



# Generalisation and Multiple Representation of Location-Based Social Media Data

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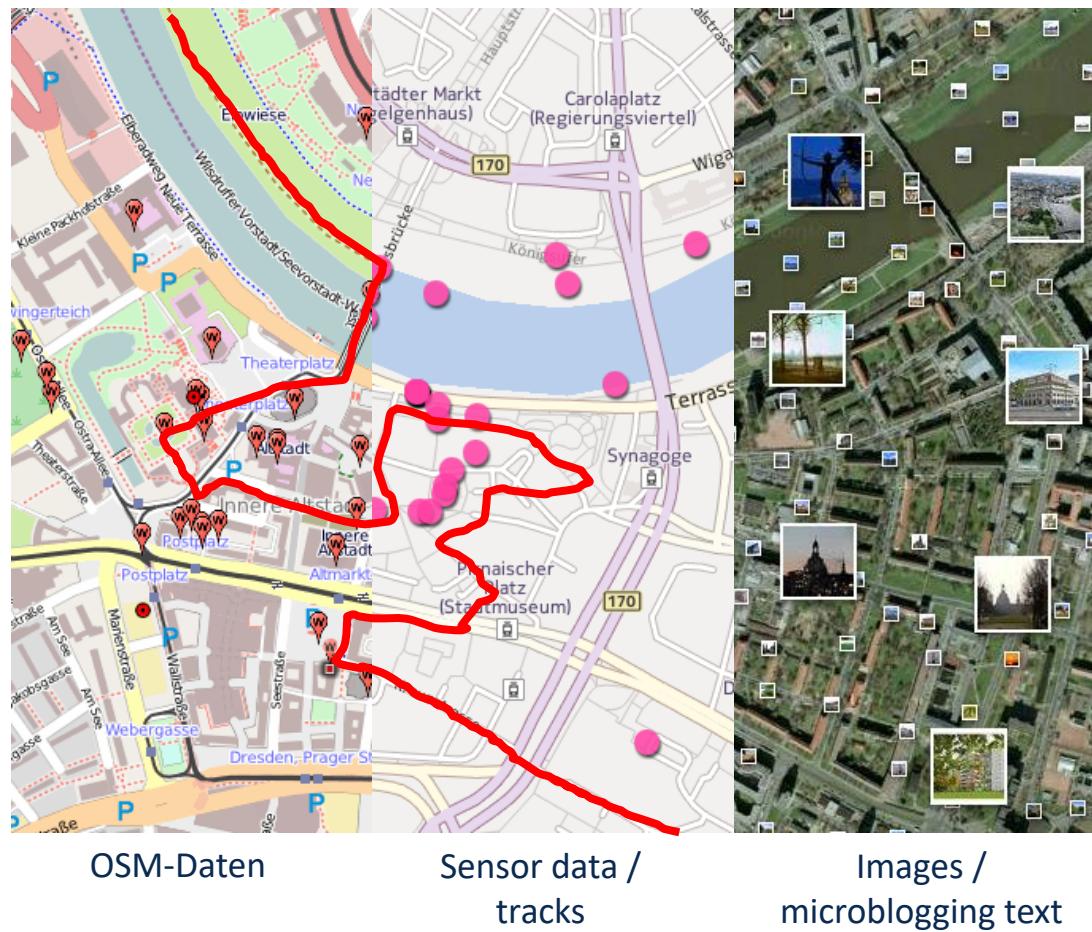
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# Outline

1. Motivation
  - VGI and spatial data from Location-Based Social Media
  - Potentials and challenges
2. Generalisation operators applied to LBSM
3. Derivation of Multiple Representations
4. Application examples
  - Tag Clouds Maps
  - Micro Diagram
5. Conclusions

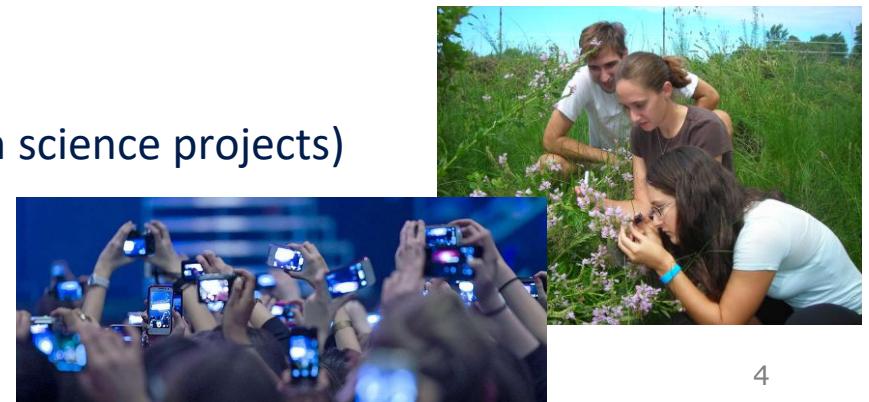
## Availability and retrieval of Volunteered Geographic Information

- broad range of volunteered geographic information (OSM-data, GPS-tracks, sensor data, Wikipedia, georeferenced photographs, social networks, microblogging, ... )
  - data sources are often very large, with high update rates (e.g. 500 Mill. Tweets per day)
  - include not only factual but also subjective information  
→ noise or signal
  - spatial- /temporal reference is given either completely or partially



