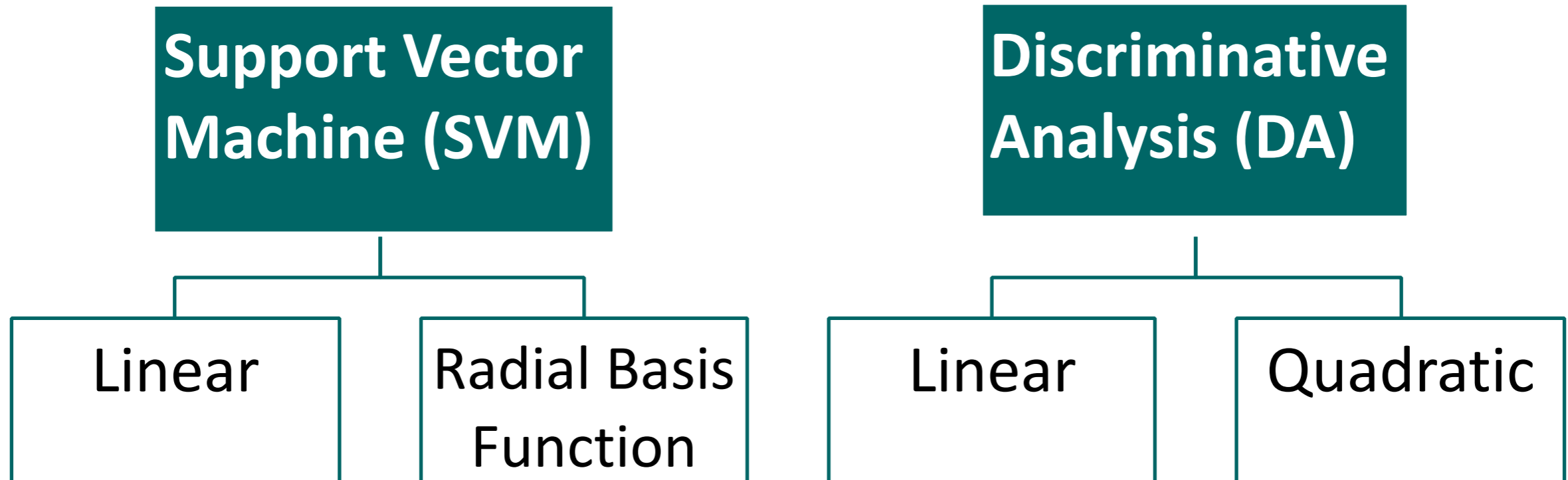
# Good Features

## Intra-city classification

# Classification



