

## Preferred citation style

---

Axhausen, K.W. (2005) Measuring activity spaces and behavioural innovation: Recent results, Seminar at FUNDP, Namur, March 2005.

# Measuring activity spaces and behavioural innovation: Recent results

KW Axhausen

IVT

ETH

Zürich

March 2005

 *Institut für Verkehrsplanung und Transportsysteme*  
*Institute for Transport Planning and Systems*

**ETH**

Eidgenössische Technische Hochschule Zürich  
Swiss Federal Institute of Technology Zurich

# Collaborators

---

S. Schönfelder (PhD student; activity spaces and spatial innovation)

M. Botte (MSc student; catchment areas)

T. Ohnmacht (Intern; Biographical interviews)

# How to measure spatial reach ?

---

Question:

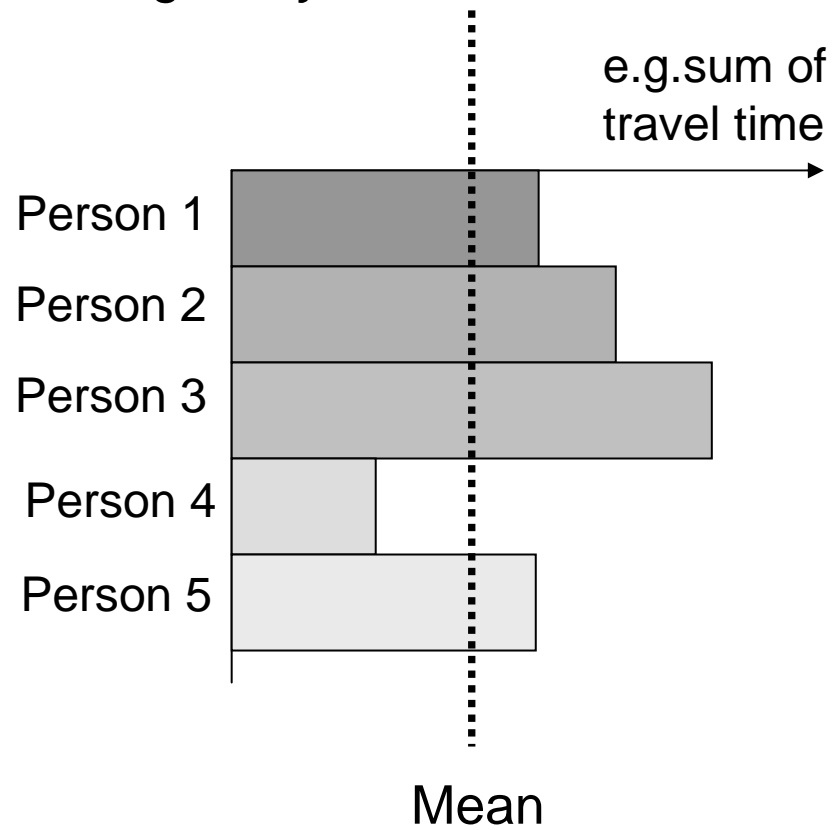
What area, footprint etc. is used by an organisation, person or city ?

- Person: Activity space
- Network: Geography of its anchors; activity space
- City: Catchment area
- Organisation: Market