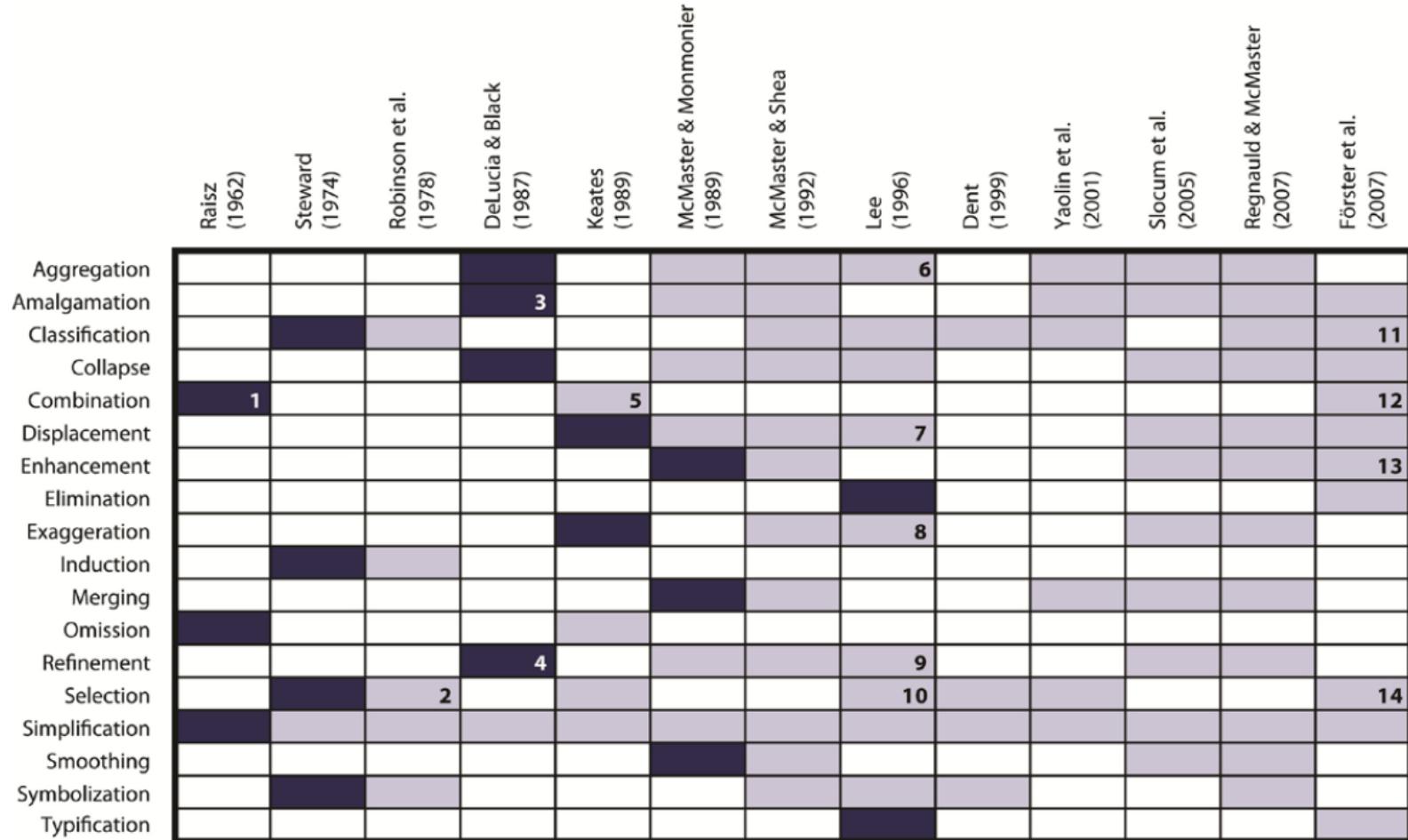
## Term definition

- VGI -Volunteered Geographic Information (Goodchild, 2007)
  - introduced by Michael Goodchild (2007)
  - special case of user generated content (UGC) with direct or indirect spatial reference
  - concept „Humans as Sensors“ refers to users who uses mobile technology and low-cost sensors for various tasks
- type of user involvement
  - active data collection (e.g. citizen science projects)
  - passive data generation via location-enabled mobile devices



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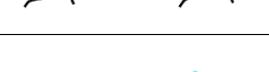
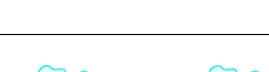
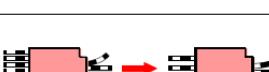
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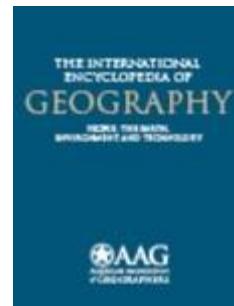
Quelle: Roth et al. 2011

A typology of operators for maintaining legible map designs at multiple scales



Operator / Description	Example with linear objects	Example with area objects
<b>Class Selection</b> Select the classes of features and attributes that the model/map should contain.		
<b>Reclassification</b> Changes the class membership of the feature and reduces the number of modeled attributes.		
<b>Combine</b> Regrouping a set of feature into a more abstract feature, often of higher dimension.		
<b>Collapse</b> Reduction in the geometric dimension. Point features are often represented by icons.		
<b>Simplification</b> Eliminates the unimportant details, while the general characteristics are preserved.		
<b>Elimination</b> When congestion occurs, less important and short or small objects are eliminated.		
<b>Aggregation</b> Common boundaries, small gaps between neighbour objects are eliminated.		
<b>Enhancement</b> Enhancement is used to exaggerate parts of an object or enlarge the whole object.		
<b>Displacement</b> Important objects remain on their locations. Unimportant objects are moved away.		
<b>Typification</b> Reduces the number of objects, while their distribution and patterns are preserved.		

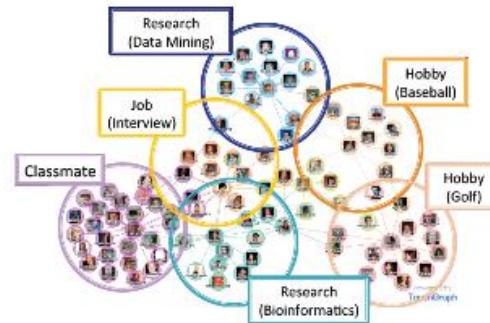
## 10 Generalisation Operator



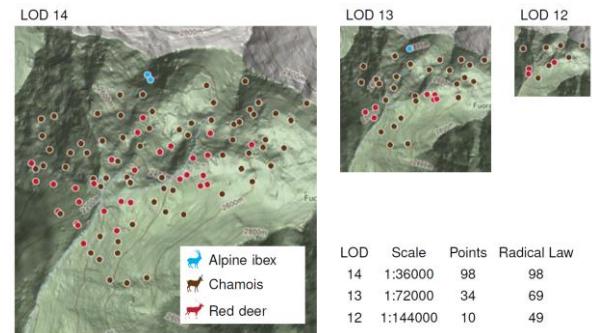
Mackaness, W. A., Burghardt, D. and Duchene, C. (2017). **Map Generalization**. *The International Encyclopedia of Geography: People, the Earth, Environment, and Technology*. John Wiley & Sons.

# Relevance of generalisation operators applied to LBSM

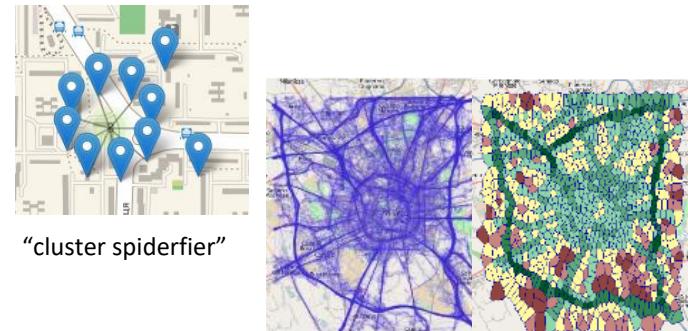
Generalisation operator	Relevance to LBSM	Corresponding methods
Classification / Reclassification	very relevant	(spatial) topic modelling, theme based clustering, correlation analysis
Elimination and Selection	very relevant	filtering according to spatial, temporal, semantic or social criteria
Aggregation and Typification	very relevant	spatial or distance based clustering, aggregation of points or lines (trajectories), anonymisation through aggregation



Han and Lee (2016)



Bereuter (2015)



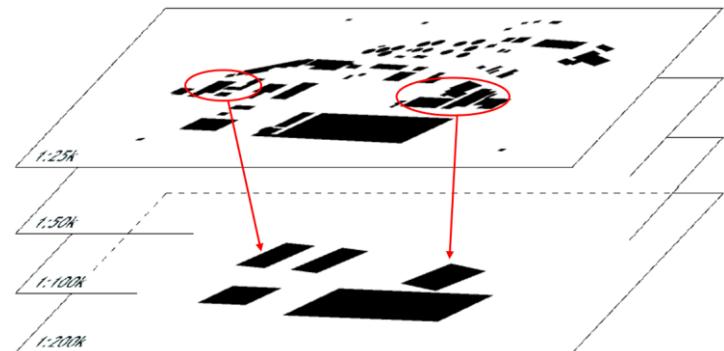
trajectories points are combined and presented through choropleth map  
(Andrienko et al., 2009)