# City Classification



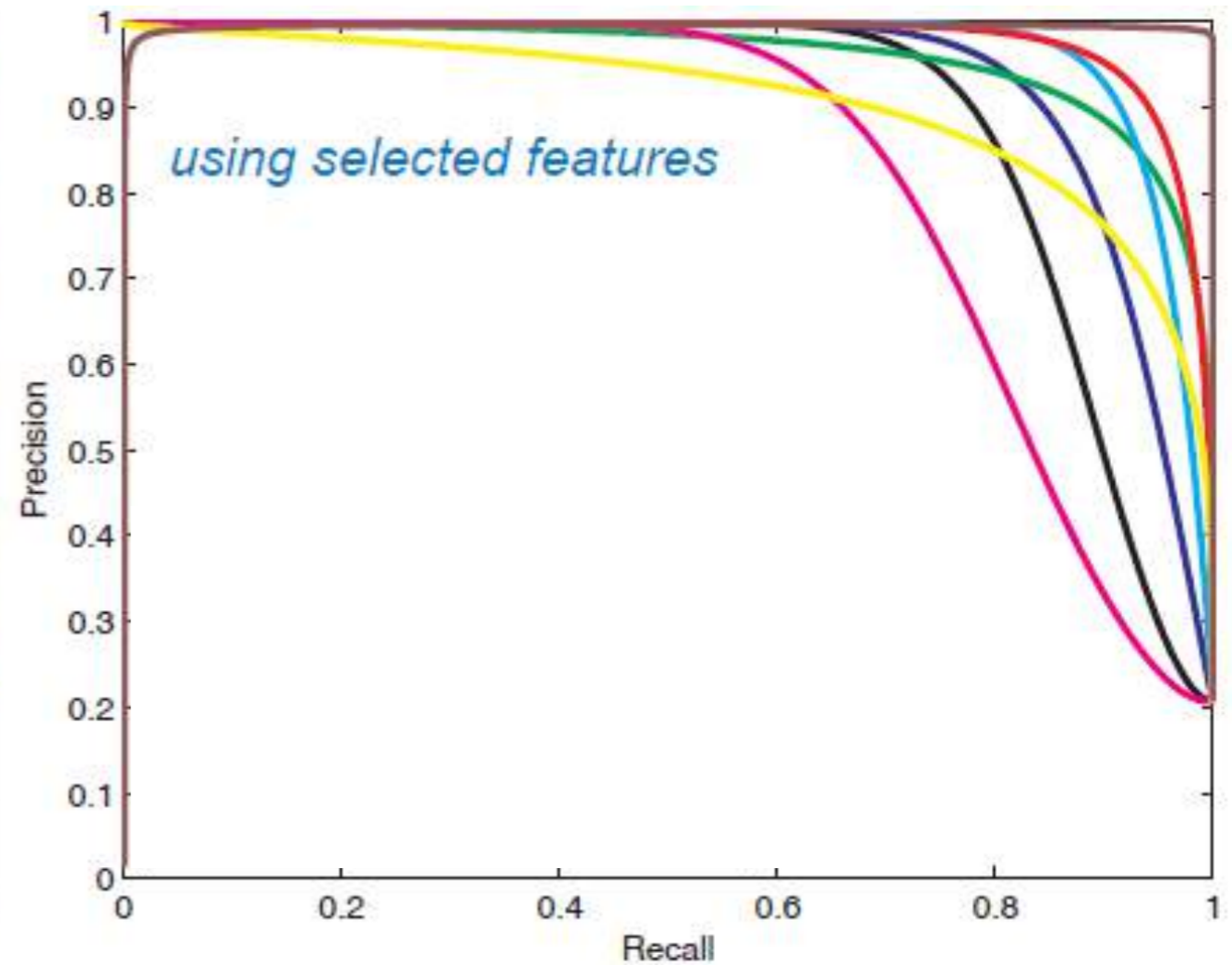
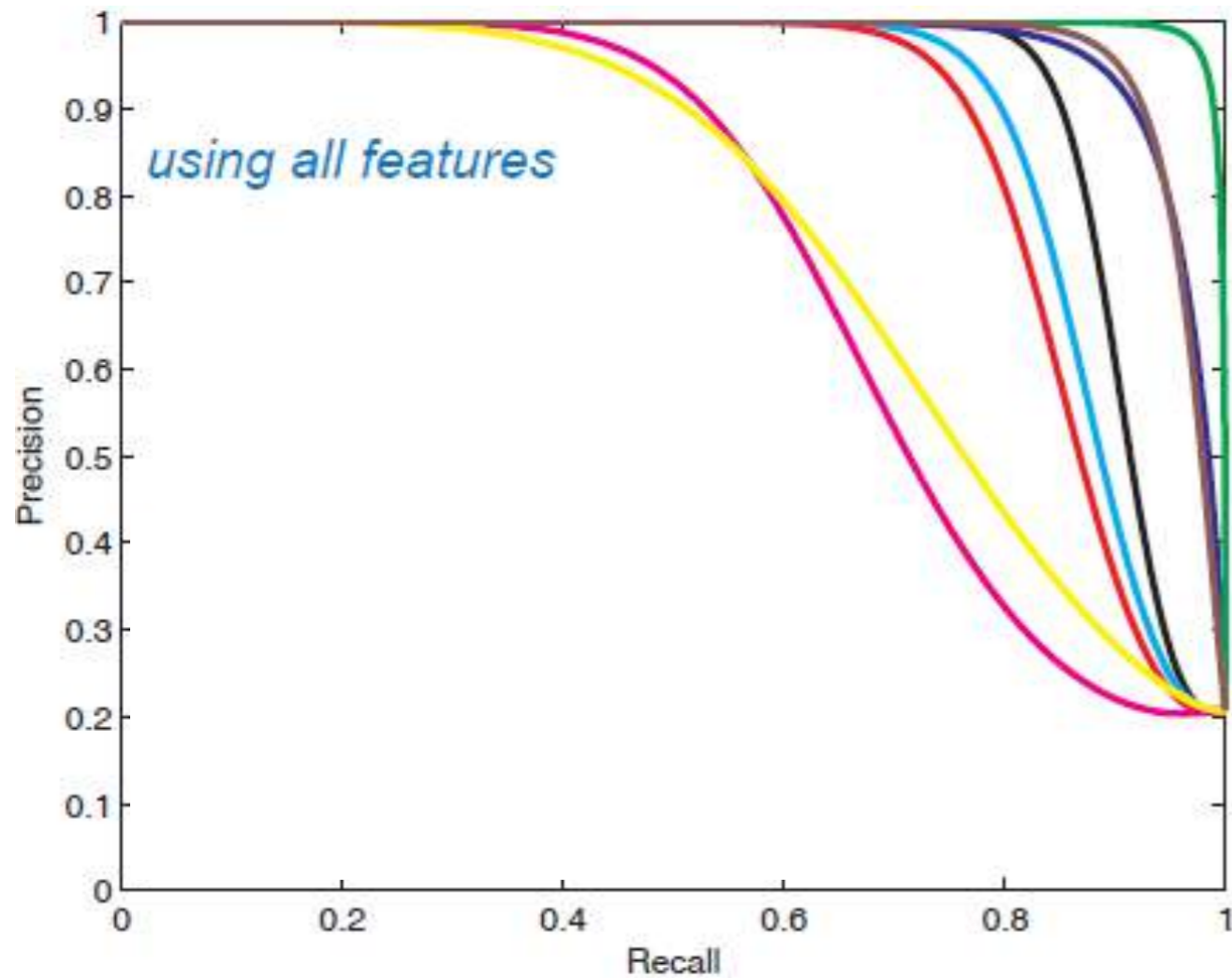