# How measure variability of travel ?

## Inter-personal level

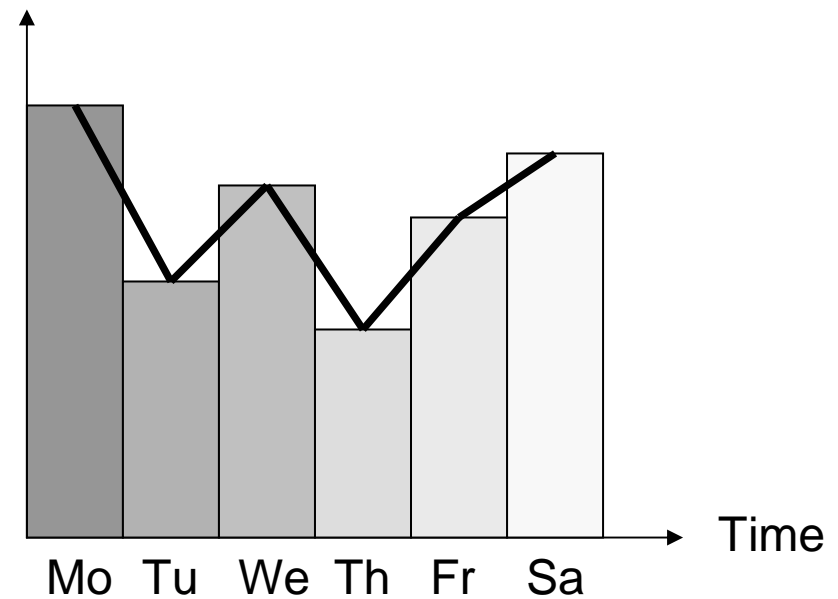
*Single day*



## Intra-personal level

*Person X*

e.g. sum of travel time



# Long-term issues in travel behaviour

---

Temporal phenomena: Behavioural issues over time

- Stability
- Regularity / Rhythms
- Variability
- Dynamics

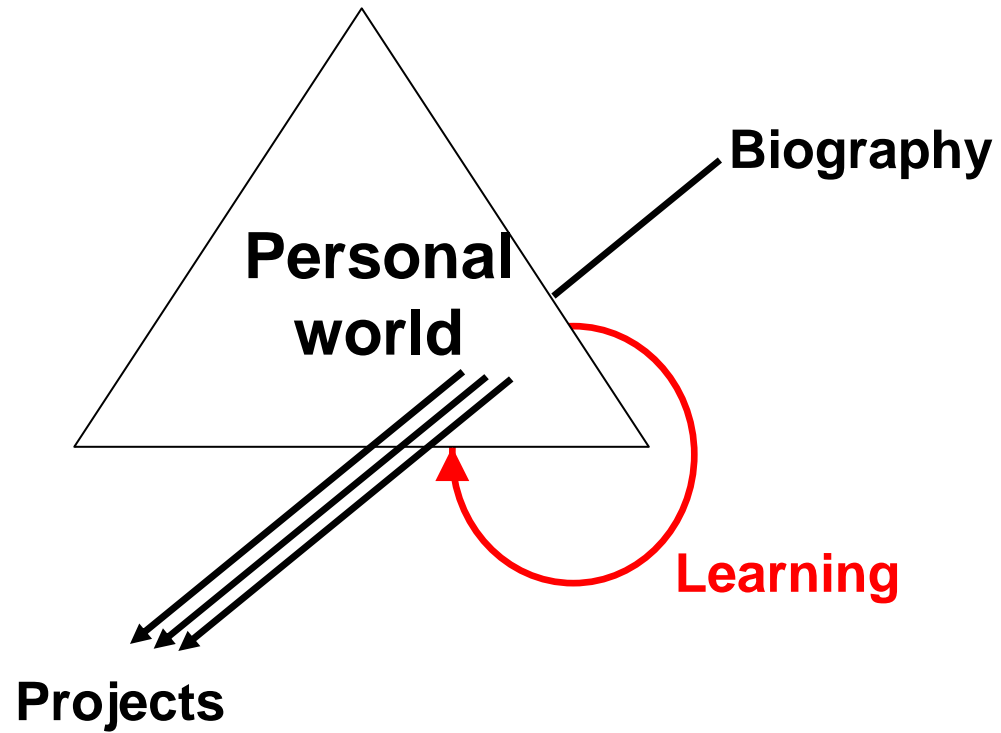
Spatially:

How may locational choice and the intensity of individual usage of urban space be visualised and measured?

(Geocoding/GPS facilitate)

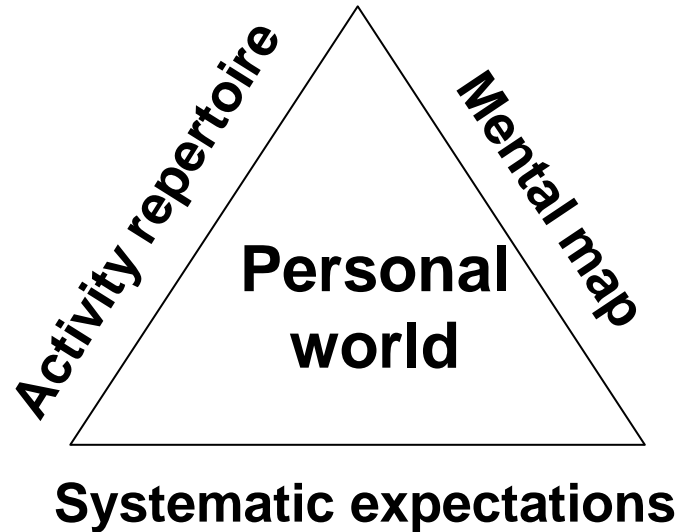
# Position: Individual in the biographical context

---



## Position: Personal world

---



Activity repertoire: What can be done where and how

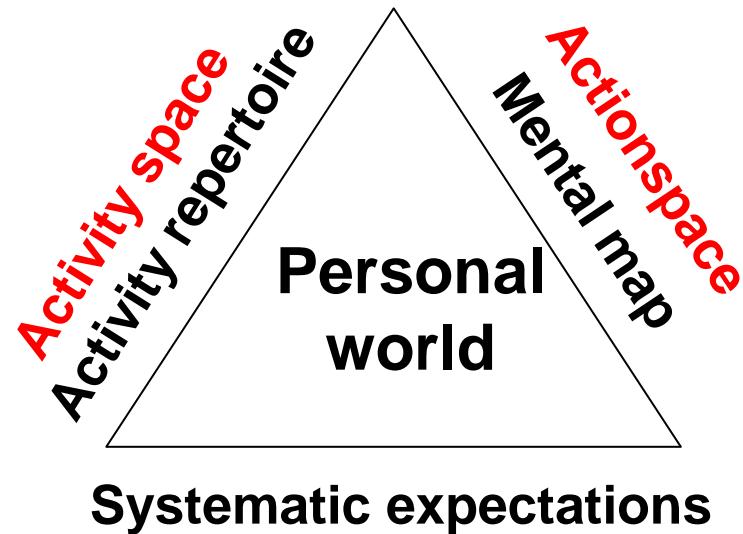
Mental map: links between locations and their generalised costs of travel

Systematic expectations about locations not yet visited



## Position: Personal world

---



Activity space: Locations in current use

Action space: Extension of the mental map by locations known second hand via word-of-mouth or the media

# Issues with the concept of „activity space“

---

Current definition is restrictive:

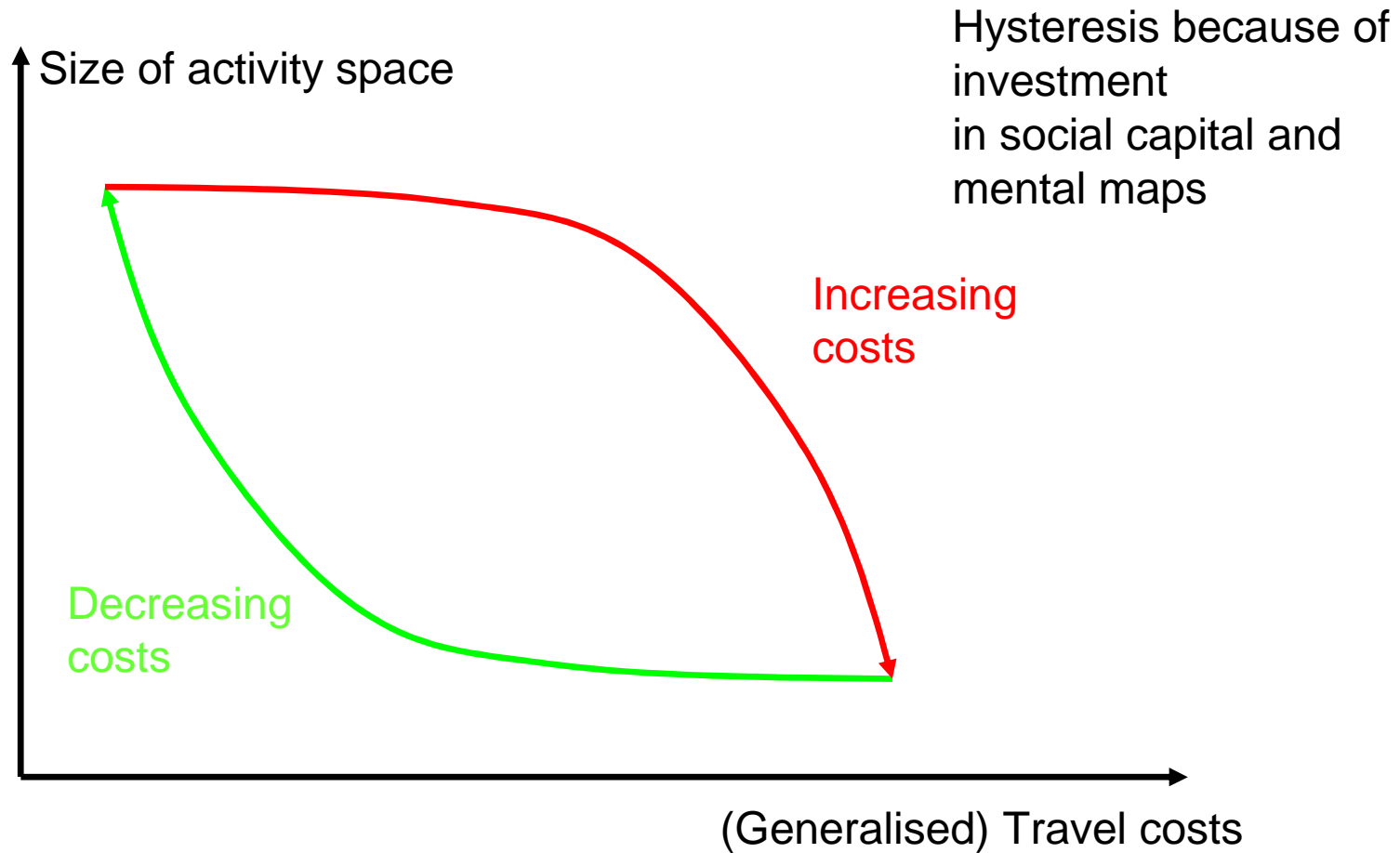
Locations in use (and by implications paths used)

But measurable

Most of the literature equates activity space and mental map or action space, which is unmeasurable

# Assumed relationship between activity space and costs

---



## Data sources

---

Place		Duration	Mode
Travel diaries:			
Uppsala 1971		5 weeks	All
Mobidrive 1999 (Karlsruhe, Halle)		6 weeks	All
Zürich 2001 (Leisure only)		12 weeks	All
Thurgau (CH) 2003		6 weeks	All
GPS – studies:			
Borlänge 2000-2002	up to	80 weeks	car (240.000 trips)
Copenhagen AKTA 2001-2003		24 weeks	car
Commute Atlanta 2004	>	52 weeks	car

## Key variables/structures

---

- Size of activity spaces
- Number of places visited
- Structure of activity spaces
- Innovation in destination choice

# Measuring the size of activity spaces: Problems

---

Transformation of information about the places of contact

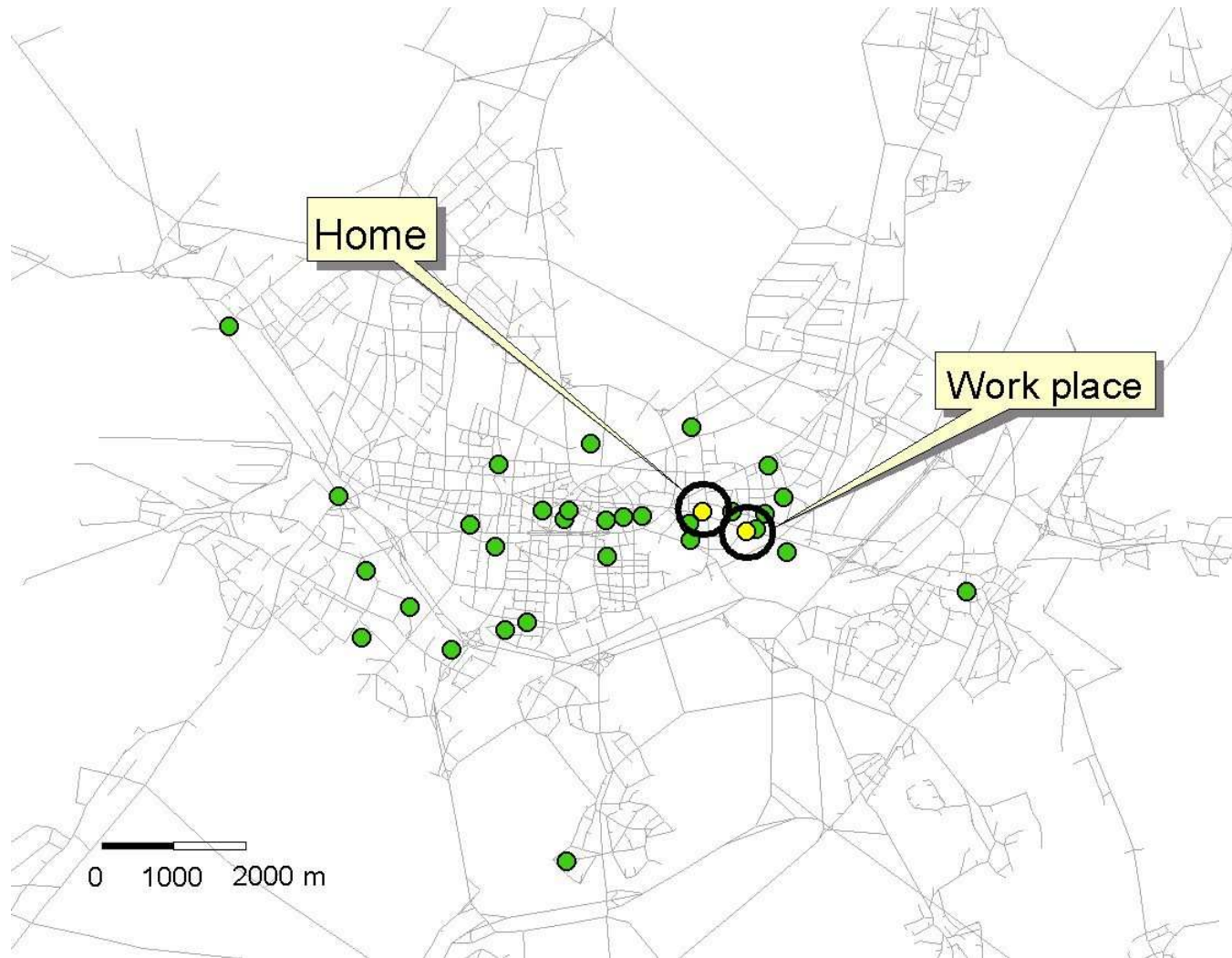
- Social relationships
- Origin/Destination
- Sale or usage

