



# **Cartography M.Sc.**

## **Thesis defense: Tourists vs. Locals Mapping Urban Traces from Social Media**

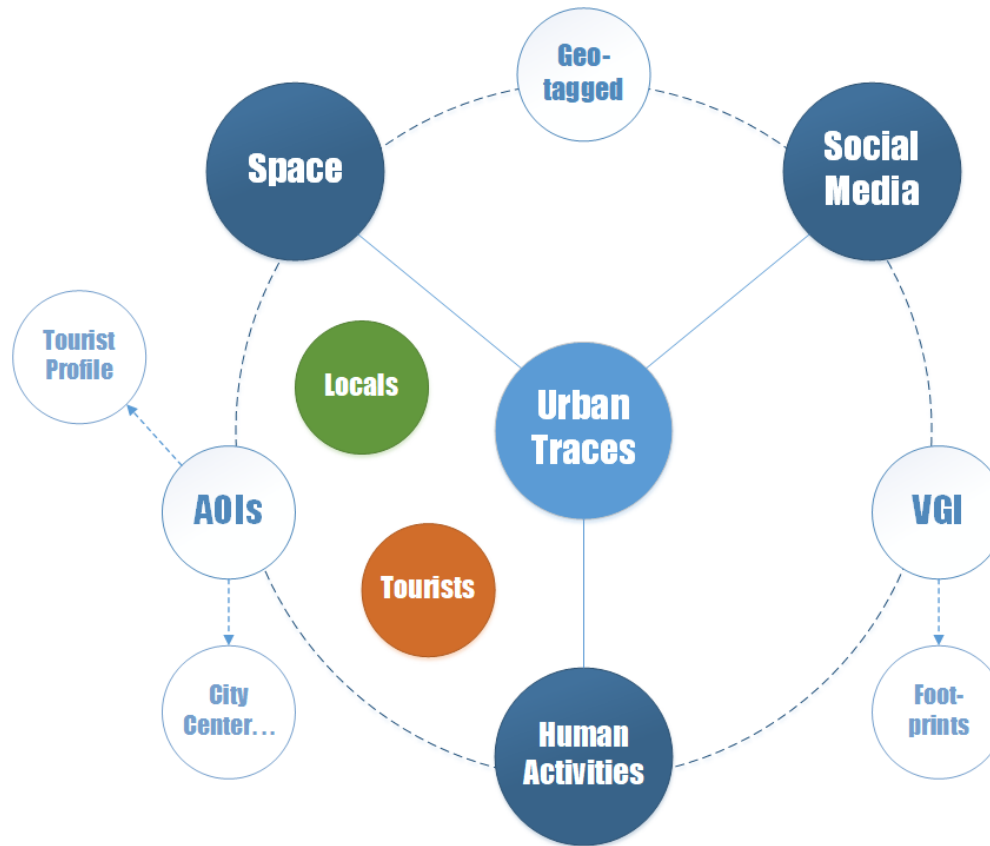
**Yingwen Deng**

# Outline

- 1. Introduction and motivations**
- 2. Research objectives and questions**
- 3. Related works**
- 4. Methodology**
- 5. Results and conclusions**
- 6. Limitations**



# 1. Introduction and motivation



## 2. Research Objectives and questions

### 2.1 Main objective:

To design an approach to differentiate the **urban traces** left by tourists from diverse origin countries and local citizens as **different** social media **user groups** based on the **volunteered geographic information(VGI)** obtained from a **social media platform**.



## 2.2 Sub-objectives and questions

**( a ) To map the urban traces of tourists and local citizens from social media presented by their distinctive footprints**

**Question:**

- **Are there differences in footprints between tourists from different origins and local citizens? Which are those differences?**

## 2.2 Sub-objectives and questions

( b ) To model the **city center** according to the **semantics** extracted from VGI of tourists and local citizens

### Question:

- How **differently** do tourists and local citizens perceive the city center?
- Is there a **relation** between the **footprints** and **perceived city center** among tourists and local citizens? Is this **relation clearer** among certain user groups?

## 2.2 Sub-objectives and questions

**( c ) To create a **tourist profile** categorized by the origin countries of tourists as well as the local citizens in respect of the diverse **thematic point of interests (POIs)****

### **Question:**

- **Can we identify a unique tourist profile regarding different thematic POIs for different user groups?**
- **Are there correlations between the **thematic POIs** in the diverse footprints and specific **origin countries**? Is there a **seasonal trend** among them?**

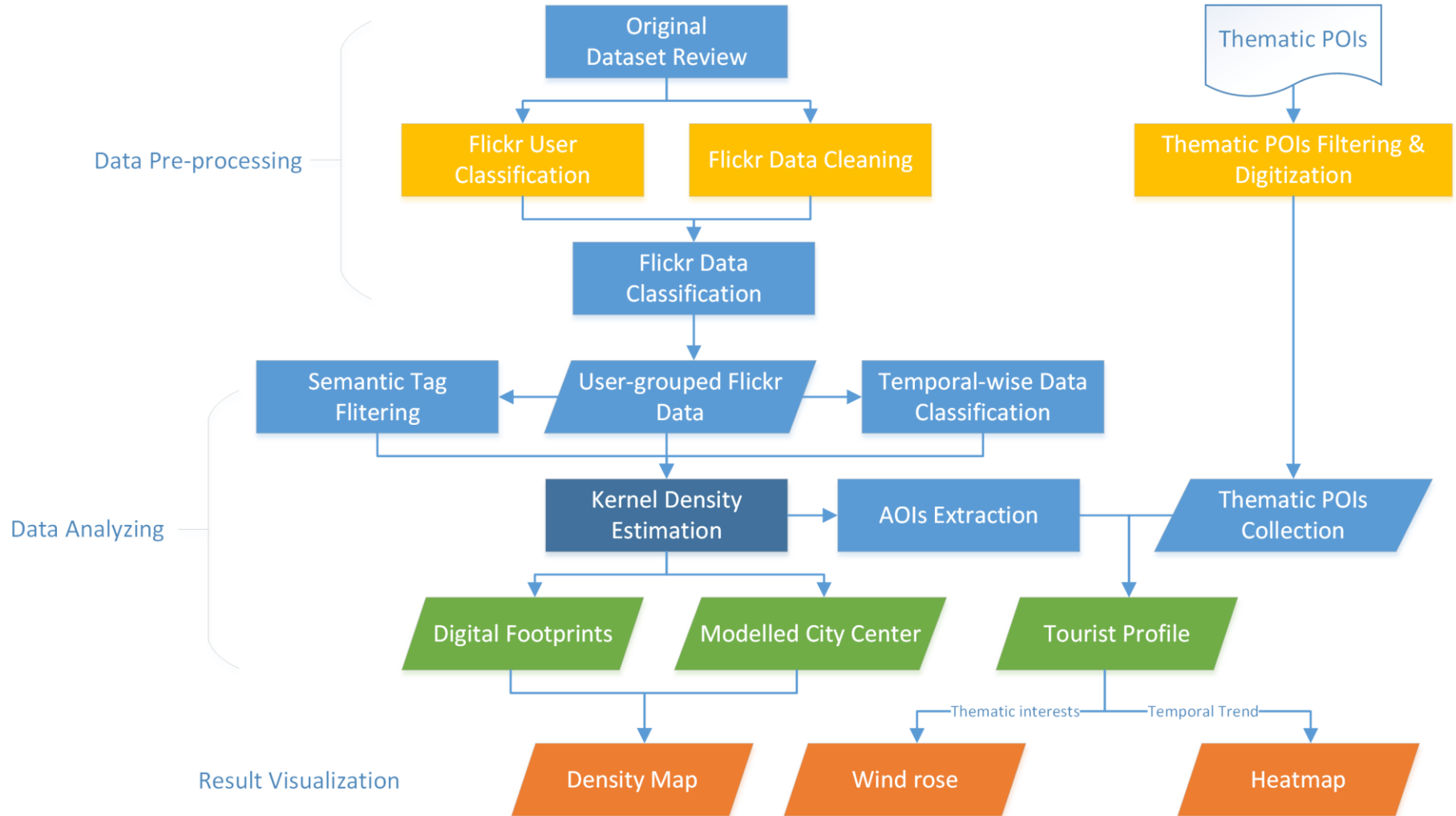
### 3 Related work

- Sun, Fan, Helbich, & Zipf, 2013 →  
Uncover spatial temporal patterns of **tourists' accommodation** in Vienna with Flickr data; **Kernel density estimations** and **spatial scan statistics** are used to explore the distribution of photos
- García-Palomares, Gutiérrez, & Mínguez, 2015; Girardin et al., 2008 →  
Identify the **tourists hotspots** and evaluate **their attractiveness** in the city with **VGI**
- Grothe & Schaab, 2009 → Apply **KDE** to generate **footprints** of Flickr data
- Salas-Olmedo, Moya-Gómez, García-Palomares, & Gutiérrez, 2018 →  
Analyze the digital footprints with density map