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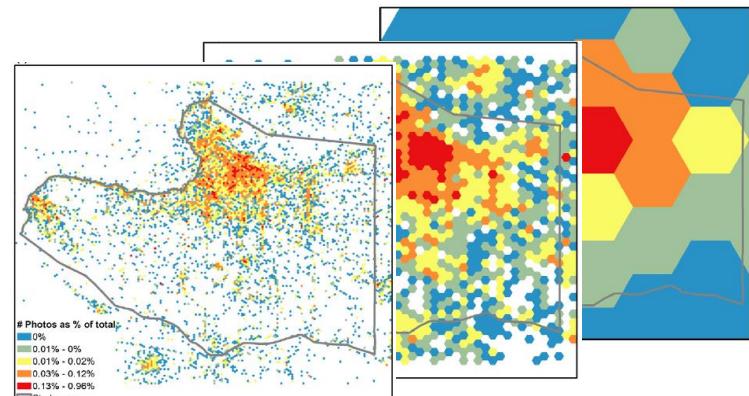
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## Terminology – “Multiple representation” vs. “Multi-scale views”

- the term “multiple representations”
  - is used in the context of topographic map production for scale dependent storage of object geometries of the same entity (Sarjakoski, 2007)
  - explicit linkage between representations enable update propagation, consistency checks and support of continuous zooming
- related to the analysis of LBSM data the slightly different term “multi-scale view” is applied
  - gives more attention to the varying patterns at different scales than to the linkage of individual objects



Linkage within MRDB (Cecconi, 2003)



Multi-scale approach applied to geotagged photographs (Feik and Robertson, 2015)

## Multiple representation of location-based social media data

### Reasons for derivation

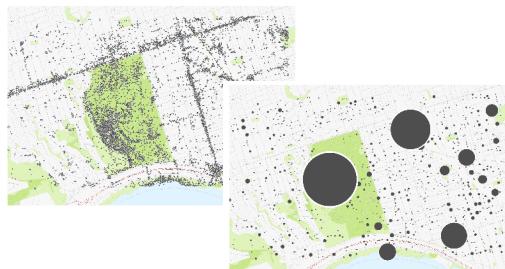
- enable visualisation of overview and detail
  - accessible either interactively through continuous zoom or through parallel presentation with multiple linked views
- support multi-scale analysis
  - to identify scale dependent pattern and relations between thematic content and geographic features
  - avoid modifiable areal unit problem (MAUP) as different aggregations can be study at various scales

## Derivation of Multiple Representations

Internal derivation  
(generation out of geodata)

Hierarchal clustering  
(Dendrogram)

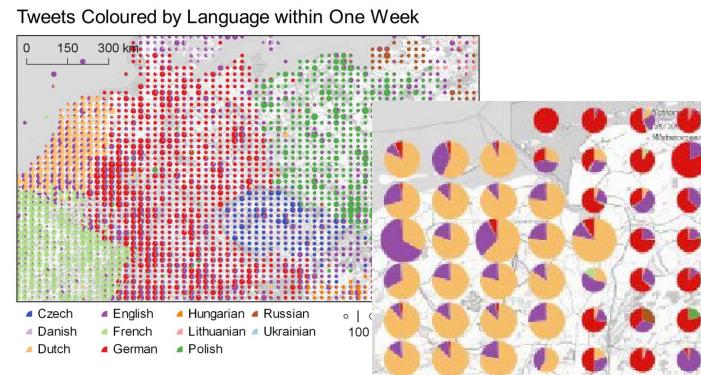
Tag Cloud Maps



External assignment  
(hierarchical structured reference units)

Hierarchical space partition / tessellation  
with Grids, Quadtree, Hexagons, Geohash

Micro-Diagramme

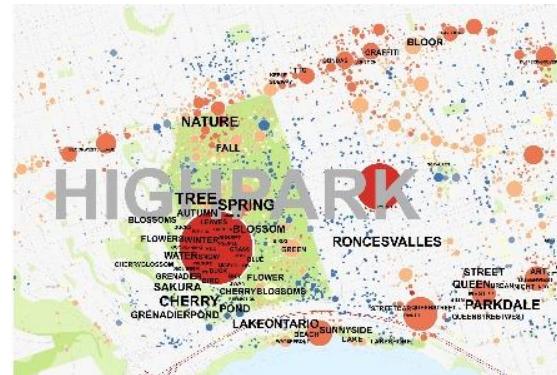
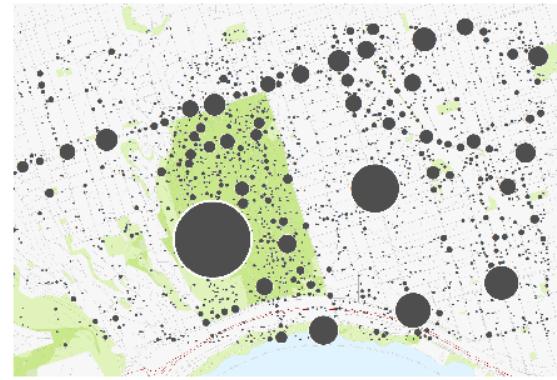