in a low-dimensional measure of

- Comparison over time (for one traveller)
- Comparison between travellers

## Example: Visited places over 6 weeks (local)

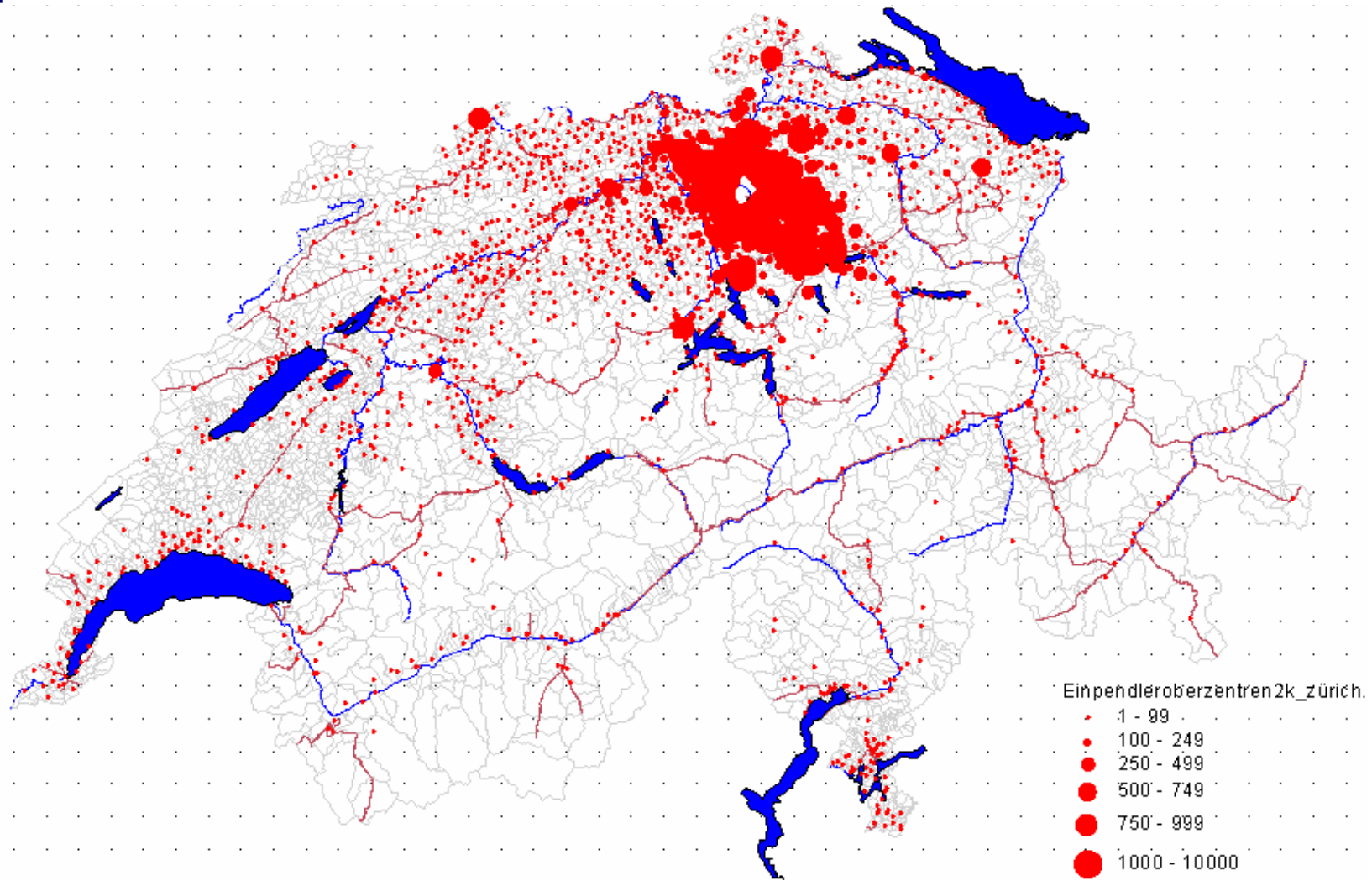
---



Woman, 24  
Fulltime work,  
single  
216 trips in 6  
weeks

# Example: Commuters to Zürich (2000)

Axhausen, Botte und Schönfelder, 2004





# Approaches

---

„Parametric“:

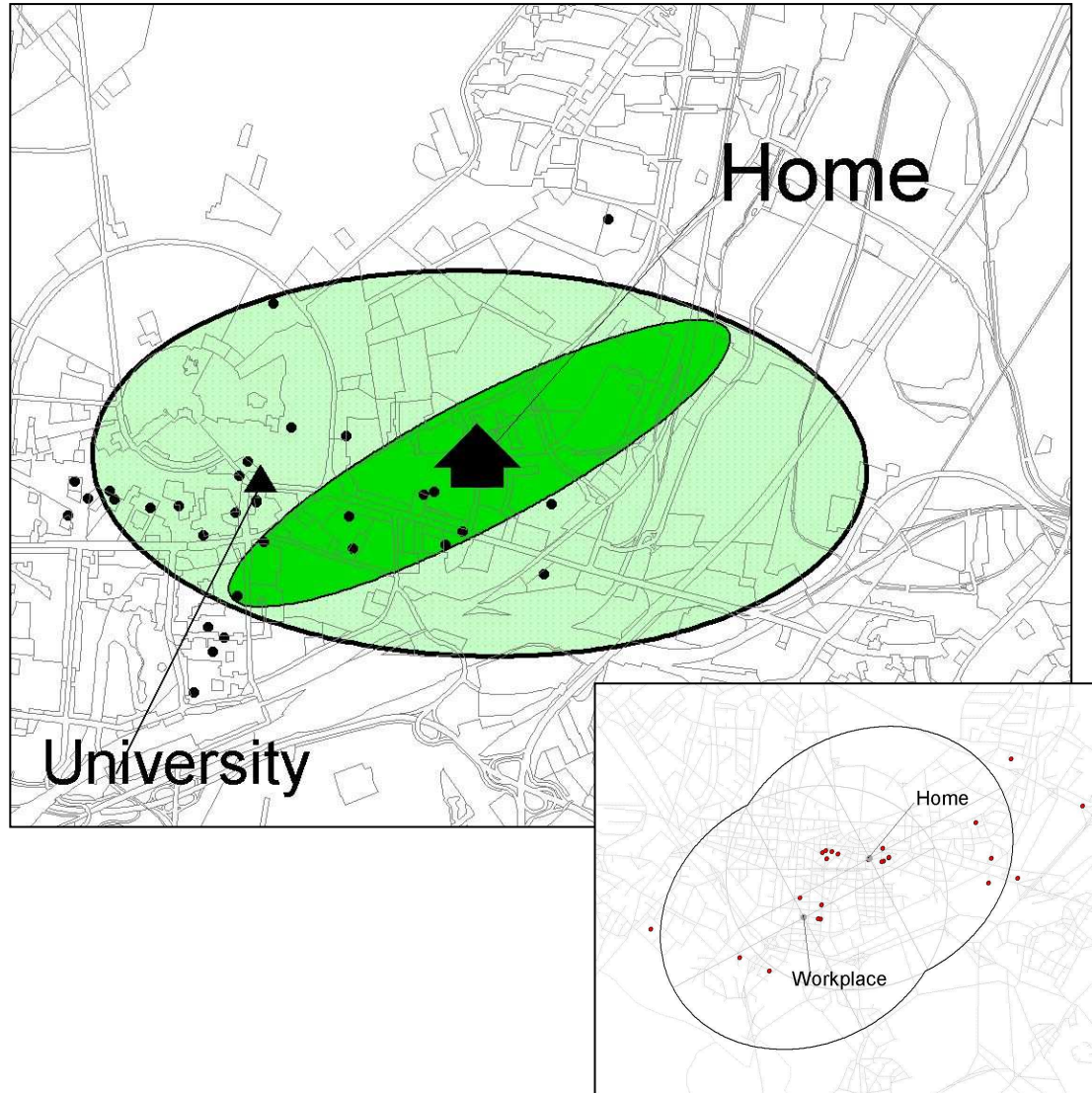
- 95% confidence ellipse

„Non-(semi)-parametric“:

- Spatial smoothing (kernel – density estimates)
- Network of shortest paths

Network of tracked routes

# Approach 1: 95% confidence ellipse



Concept:  
Probability

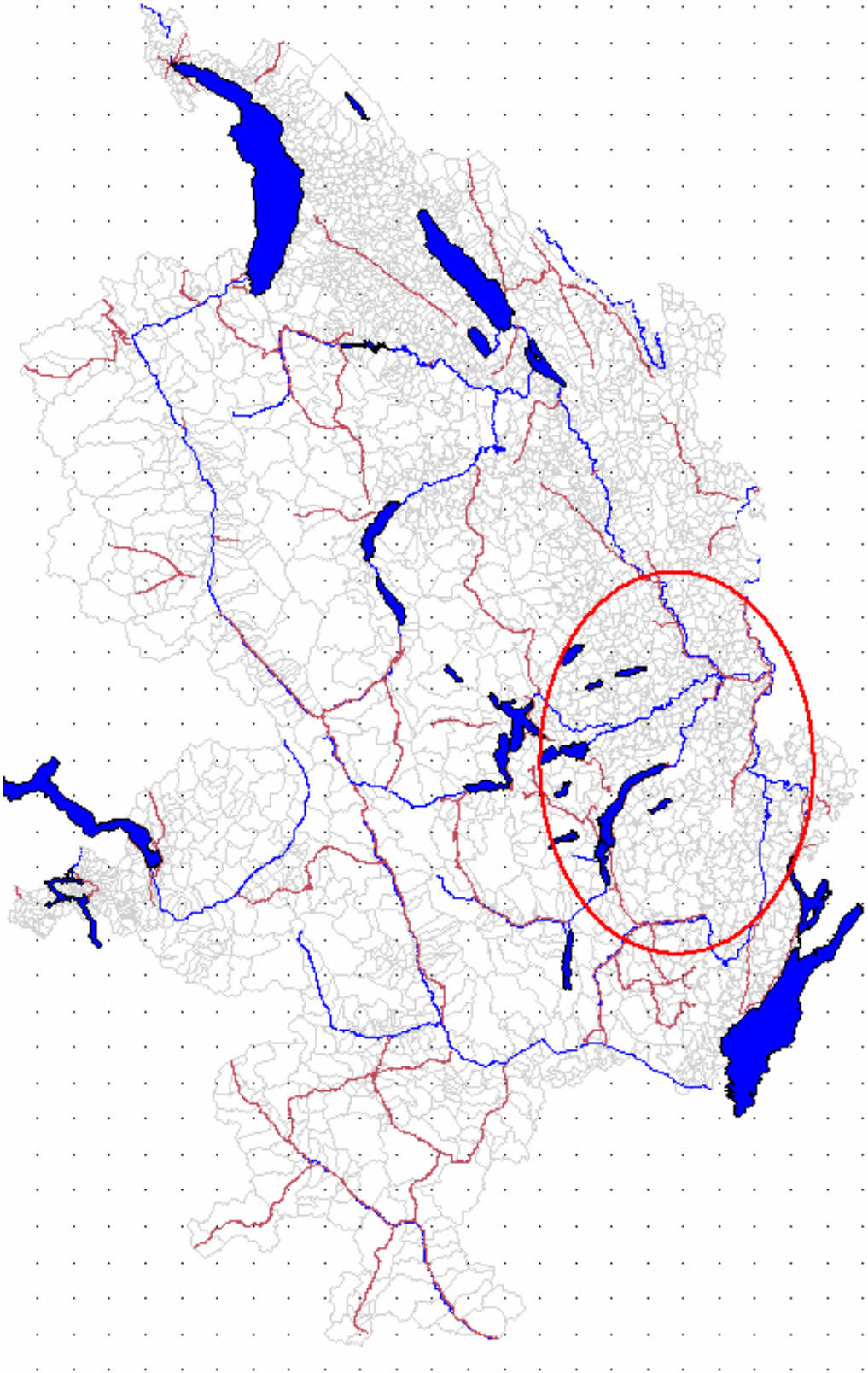
Smallest possible  
area of a true  
value of the  
population (i.e.  
activity locations)

Measure: Area

Shows dispersion /  
concentration

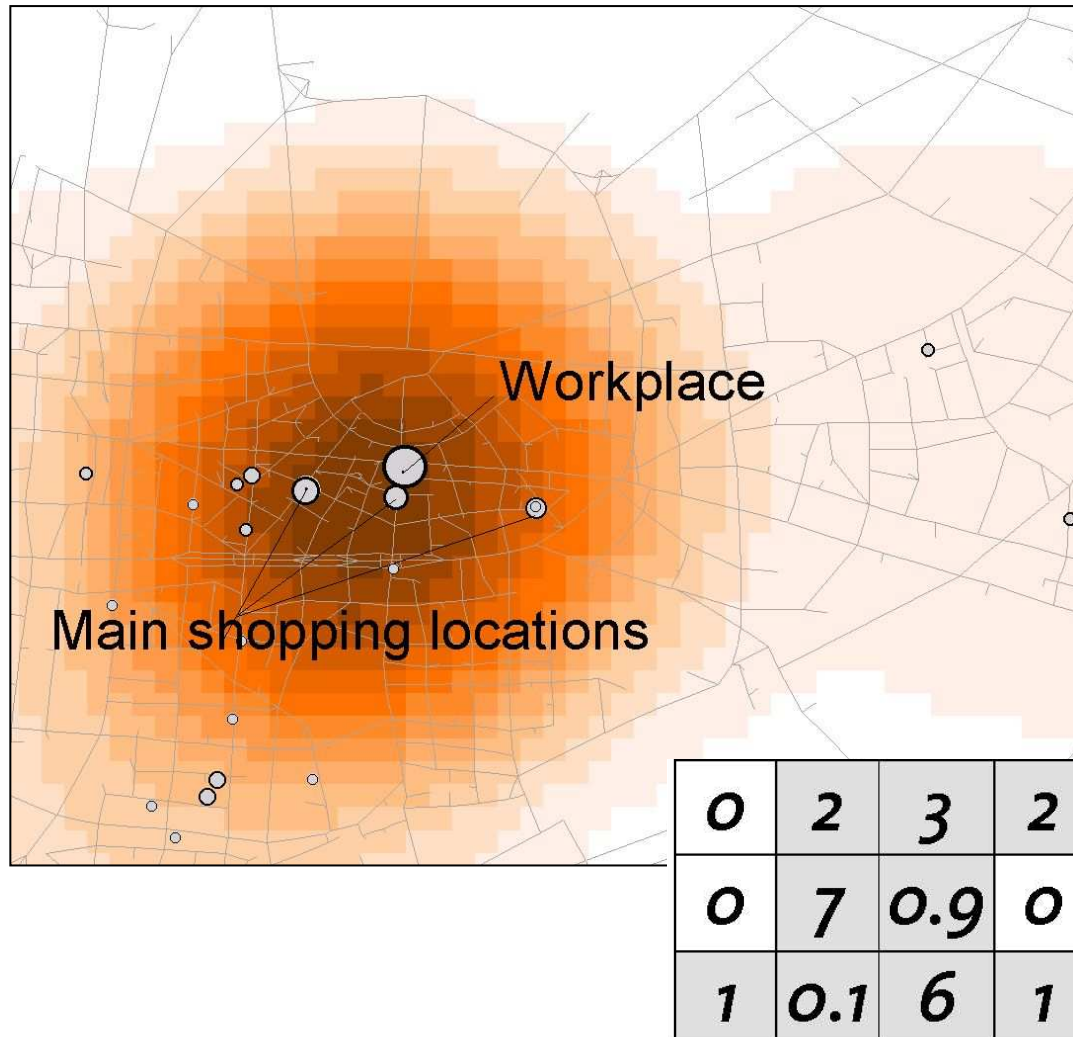
Example: Zürich commuters (2000)