# Inter Classification

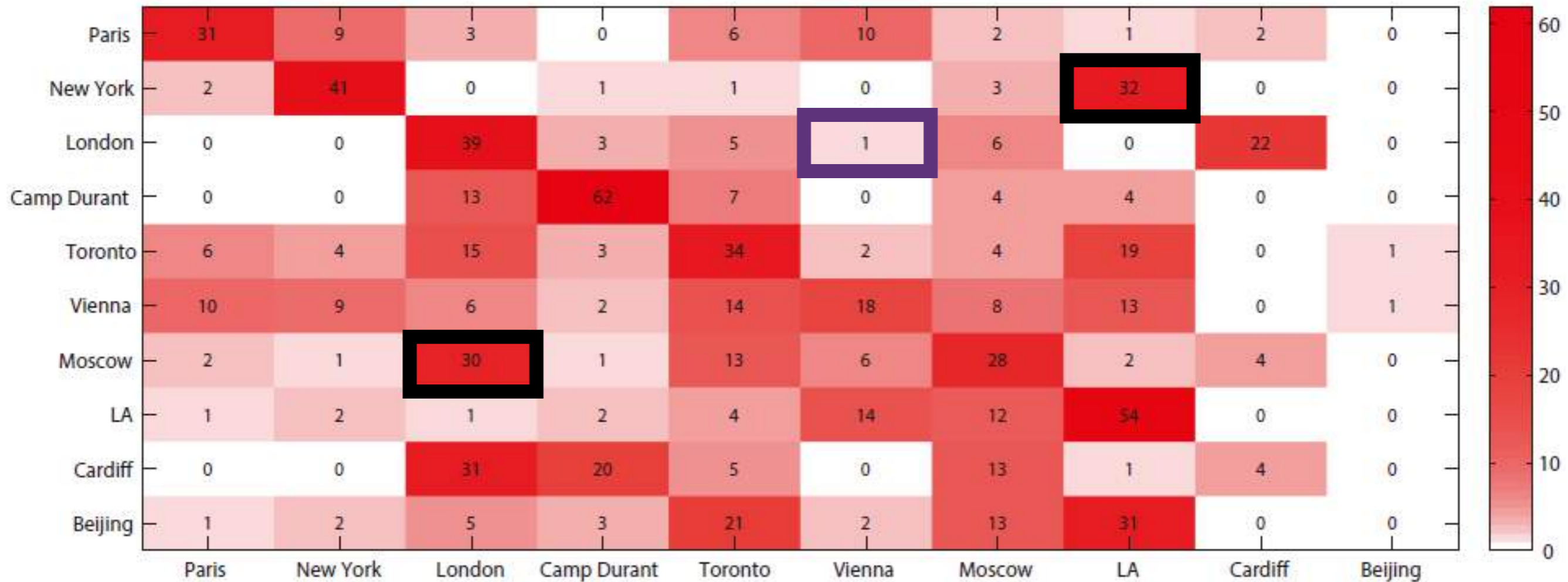
classification type	SVML	SVMR	LDA	QDA
multi-class	35.8	41.7	47.3	53.4
Beijing and others	90.2	90.6	88.7	76.0
Camp Durant and others	90.2	91.1	88.8	89.9
Cardiff and others	91.1	91.3	83.8	84.1
LA and others	88.8	89.0	82.0	83.0
London and others	90.8	91.2	86.6	88.4
Moscow and others	89.3	89.1	80.3	83.7
NY and others	93.6	94.7	90.7	90.5
Paris and others	92.9	93.2	87.2	89.4
Toronto and others	89.0	89.1	67.9	66.2
Vienna and others	90.0	90.0	74.6	74.0