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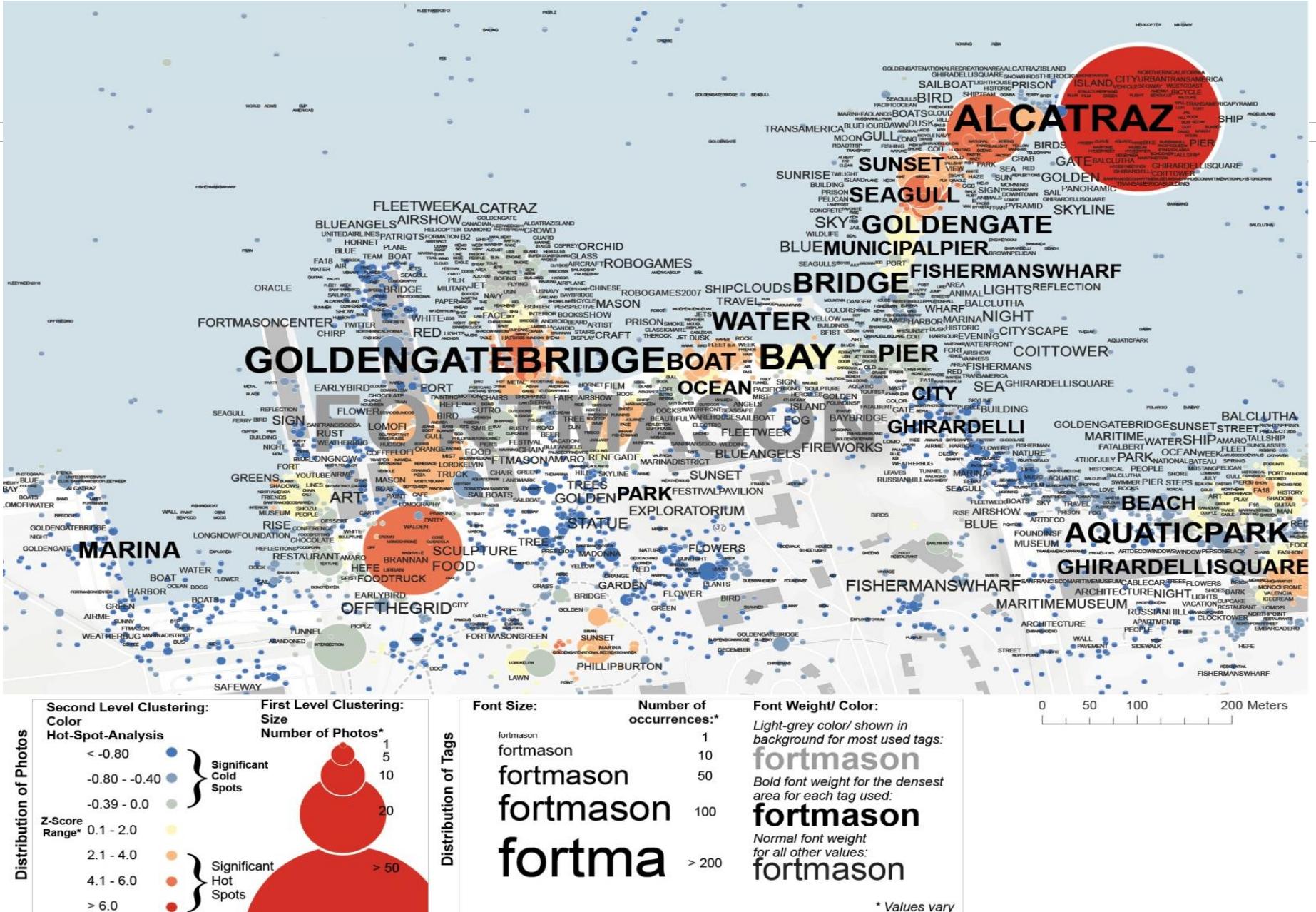
## Tag Maps based on georeferenced word clouds

- Input: point locations of georeferenced photos from sharing application (e.g. Flickr, Panoramio) with various attributes/tags
- aim on derivation of „tag maps“ for landscape and urban planning (PhD thesis Dunkel, 2016)
  - Aggregation of photo locations based on hierarchical clustering for
  - Visualisation of the most common tags



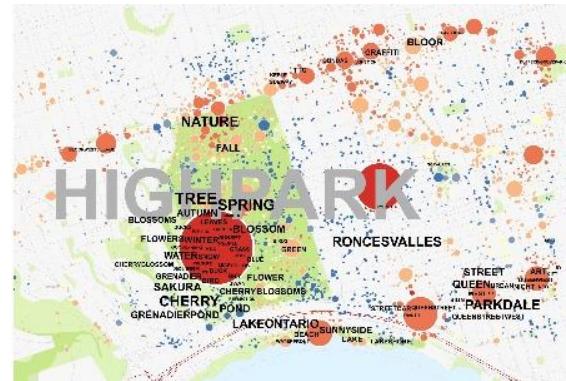
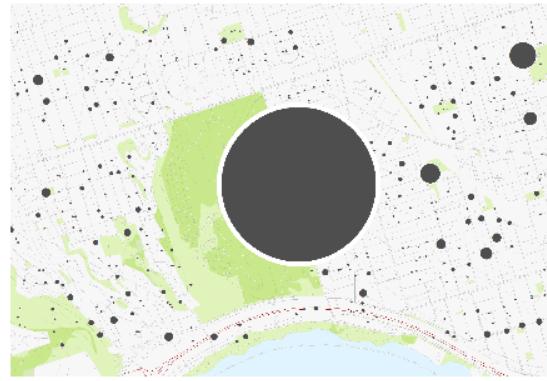
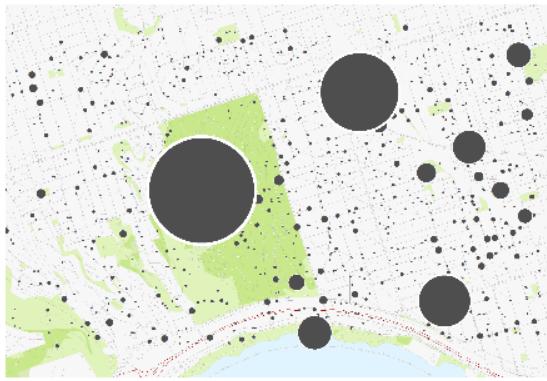
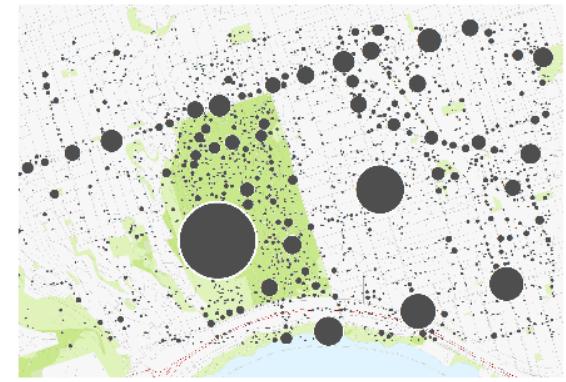
PhD thesis: A. Dunkel (2016)

Assessing the perceived environment through crowdsourced spatial photo content for application to the fields of landscape and urban planning.



Source: Dr.-Ing. Alexander Dunkel, Institute of Cartography, TU Dresden

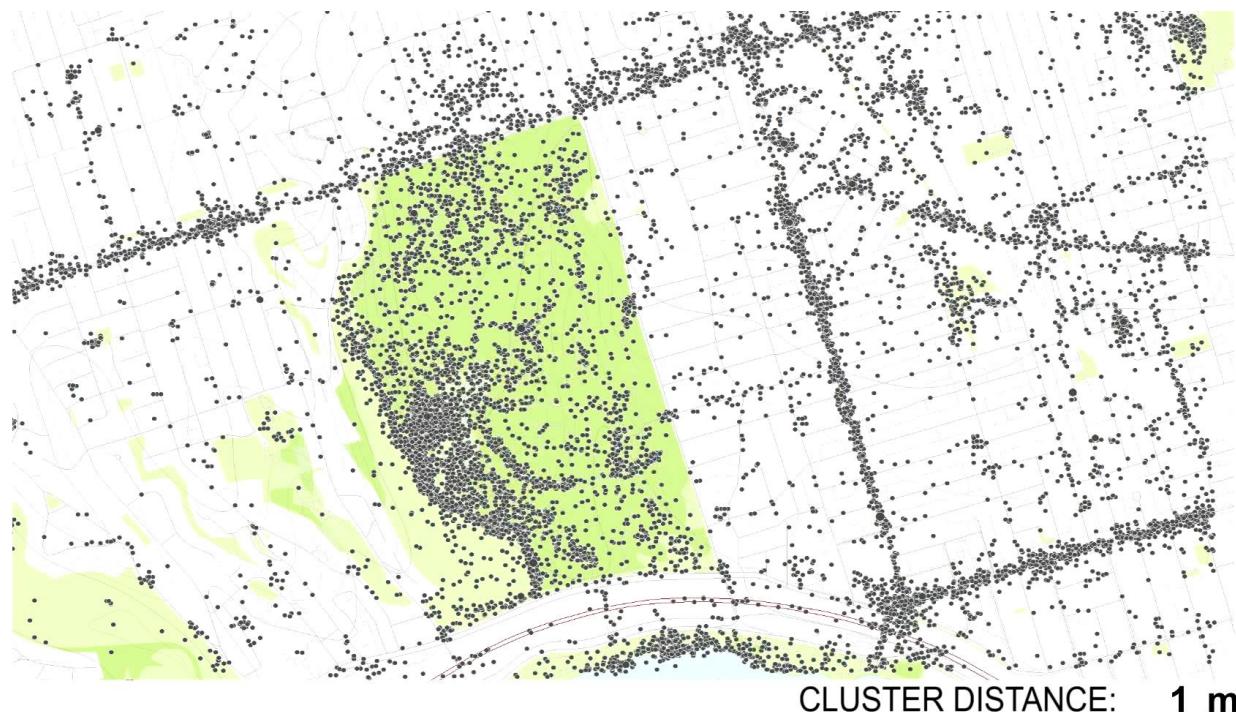
## Various patterns generated by hierarchical clustering