---



## Approach 2: Kernel densities

---

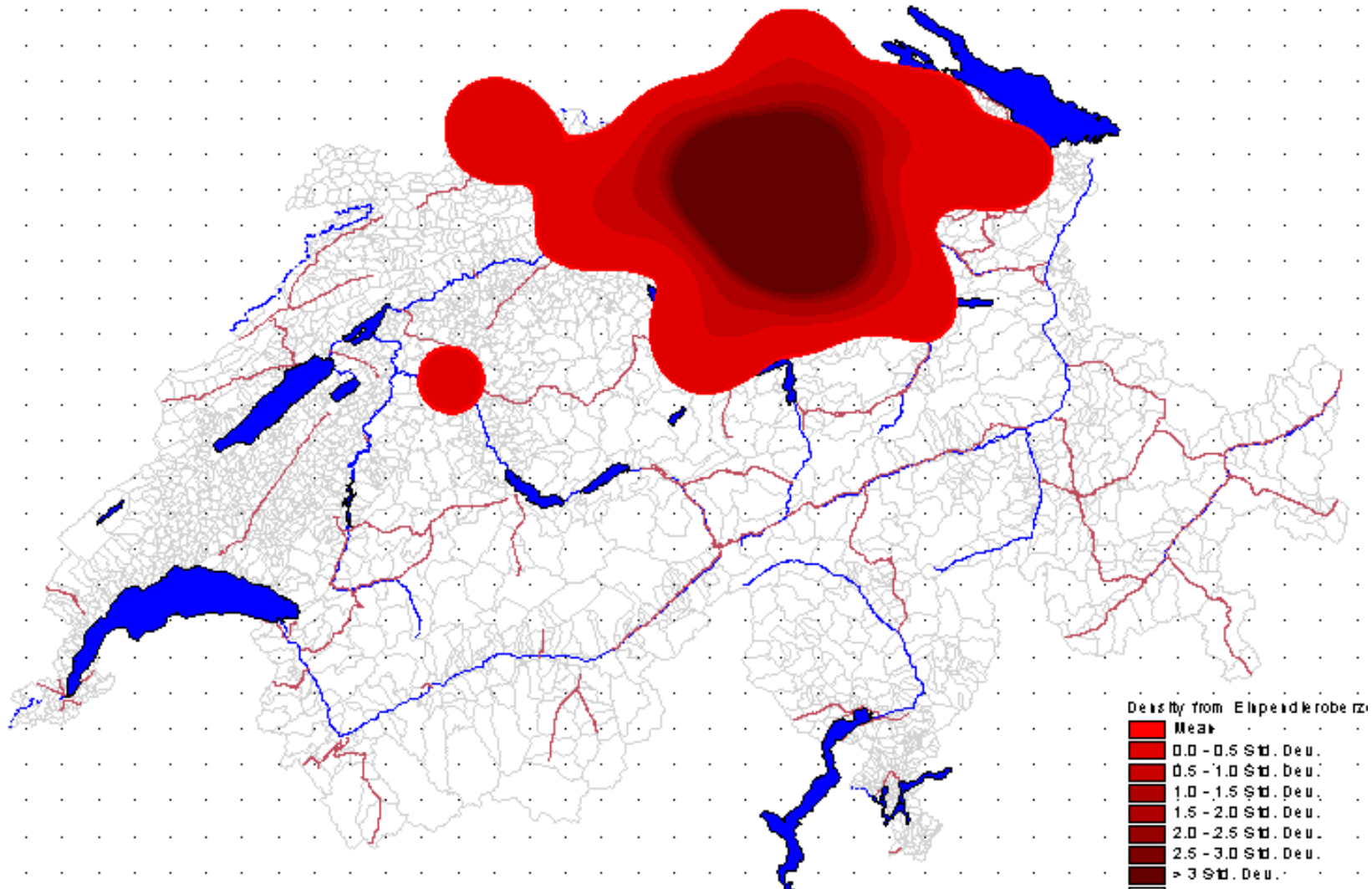


Density surface  
created by  
distribution of  
locations weighted  
by frequency of  
visit