# Precision-Recall

## Classification using all versus selected features



# Confusion Matrix



# What is a Good Scale?



$0.25\text{km}^2$



$1\text{km}^2$



$4\text{km}^2$

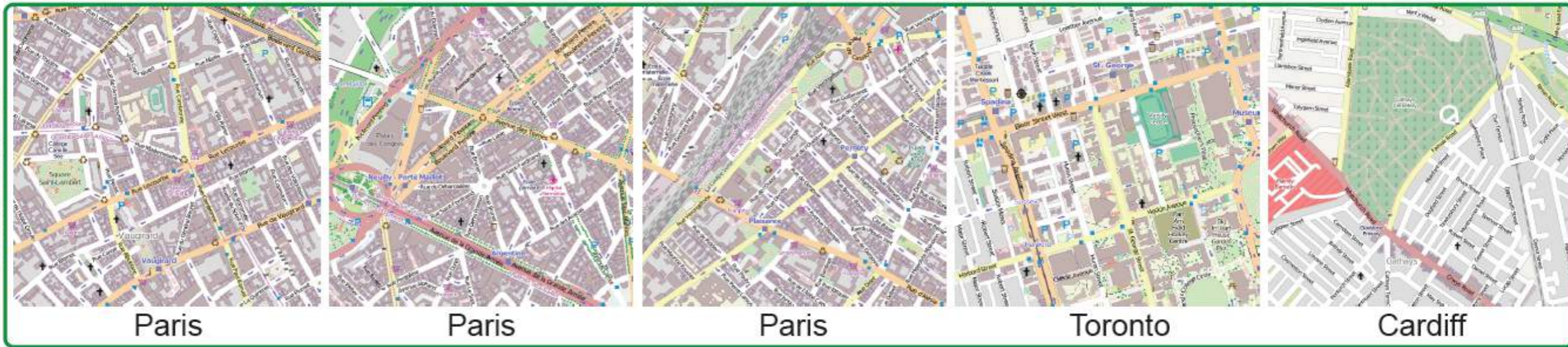