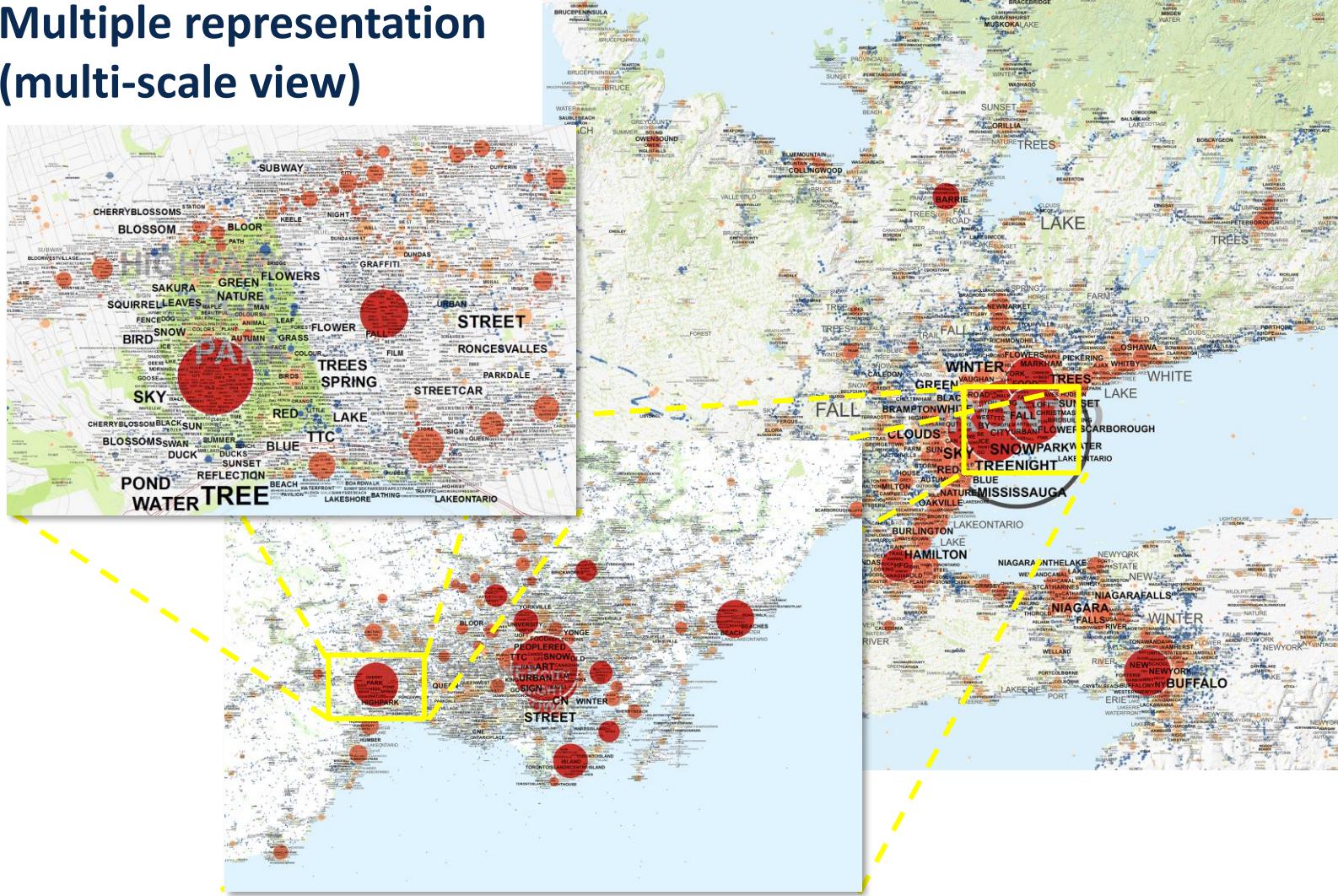
## Hierarchical clustering

Variation of cluster distance →

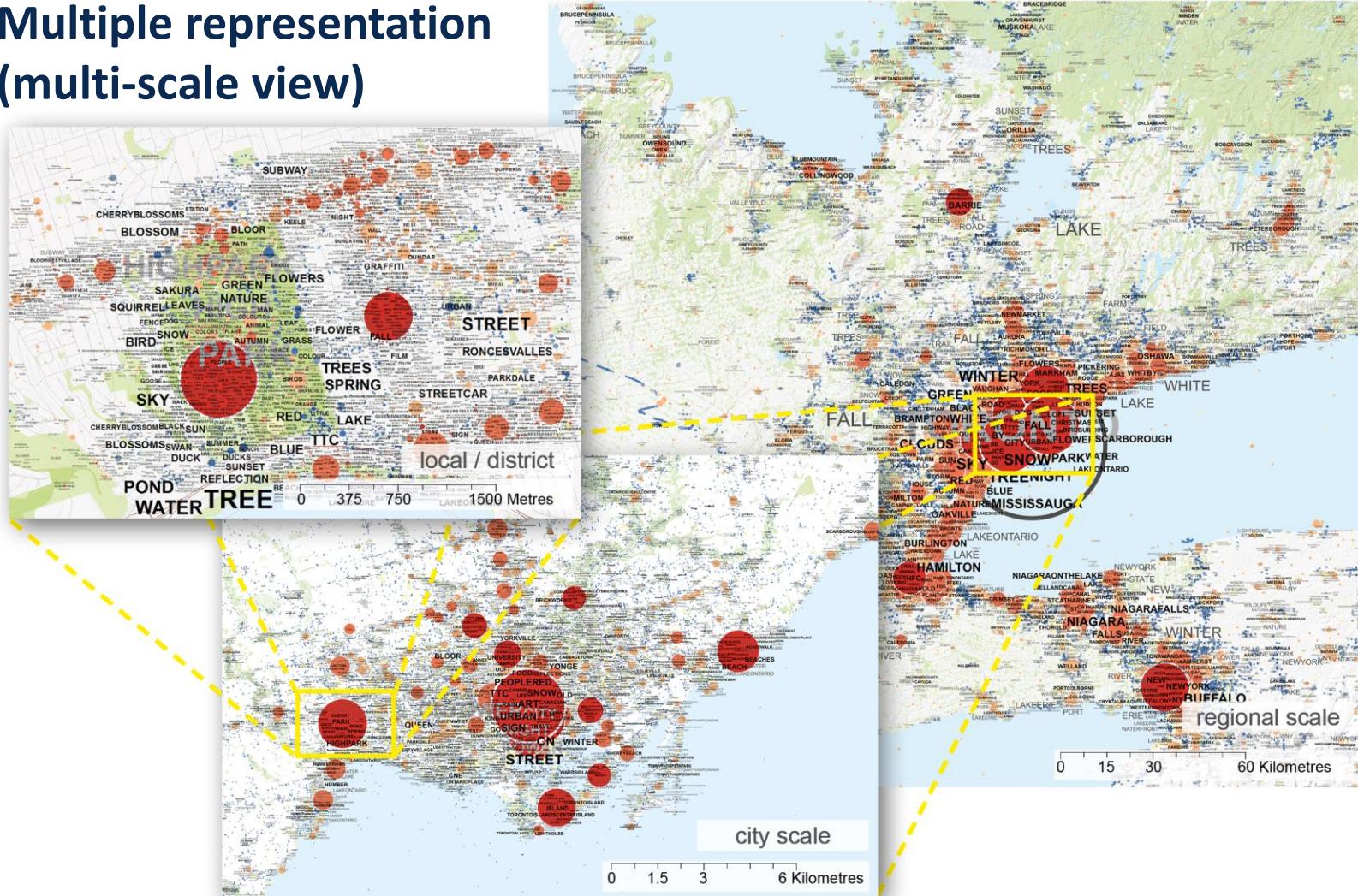
Derivation of multiple representation for various scales



## Multiple representation (multi-scale view)



## Multiple representation (multi-scale view)

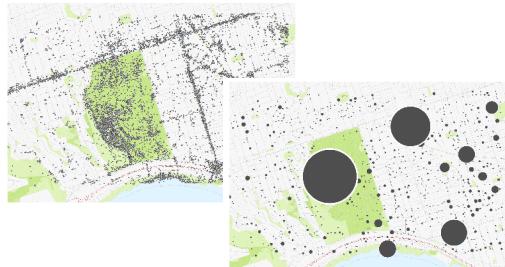


# Derivation of Multiple Representations

Internal derivation  