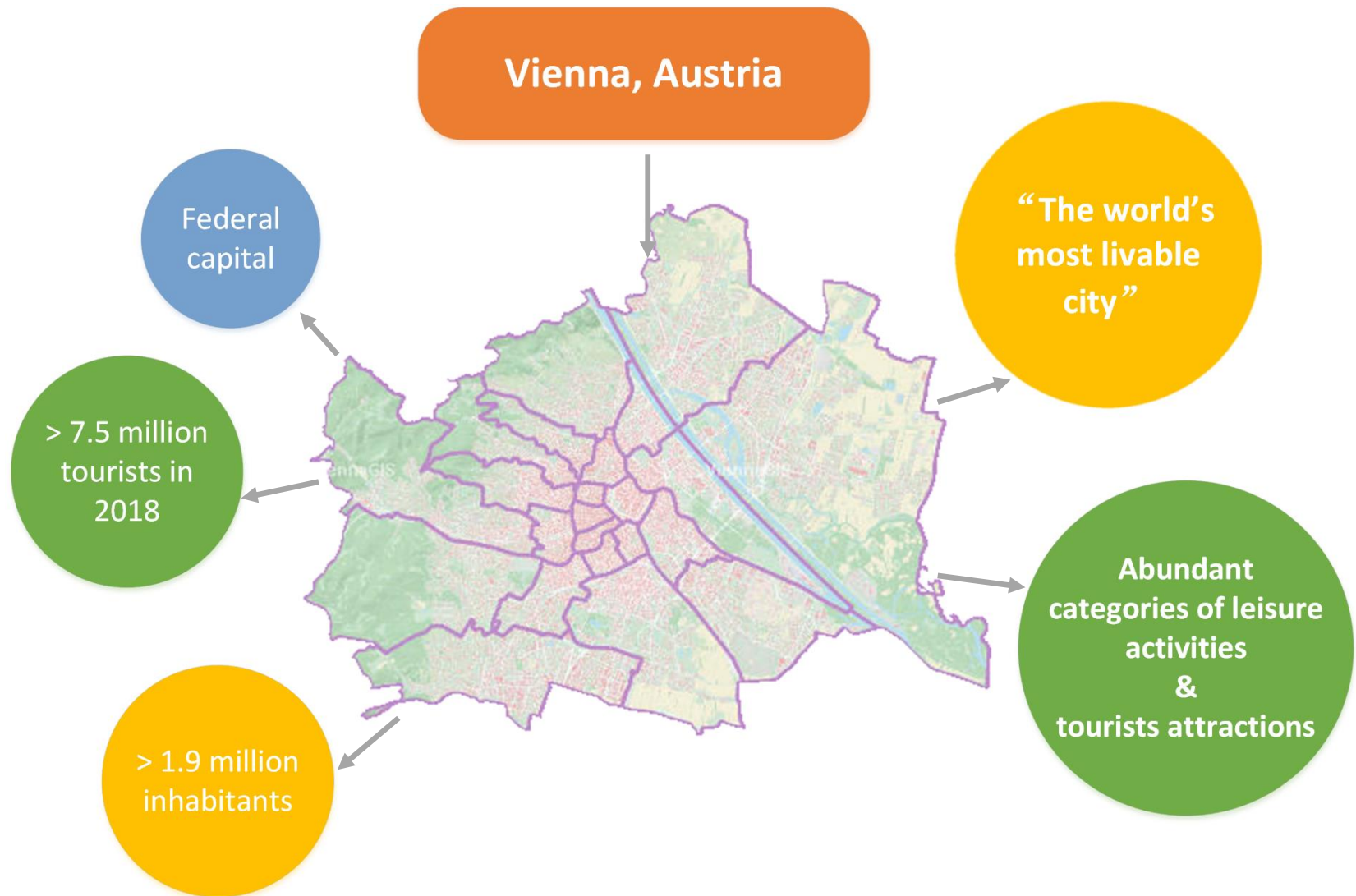


# 4 Methodology

## 4.1 Approach overview



## 4.2 Study Area



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## 4.3 Data review

### 4.3.1 Flickr Data

Column Name	
Pictures	123 photo_id
	ABC photo_owner
	ABC title
	🕒 date_taken
	ABC tags
	123 views
	📍 point
Flickr Users	ABC profile_locat
	ABC profile_processed
	ABC country_classif