# Comparison with Image Features

# Comparison with Image Features

- GIST features
- 20-40% performance loss

# Applications

# City Retrieval

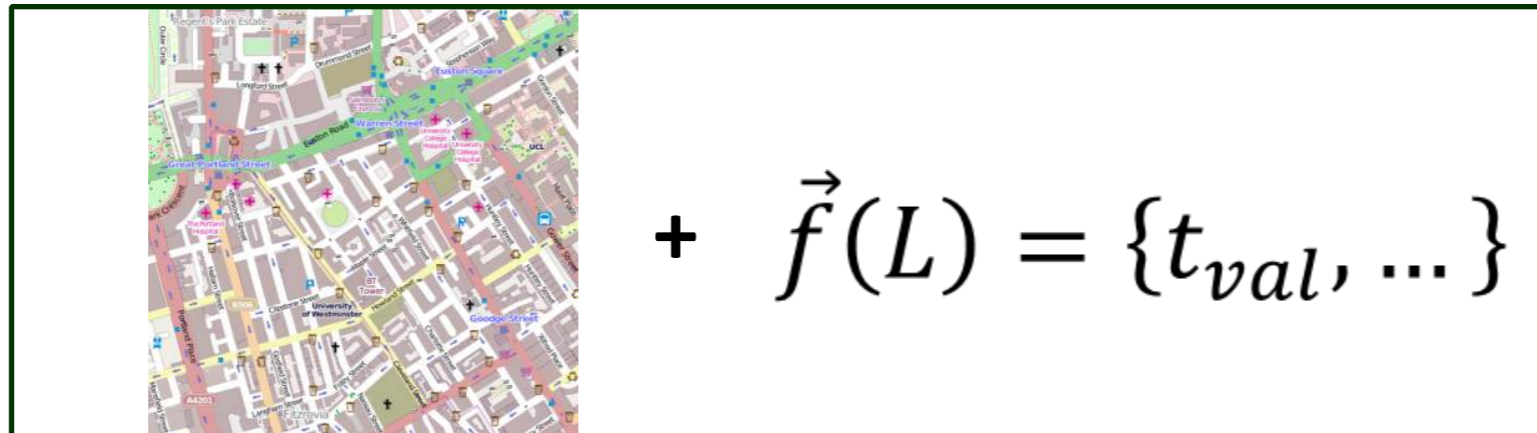




# City Retrieval



# Synthetic City Generation



target