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Hierarchal clustering  
(Dendrogram)

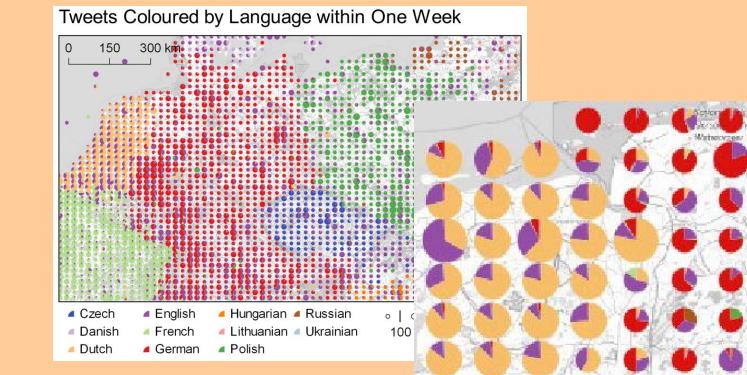
Tag Cloud Maps



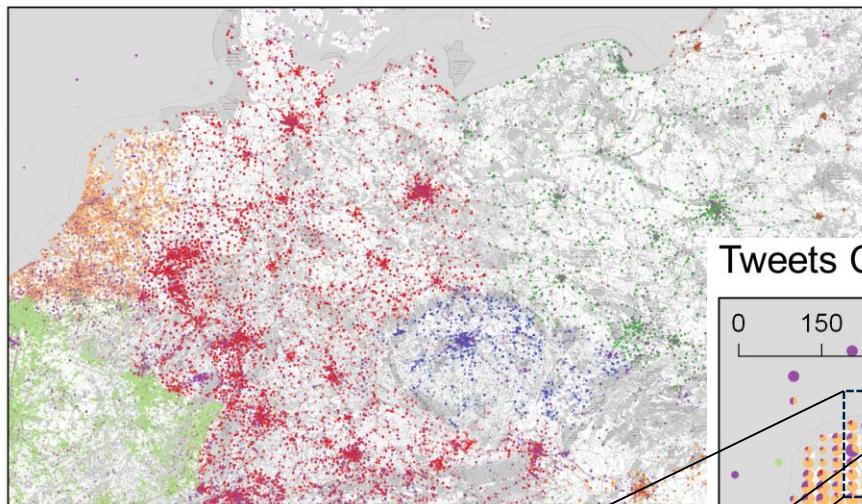
External assignment  
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Hierarchical tessellation  
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Micro-Diagramme