**CRS:** EPSG 4326

**Data amount:** 479,126 photos

**Amount of users:** 13,187 users

**Number of origins:** 117 countries/origins

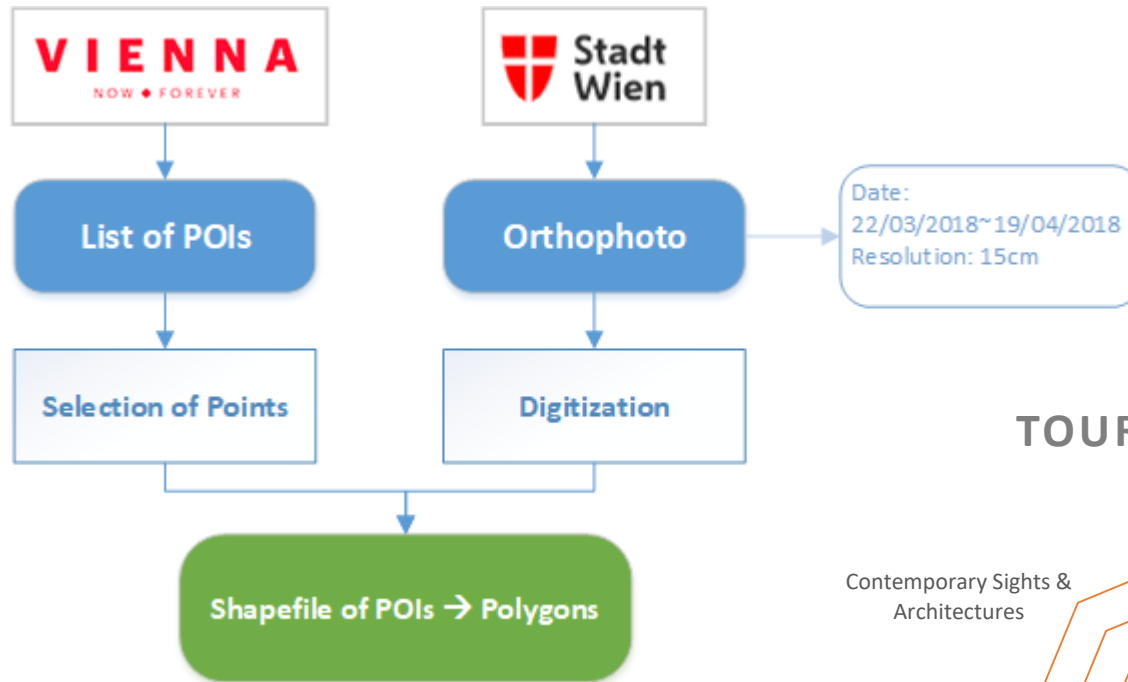
**Duration:** 2002-01-02 ~ 2018-12-05

**Study user group:**

**All tourists/Locals/Domestic tourists/GER/UK/US/IT**

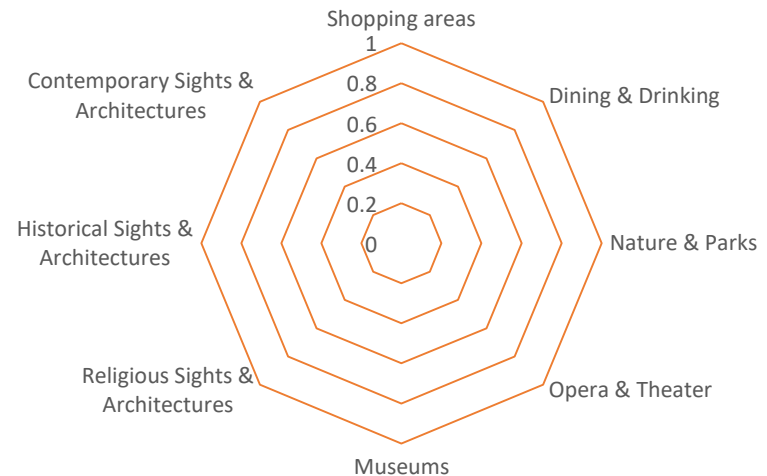
For each photo owner

## 4.3.2 External Resources → Thematic POIs



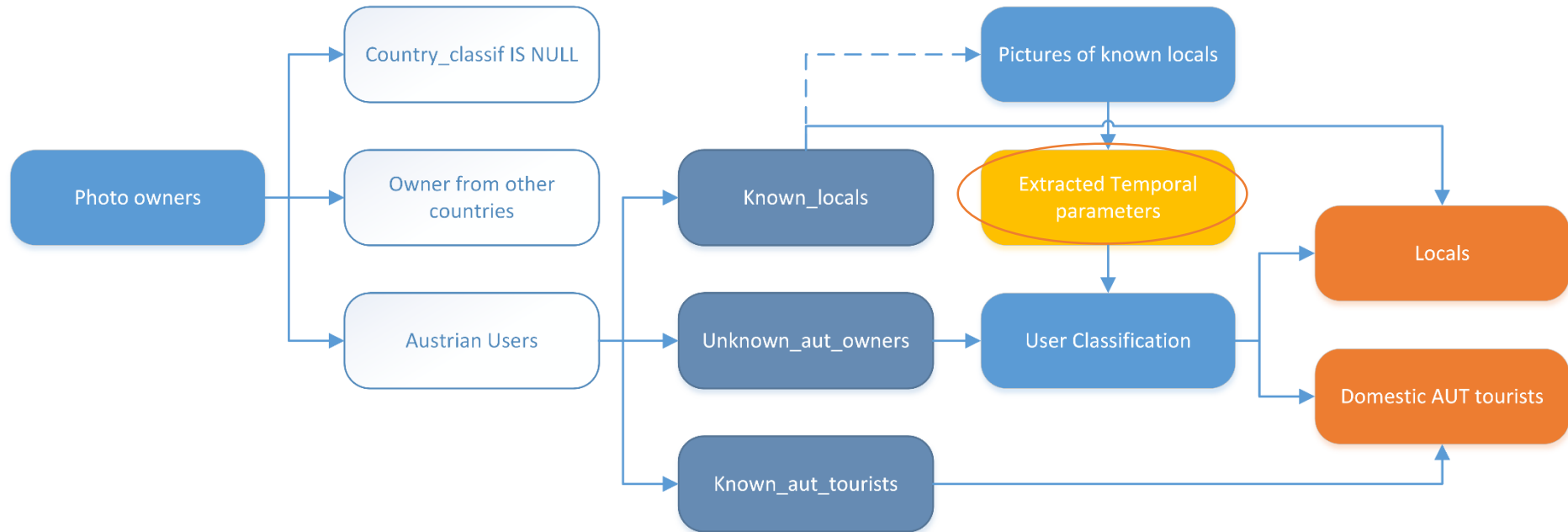
Total: 64 POIs

### TOURIST PROFILE



## 4.4 Data Pre-processing

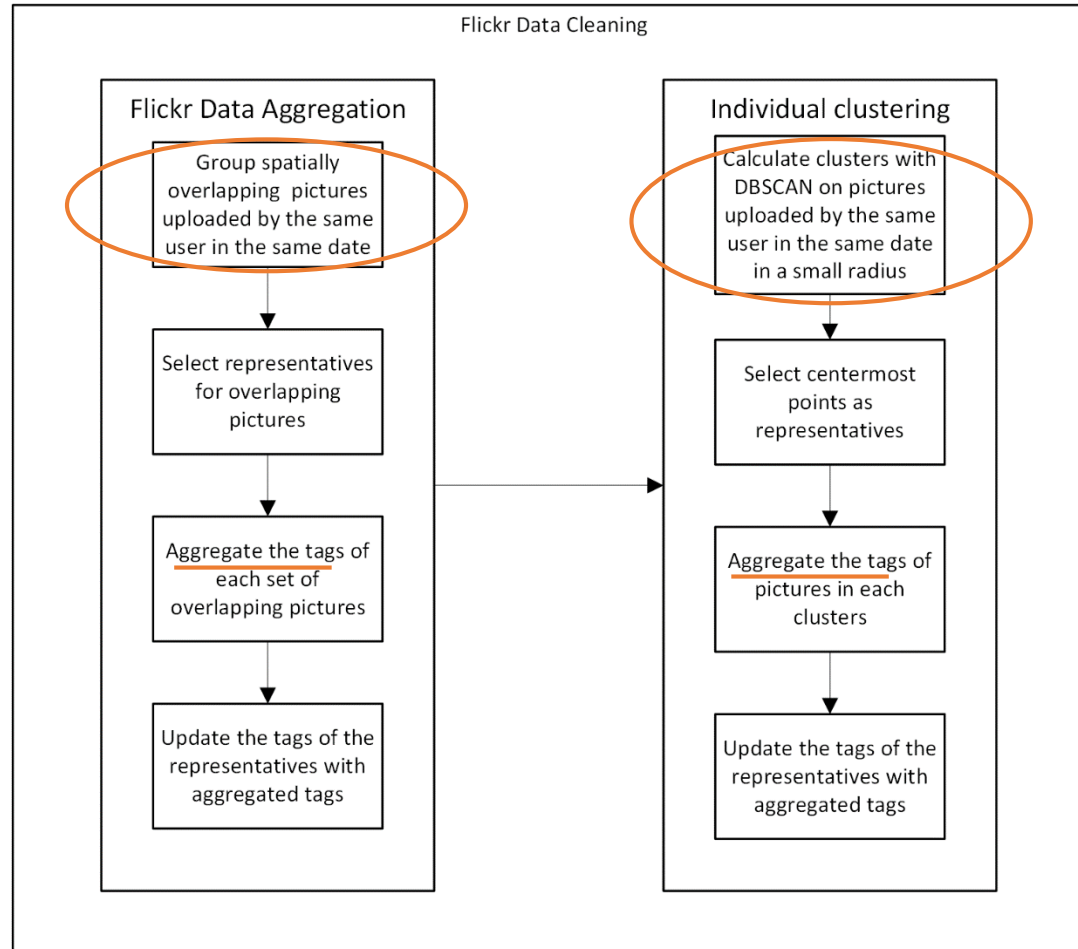
### 4.4.1 Flickr User Classification



	Avg(Avg_duration)	AVG(Interval_max)	Avg(Avg_visit time)
KNOWN_AUT from data	>1026 days	<598days	>46 days