input

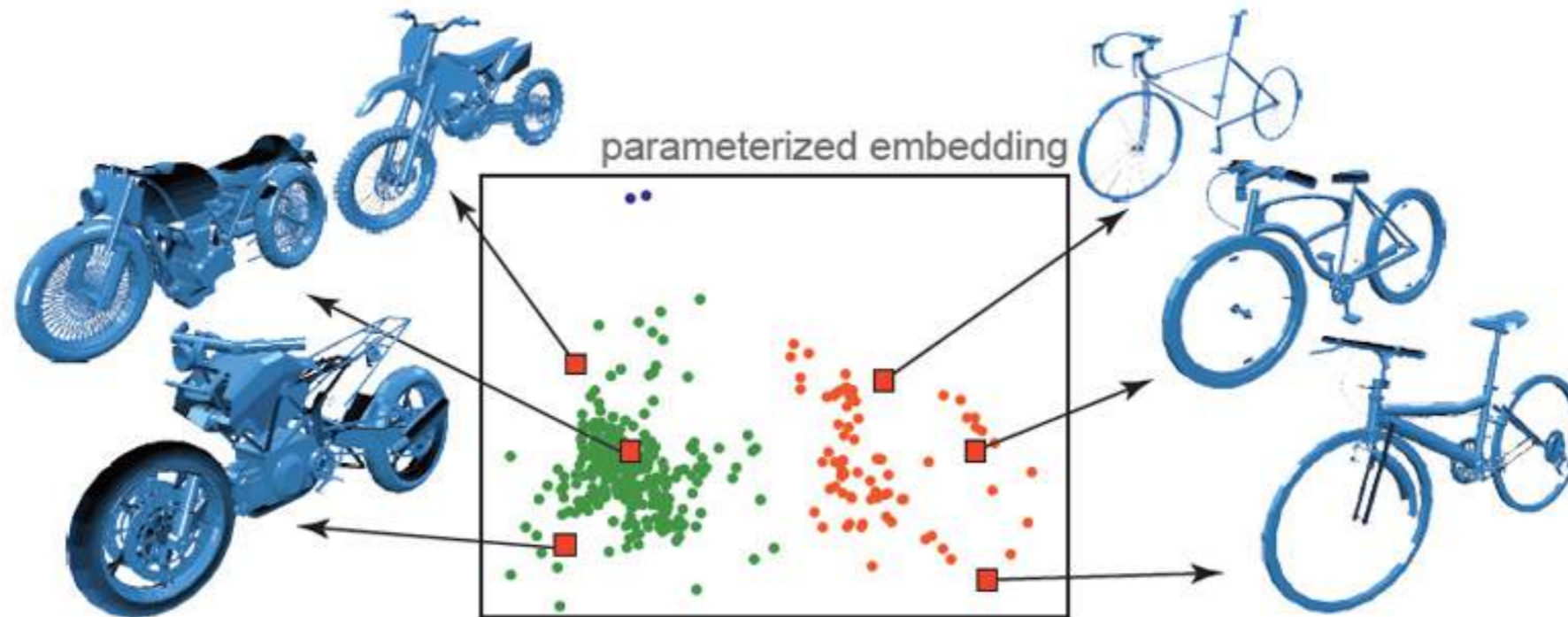


**Synthesis  
Algorithm**



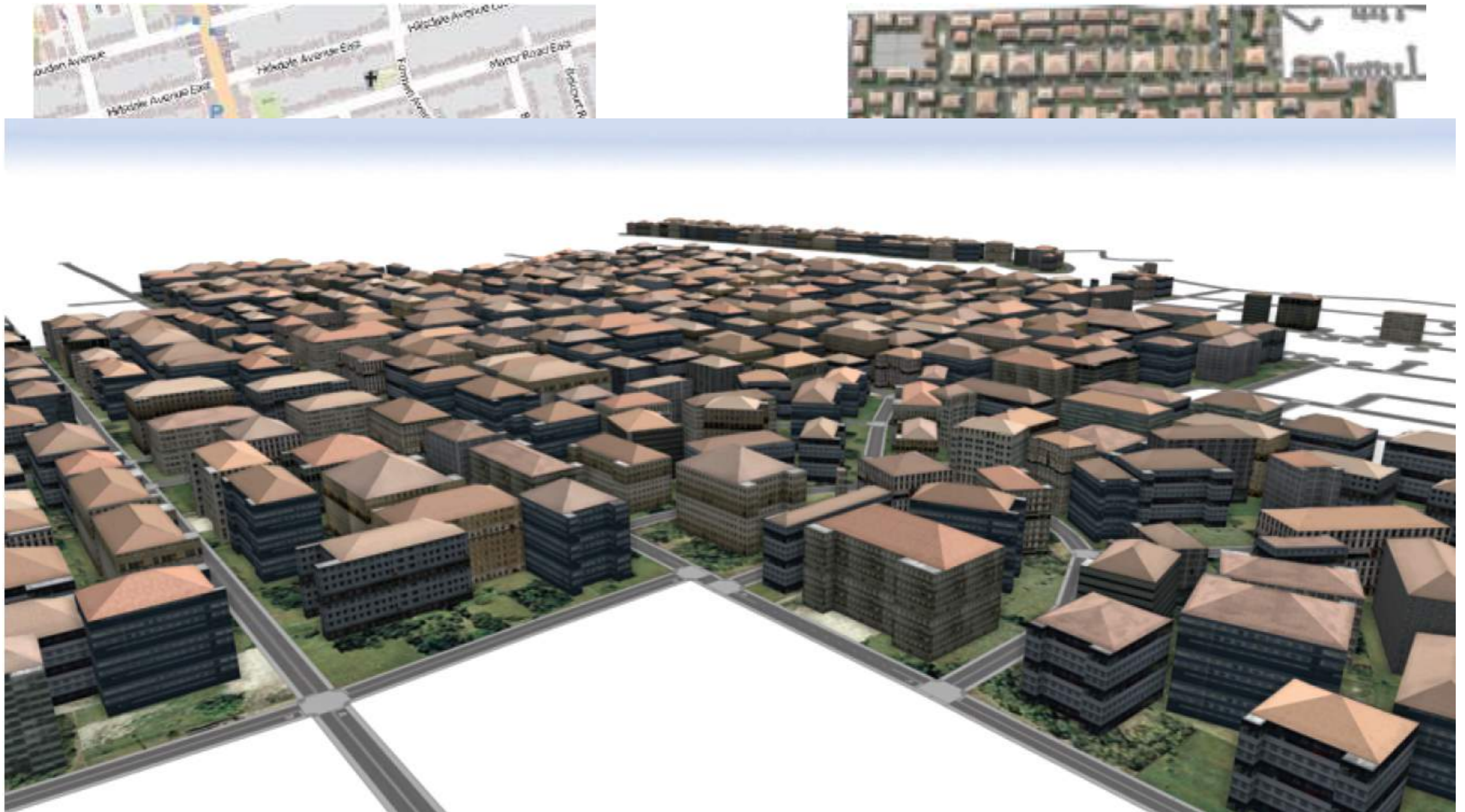
Synthesized  
layout

# Existing Algorithm?

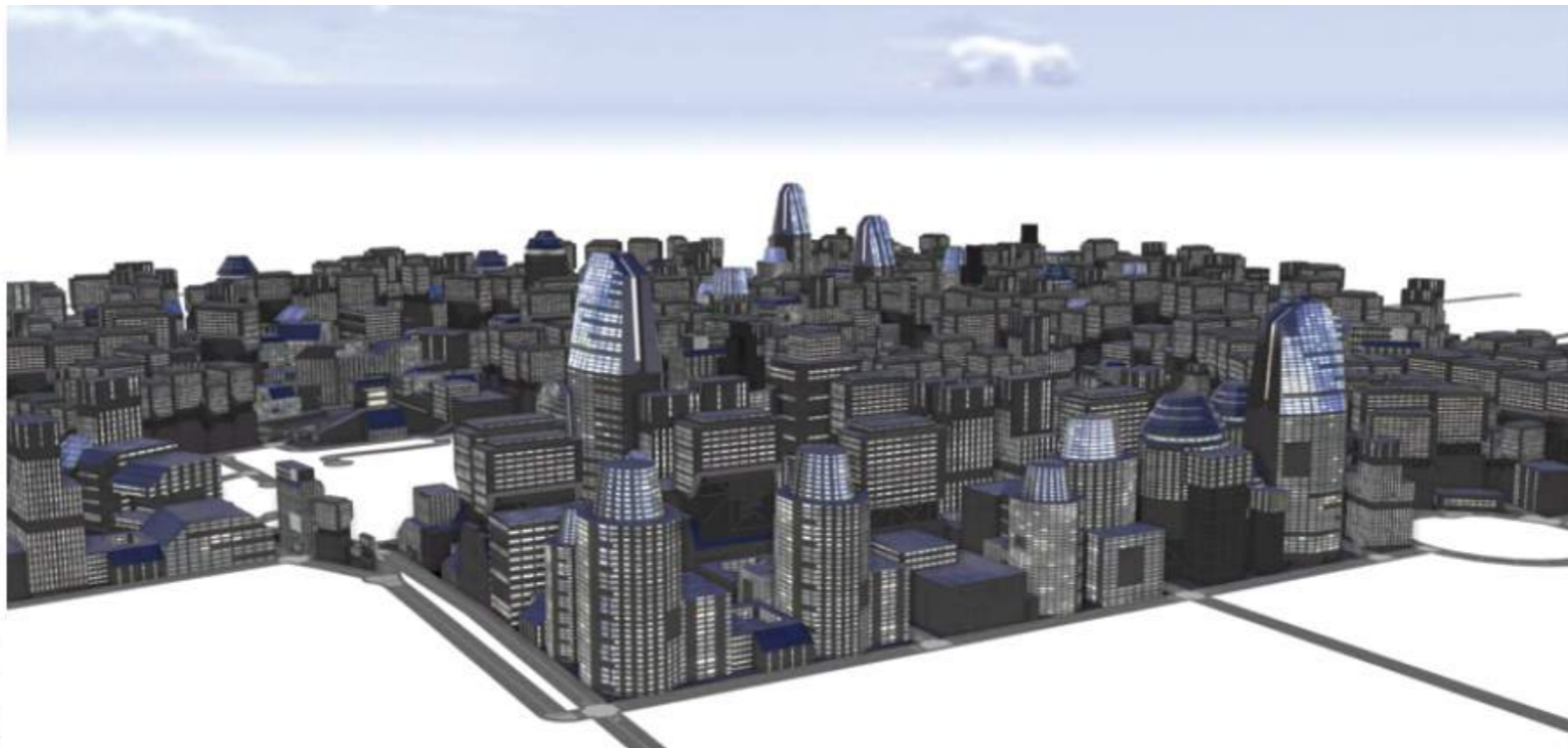


[Averkiou et al., Eurographics 2014]

# Synthetic City Generation



# Synthetic City Generation



# Limitations

- road width, car/population density
- speed restrictions
- one-way roads
- supervised method