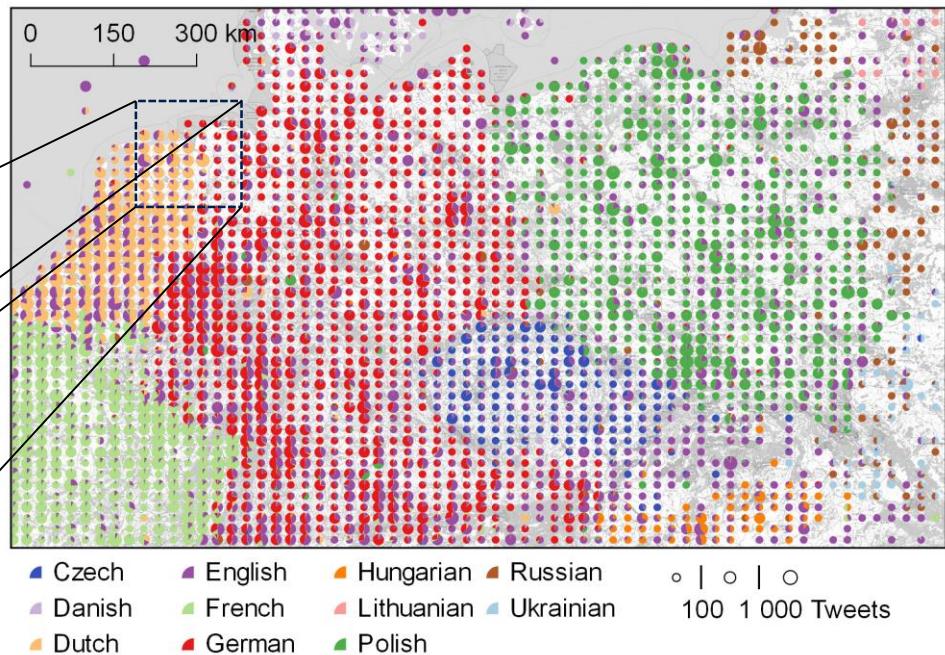


Tweets Coloured by Language within One Week

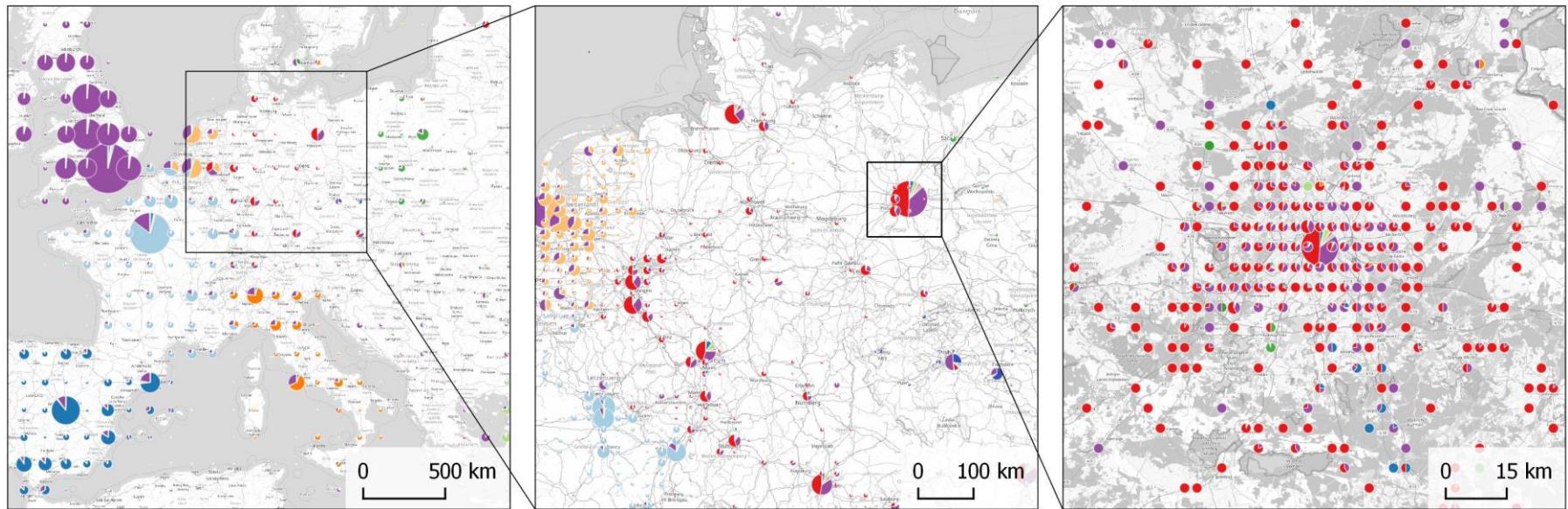


**Micro Diagrams –**  
 multivariate visualisation of  
 language distributions from Tweet

Tweets Coloured by Language within One Week



## Derivation of multiple representation



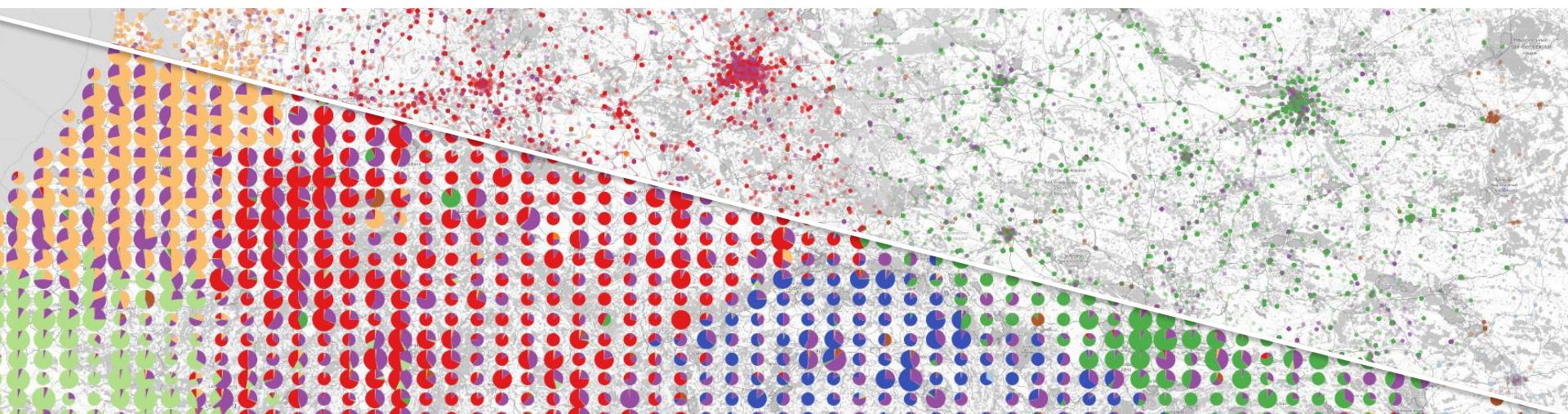
# A Short Discussion of the Micro Diagrams

## Advantages

- No overlapping/mixing of colours
- Abstract presentation of quantities
- Multiresolution
- Efficient data storage

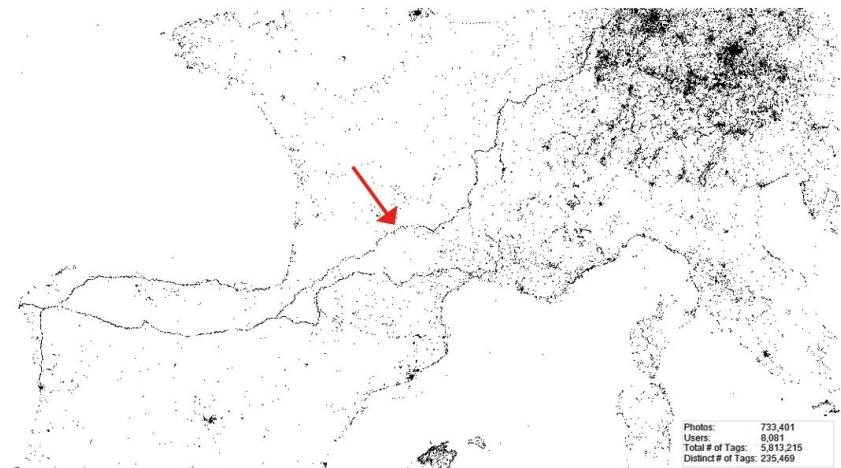
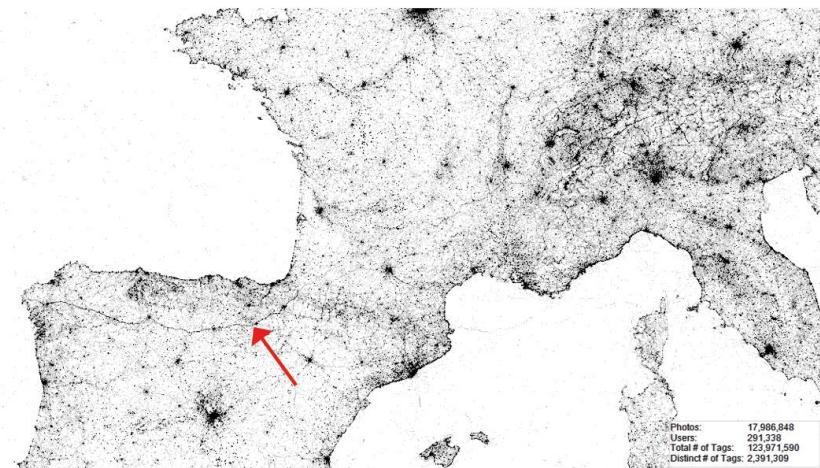
## Disadvantages