→ Added 36 locals/ 1203 domestic tourists

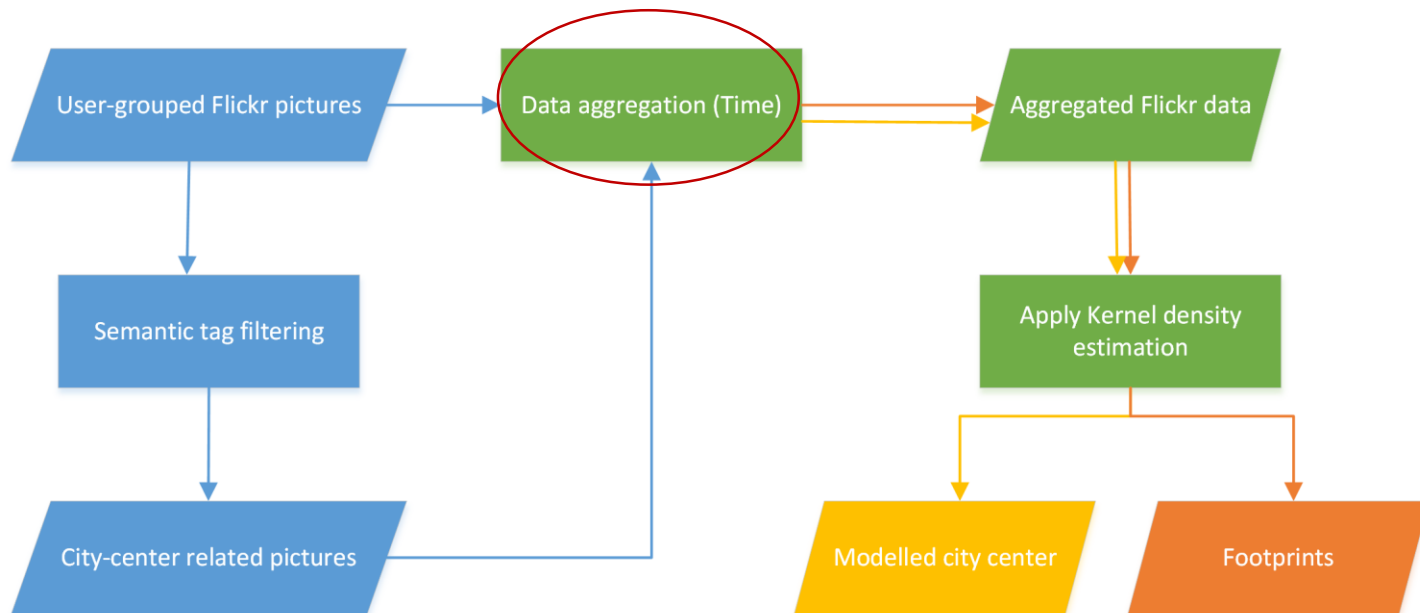
## 4.4.2 Flickr Data Cleaning



*After experiments, parameters for DBSCAN: Epsilon = 30 meters  
MinPts = 1*

## 4.5 Data Analyzing

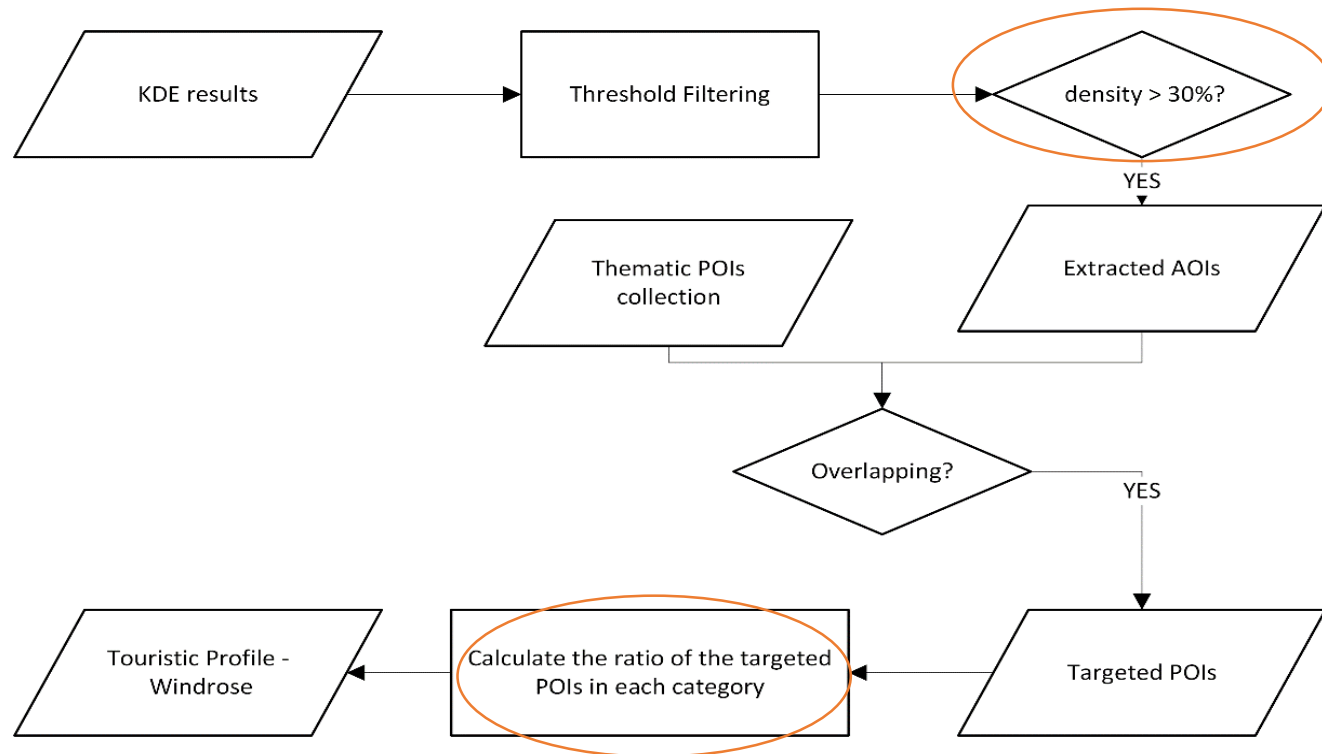
### 4.5.1 Approach to obtain footprints and modelled city center