# Conclusion

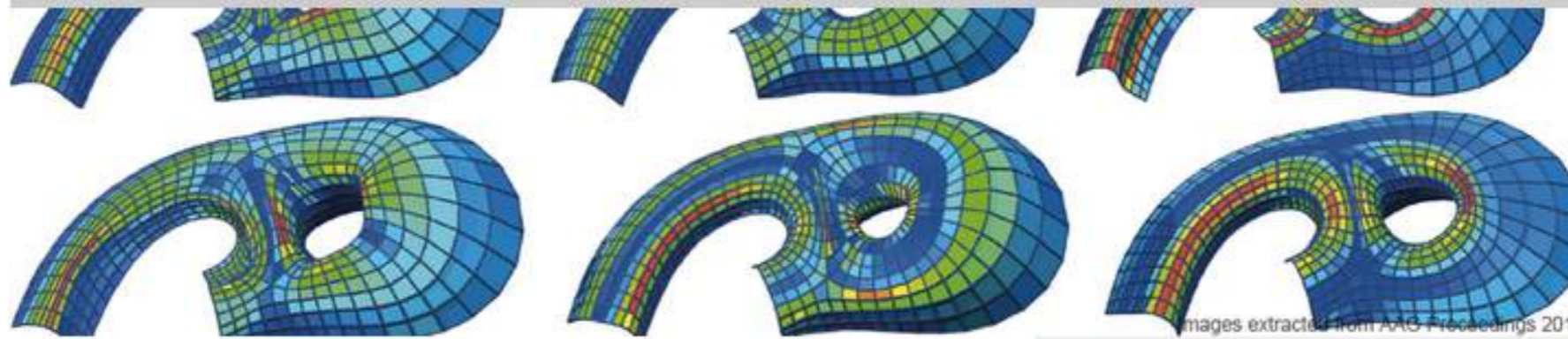
## Topological and geometric features

- local and statistical

## Classification (10 cities, 100 maps, 3 scales)

- *feature importance*: inter and intra city

## Applications



Images extracted from AAG Proceedings 2012

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**Advances in Architectural Geometry 2014**

Geometry lies at the core of the architectural design process. It is omnipresent, from the initial form-finding stages to the final construction. Modern geometric computing provides a variety of tools for the efficient design, analysis, and manufacturing of complex shapes. On the one hand this opens up new horizons for architecture. On the other hand, the architectural context also poses new problems to geometry. Around these problems the research area of architectural geometry has emerged. It is located at the common border of applied geometry and architecture.

Advances in Architectural Geometry / AAG is a symposium where both theoretical and practical work linked to new geometrical developments is presented. This symposium aims to gather the diverse components of the contemporary architectural tendency which push the building envelope towards free form and respond to the multiple current design challenges. It involves architects, engineers, mathematicians, software designers and contractors. We aim at connecting research from architectural and engineering practices, academia and industry. AAG has become a reference in the professional field and is supported by the direct participation of the most renowned architectural design and engineering offices along with academic institutions.

The current edition, the fourth, will be held in London from the 18th to 21st of September 2014.

Conference: September 18-19, 2014

Workshops: September 20-21, 2014

The event consists of two days of presentations of accepted papers, followed by two days of hands-on workshops, allowing participants, teachers, students and professionals to learn and experiment with new technologies and practices reflected in the themes tackled during the symposium.

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conference]

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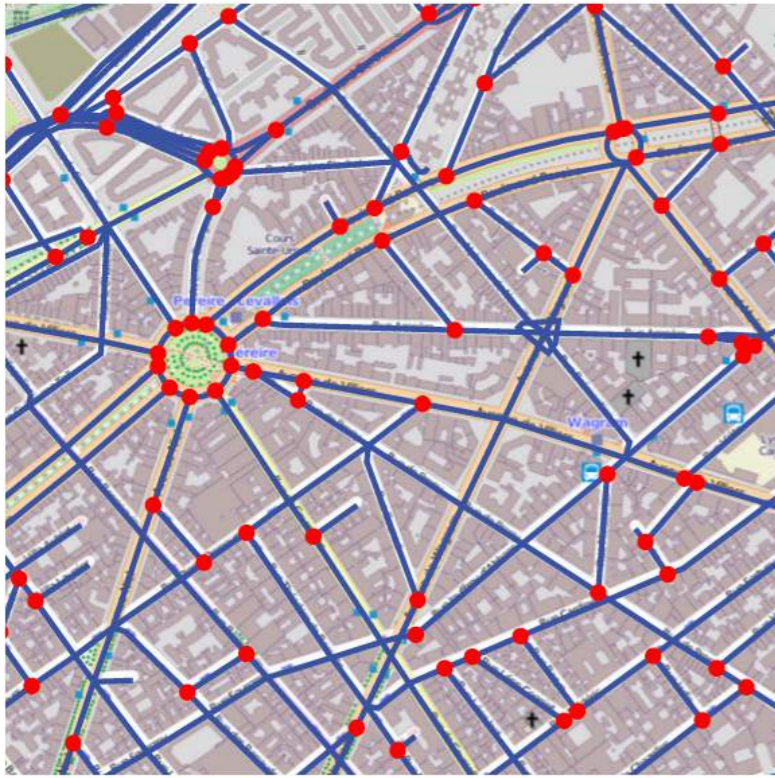


The series of conferences *Advances in Architectural Geometry* is coordinated by the association "FAG - Verein zur Förderung der angewandten Geometrie" registered in Vienna, Austria.

Early registration ends July 22



# Thank You



<http://geometry.cs.ucl.ac.uk/projects/2014/whatMakesLondon/>

(code + data available)