- Complex visualisation
- Understanding takes time
- Limited numbers of categories
- Aggregation can disturb data



## Multiple representation with reproduction of different human perspectives

- a broader definition of “multiple representation” could be used to reflect on the varying viewpoints of people (subjective perception)
  - requires specification of different user groups, e.g. regarding age or home town (taken from user profile)
  - example: routes of Camino de Santiago perceived by German photographers



Flickr photo locations in Europe (a) for all photographers (left map) and (b) photographers with origin set to Germany (right map)

## Conclusion

- consideration of scale is essential for the analysis and visualisation of location-based social media
  - the derivation of smaller scale representations of LBSM data can be achieved through automated generalisation (most relevant operations are classification, filtering, selection as well as aggregation, typification)
- interactive multiple representations provide overview and detail from spatial and semantic point of view → patterns and relationships change at different scales
- 2 derivation strategies for the generation of multiple representations:
  - I) the internal derivation through hierarchical clustering → “Tag Maps”
  - II) the external assignment of hierarchical structured reference units  
→ “Micro Diagrams”
- LBSM data provide new challenges related to abstraction and derivation of multiscale views



## »Wissen schafft Brücken.«

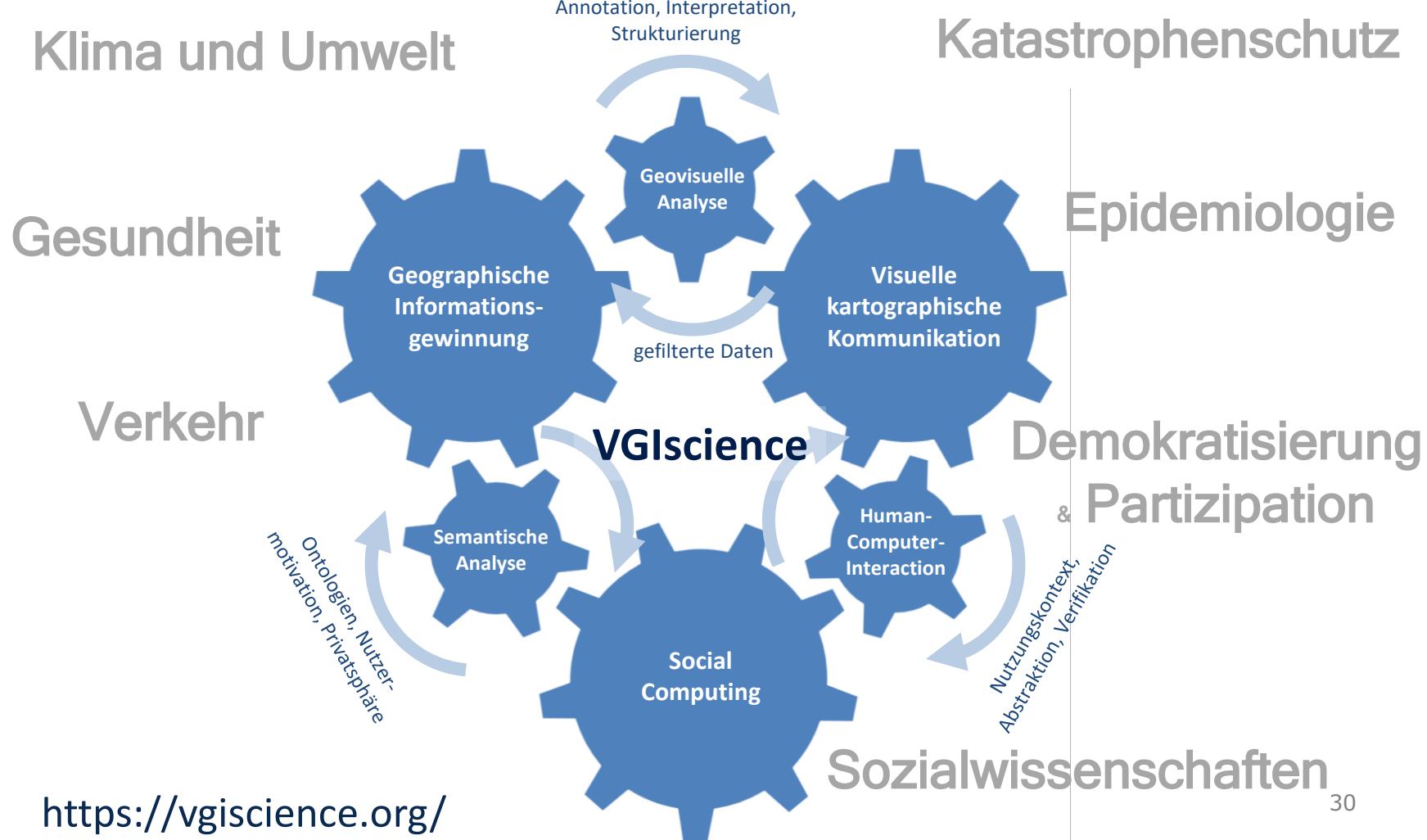
Prof. Dr.-Ing.habil Dirk Burghardt  
Institut für Kartographie  
TU Dresden

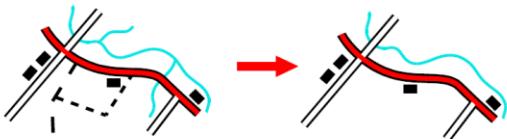
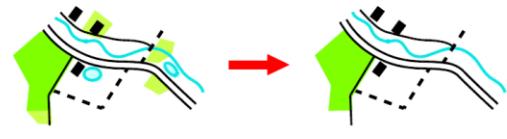
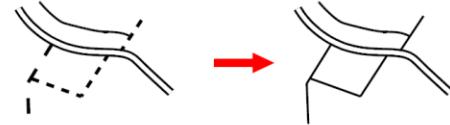
[dirk.burghardt@tu-dresden.de](mailto:dirk.burghardt@tu-dresden.de)

## Location-based Social Media (LBSM) data

- social networks provide platforms for exchange of opinions, experiences and information
  - events take place at specific locations – sport events, floods, traffic jam, demo's, comments on restaurants, ...
  - creation of spatial data as side effect (passive)
- characteristic of the data
  - large amount with strong heterogeneity
  - actuality of the data, real-time, streaming
  - semantical interpreted – user specific
  - location data privacy





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<b>Combine</b>  Regrouping a set of feature into a more abstract feature, often of higher dimension.		
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