## 4.5 Data Analyzing

### 4.5.2 Approach to obtain tourist profile

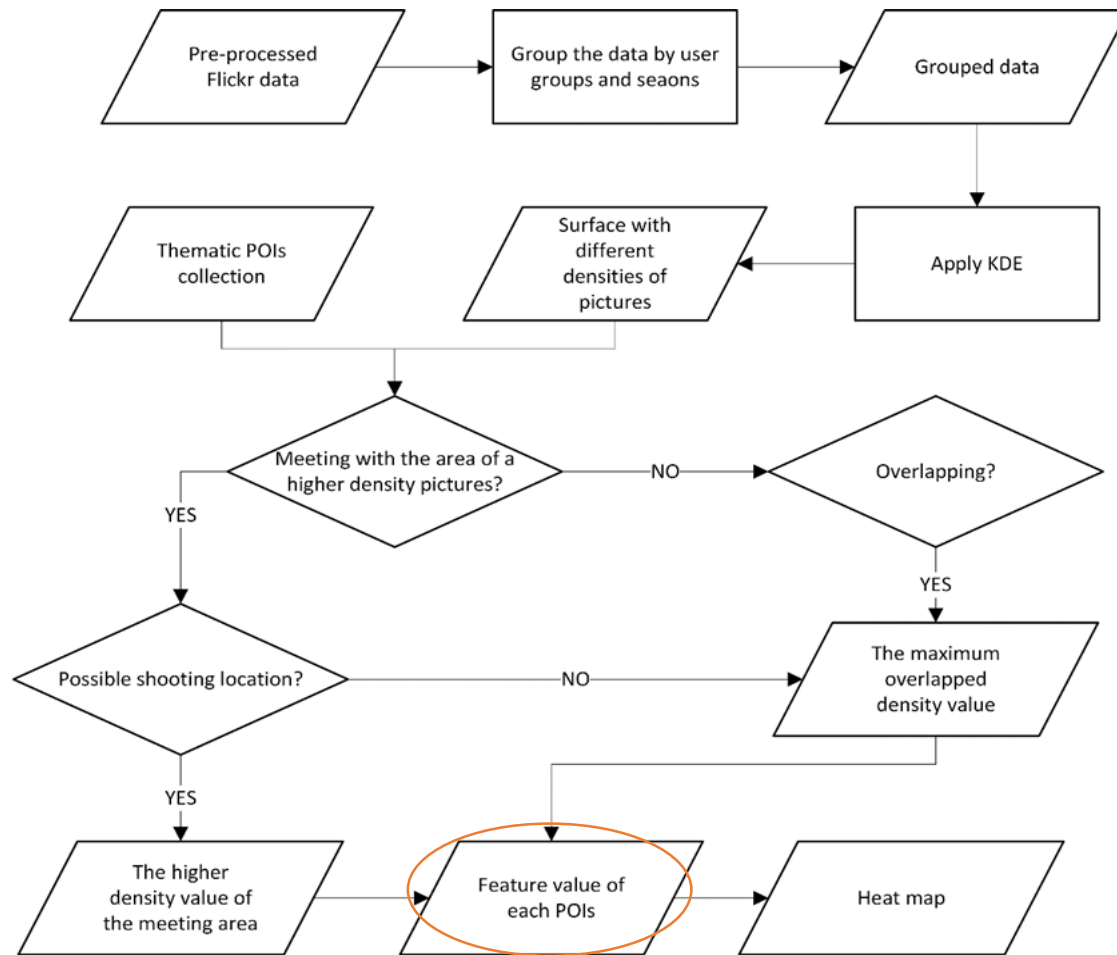
#### Thematic interests - Wind rose





## 4.5.2 Approach to obtain tourist profile

Temporal trend -- Seasonal trend -- Heat map



# 5 Results and Conclusions

## 5.1 Footprints

**Sub-objective a: To map the urban traces of tourists and local citizens from social media presented by their distinctive footprints**

**Research question:**

**Are there differences in footprints between tourists from different origins and local citizens? Which are those differences?**

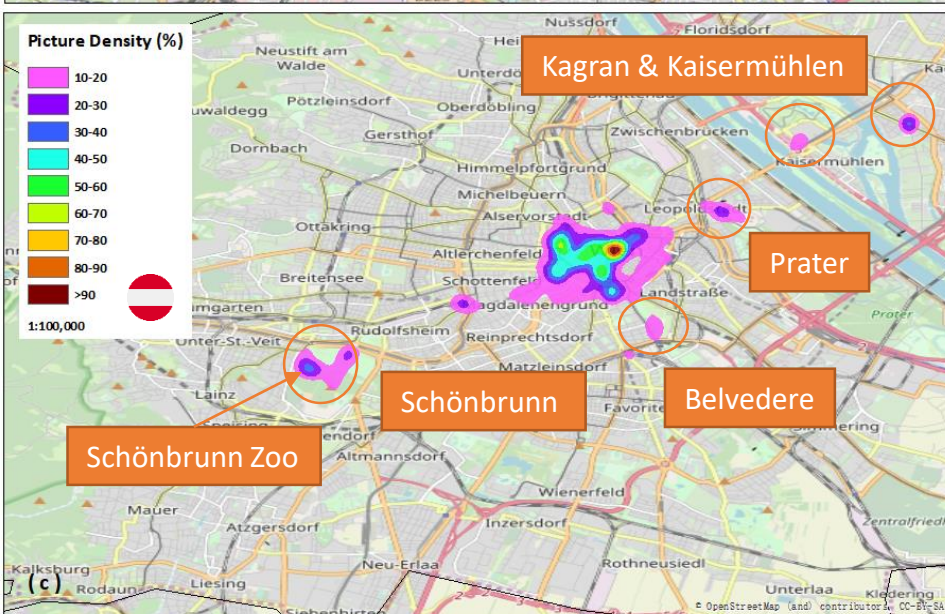
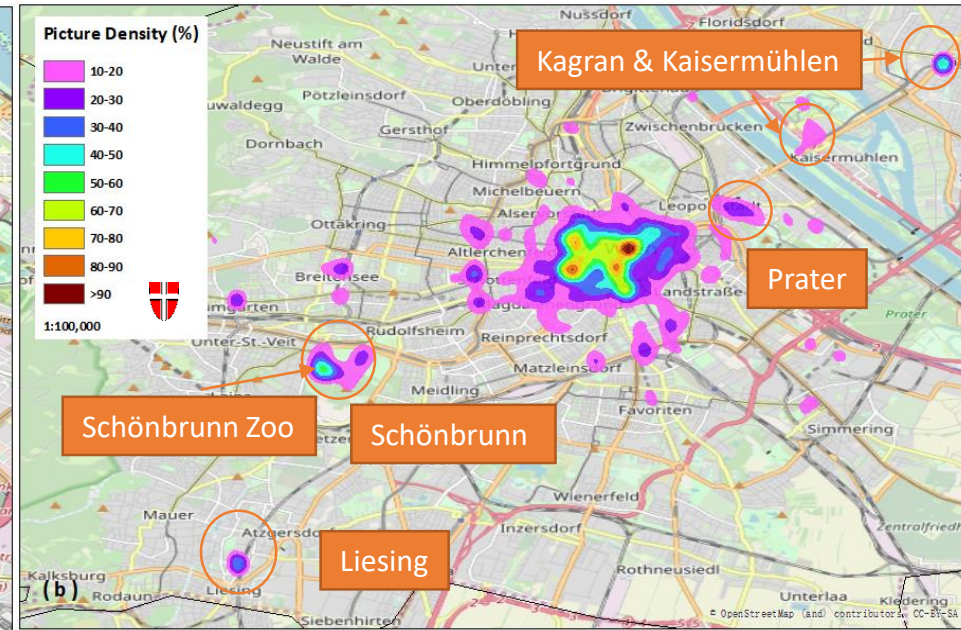
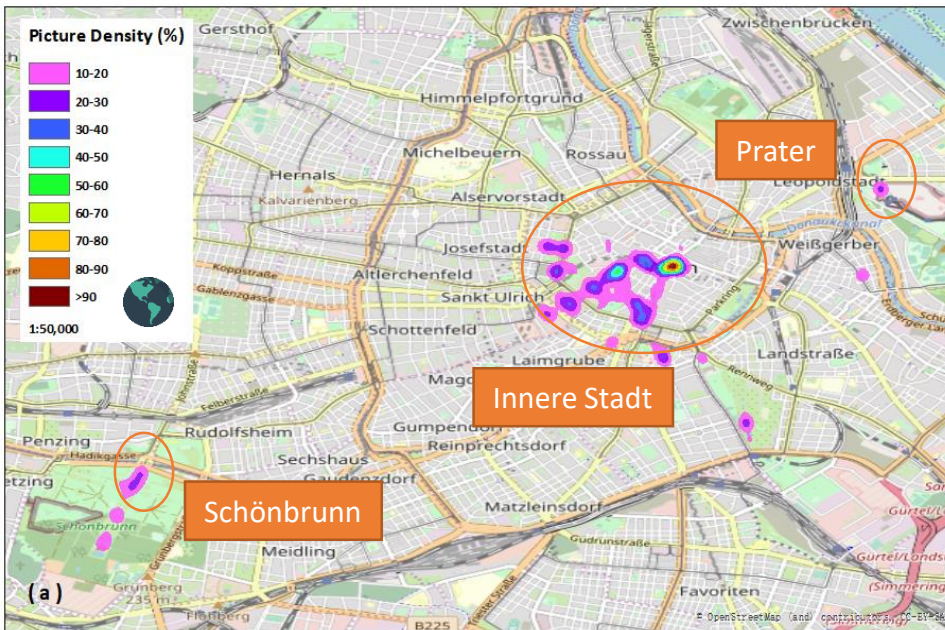
**As it will be shown in the following footprints results, distinctive footprints are generated for each user group. Despite the similarity in patterns, there are certainly differences among these footprints.**



# 5 Results and Conclusions

## 5.1 Footprints

Footprints of different user groups: (a) All tourists (b) Locals (c) Domestic tourists



Similar overall pattern: Pictures concentrated in the southwest part of Innere Stadt, Schönbrunn, Belvedere, and the northwest corner of Prater.

**Locals:** More dispersed; Relatively higher density of pictures; Picture highly concentrated area expanded

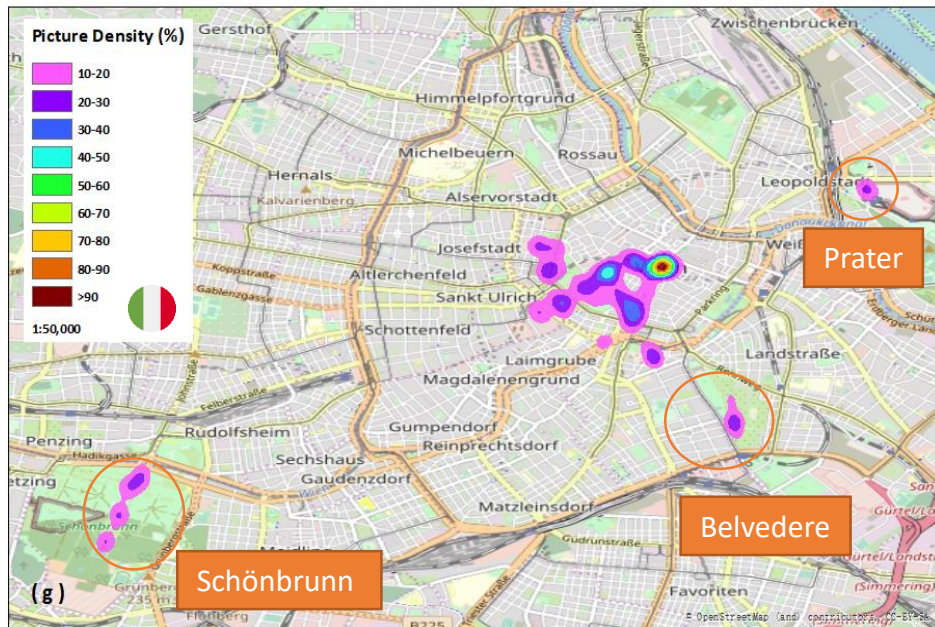
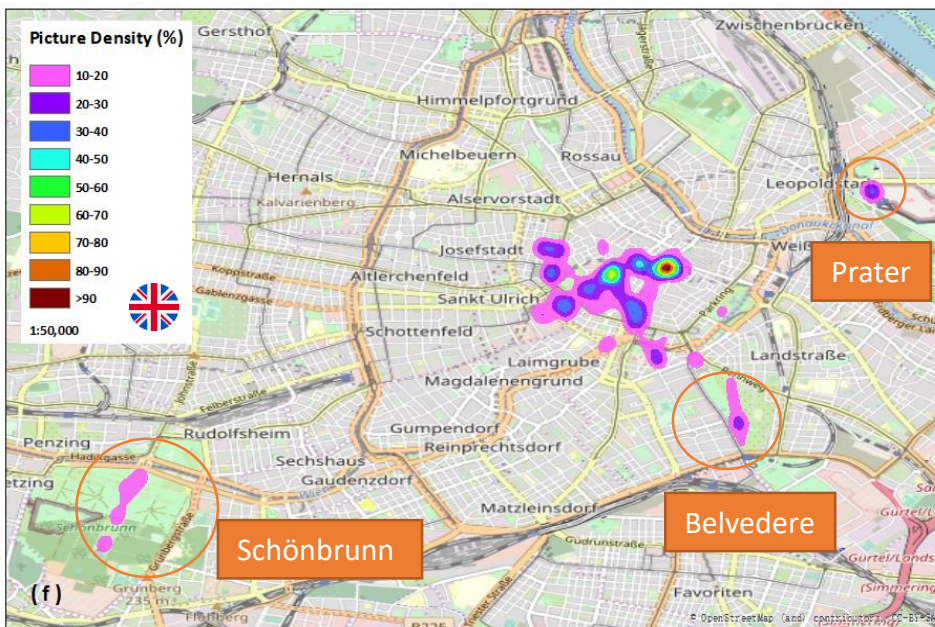
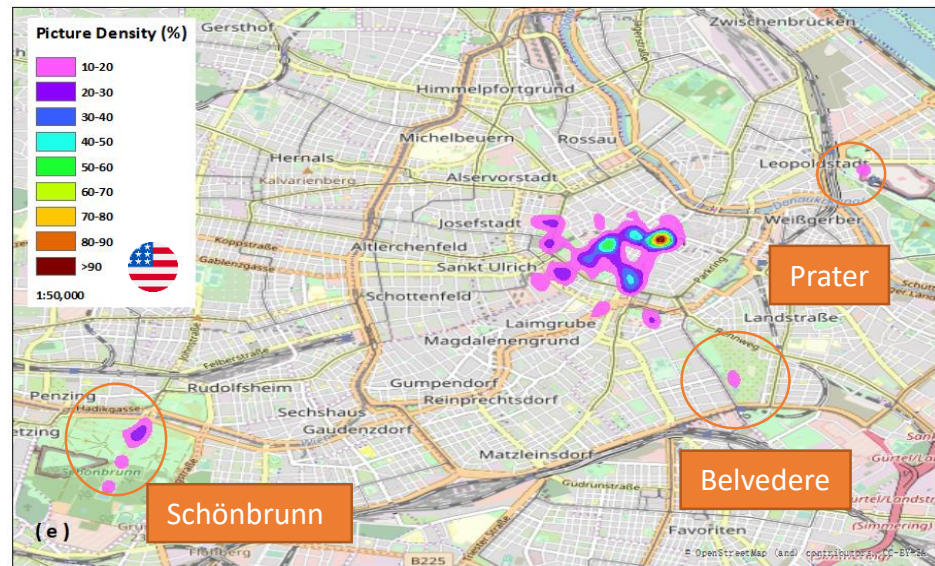
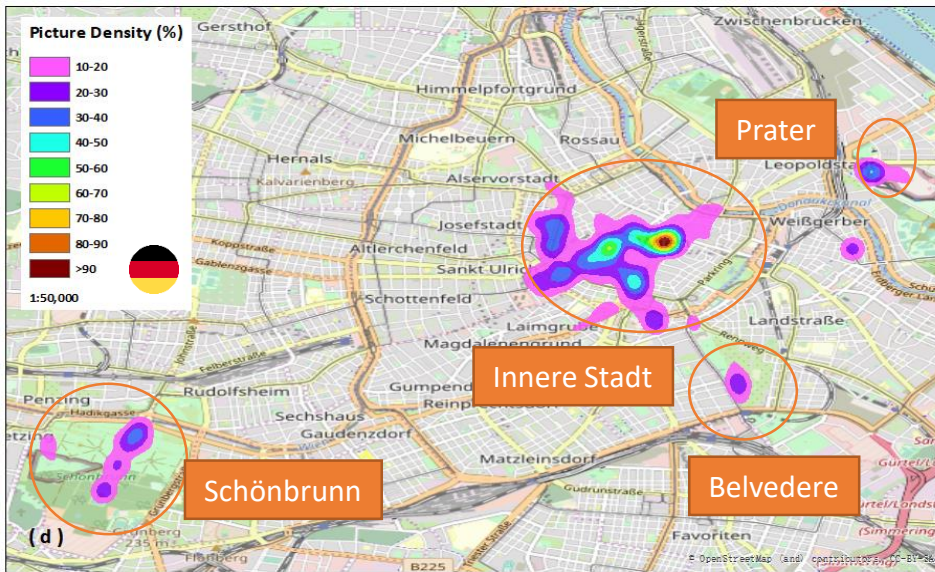
**Domestic:** Similar hotspots with locals&tourists; Higher picture density at the zoo (like locals)



# 5 Results and Conclusions

## 5.1 Footprints

Footprints of different user groups: (d) Germany (e) US (f) UK (g) Italy





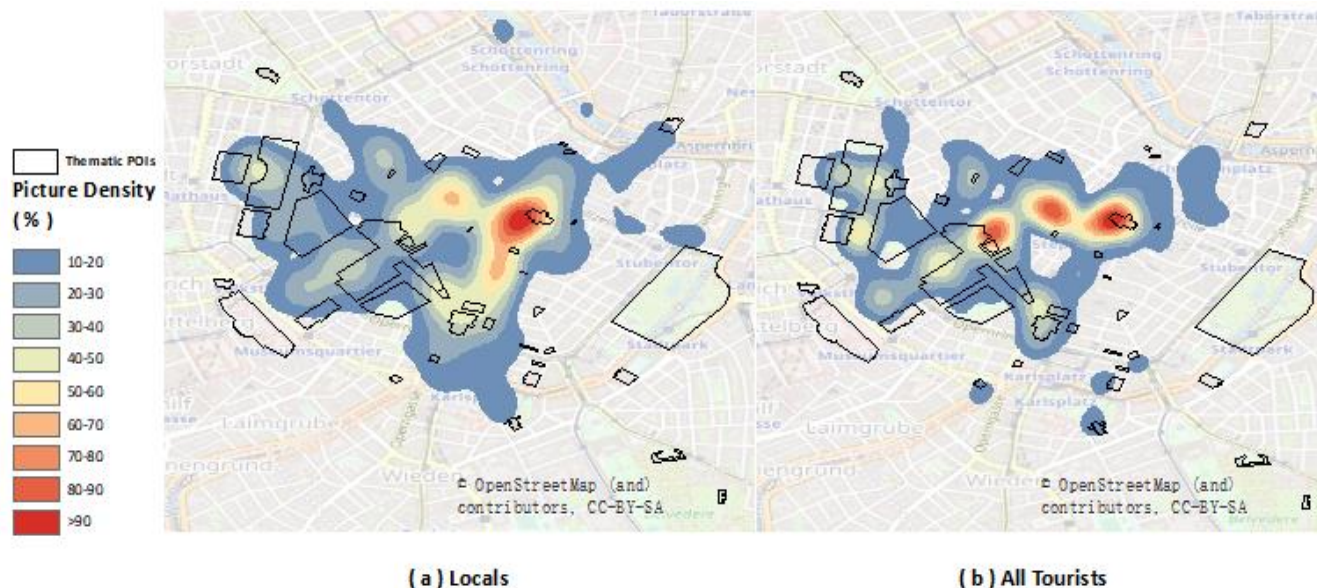
# 5 Results and Conclusions

## 5.2 Modelled city center

**Sub-objective b: To model the city center according to the semantics extracted from VGI of tourists and local citizens**

**Research question:**

**1. How differently do tourists and local citizens perceive the city center?**



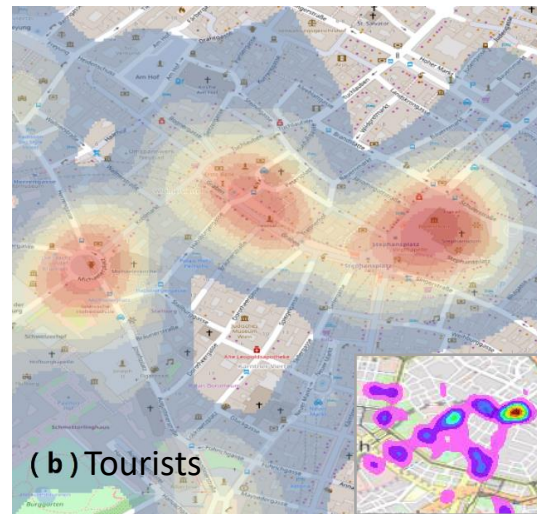
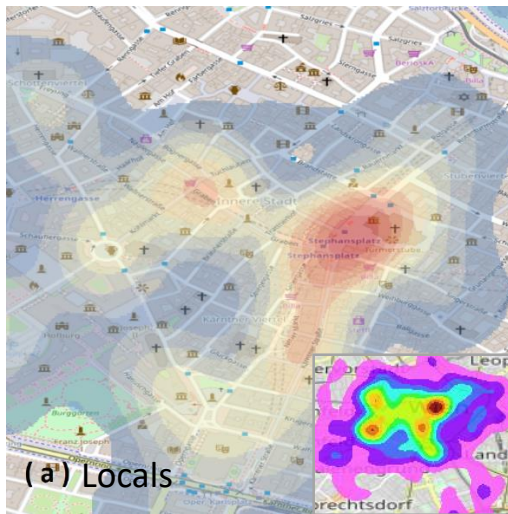
- **Rough agreement on the location**
- **Stephansdom**
- **Locals:**  
more certain
- **Tourists:**  
more ambiguous

# 5 Results and Conclusions

## 5.2 Modelled city center

**Research question:**

**2. Is there a relation between the footprints and perceived city center among tourists and local citizens? Is this relation clearer among certain user groups?**



- The answer is positive.
- Stephansdom: >90% density in the footprints of both groups
- The relation is clearer among the tourists user group.

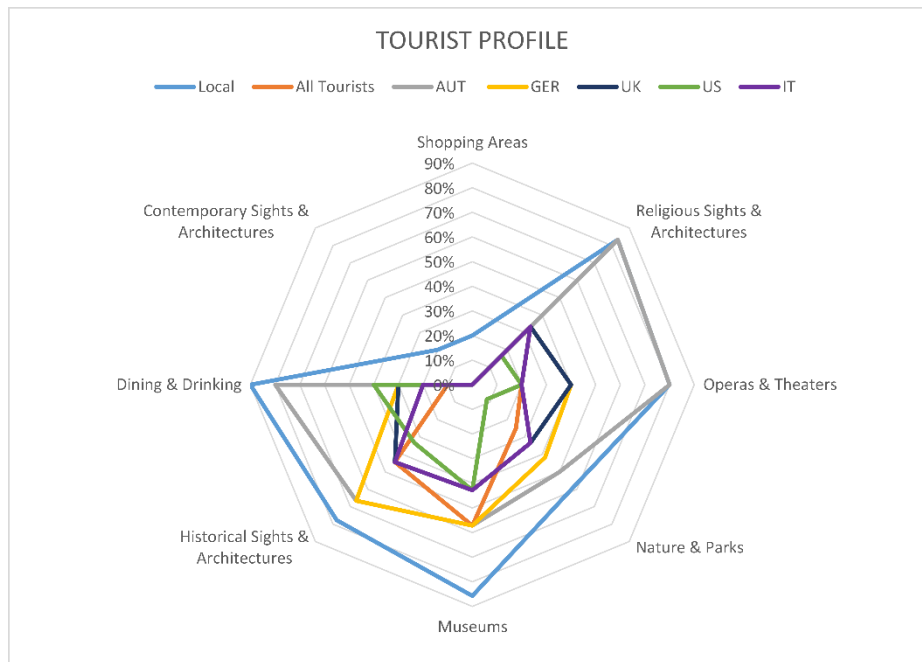
# 5 Results and Conclusions

## 5.3 Tourist Profile

**Sub-objective c: To create a tourists profile categorized by the origin countries of tourists as well as the local citizens in respect of diverse thematic POIs**

**Research question:**

**1. Thematic Interests: Can we identify a unique tourist profile regarding different thematic POIs for different user groups?**



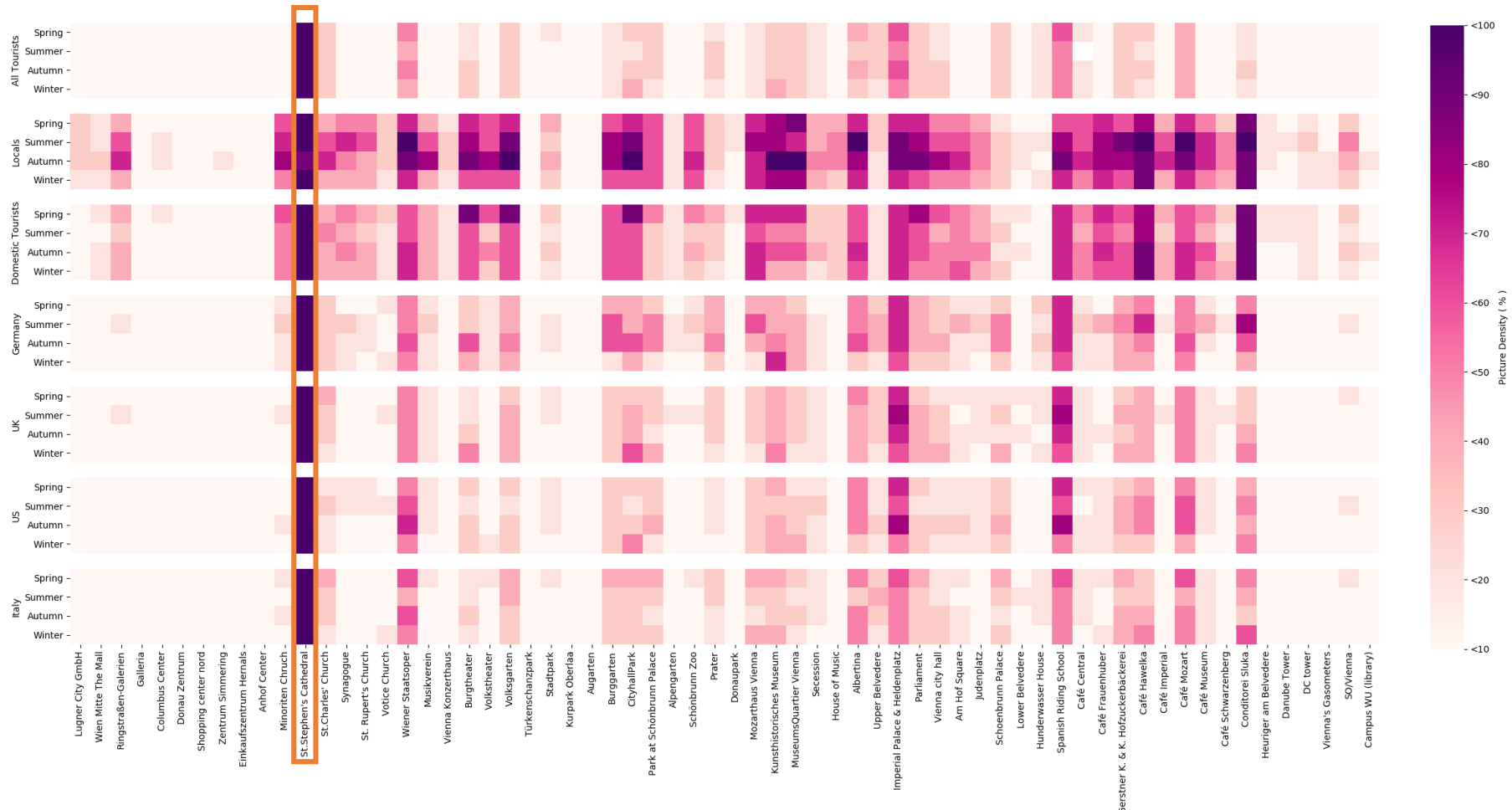
- **Yes**
- **Ratio ↑ Interest ↑**
- **Least interests: shopping areas & contemporary sights**
- **Locals: leading position (particularly museums) followed by Domestic tourist**
- **Different emphasis for each tourists groups**

# 5 Results and Conclusions

## 5.3 Tourist Profile

Research question:

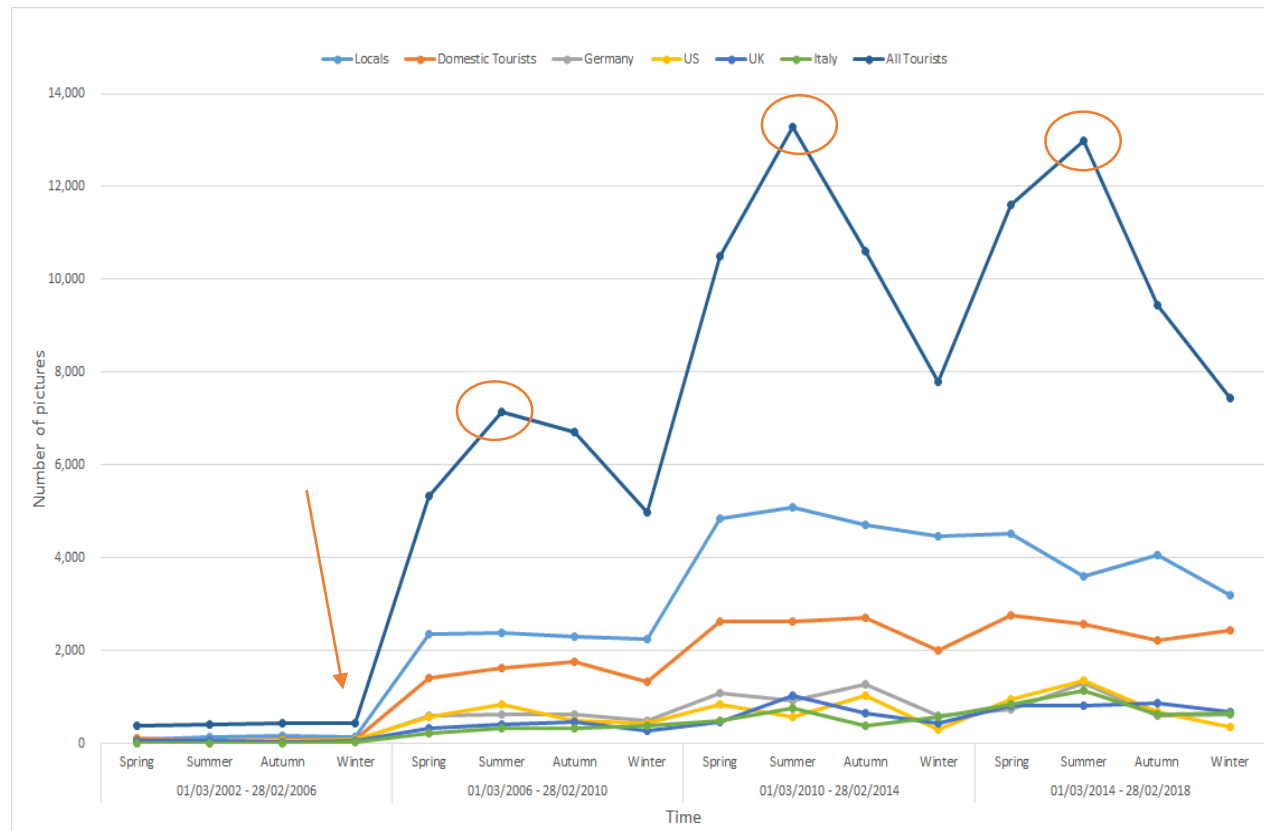
2. Are there correlations between the targeted thematic POIs in the diverse footprints and specific origin countries? Temporal trend: Is there a seasonal trend among them?





# 5 Results and Conclusions

## 5.3 Tourist Profile – Temporal trend



- **Stable uploads amount: March 2002-Feb. 2006**
- **Remarkable growth: Spring 2006**
- **Upload peaks: Summer**



## 6 Limitations

- **Quality of VGI is not assured:**  
**Localness of the VGI contributor & Motivations →**  
**False location tagging**
- **Limited representativeness of users:**  
**Less digital literacy; Single social media(Flickr) →**  
**Some groups are under-represented**
- **Classification of locals and tourists:**  
**Uploading behavior →**  
**Extracted temporal parameters for the classification of those**  
**with ambiguous origin information.**



## 6 Limitations

- **How a POI will be photographed and uploaded:**

**The type of the place and the related activities →  
Under-estimated POIs**

**Delay in uploading → Higher possibility of false geotagging**

**The location of taking the pictures →  
Dislocated picture concentrated spot for one POI**





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