Measure: Area with  
positive density  
value

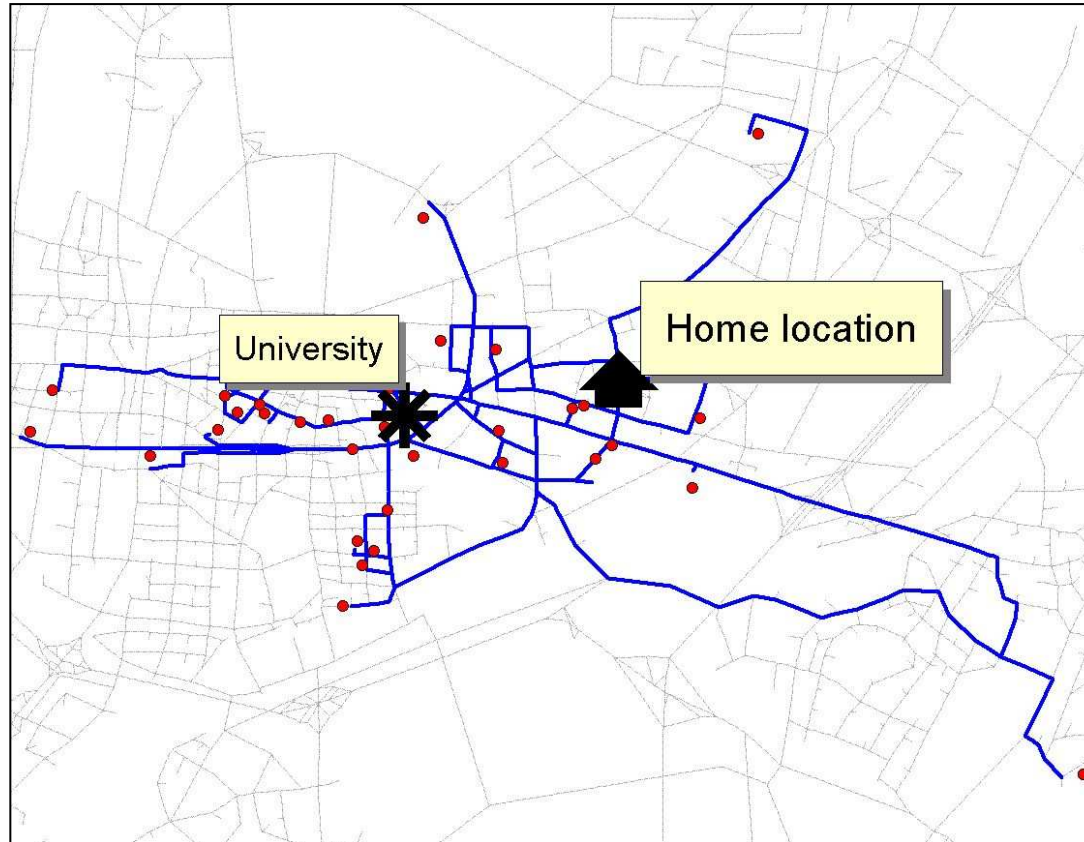
Focus: Clustering

# Example: Zürich's commuter shed 2000



## Approach 3: Shortest path network

---



Smallest geometry based on all O-D-relations observed (e.g. shortest paths)

Measure: Length of geometry / area spanned / buffered area

Focus: Spread of locations

# Obvious refinements

---

All:

- Segmentation by type of interaction; time period
- Appropriate weighting schemes (ln ?)

Confidence ellipse, Kernel densities:

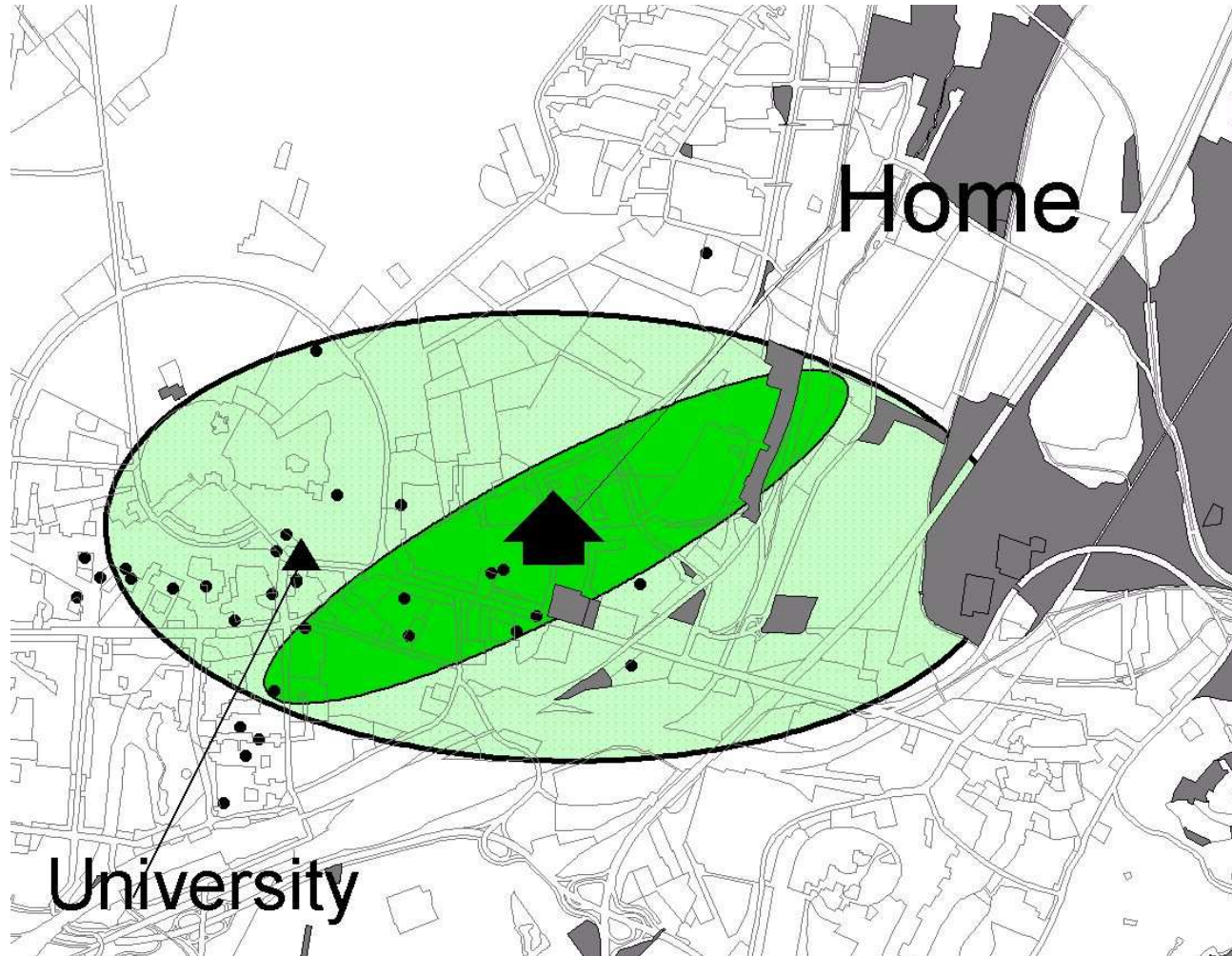
- Removal of a-priori excluded spaces

Shortest path networks:

- Use mode-specific networks
- Use stochastic assignment

# Refinement: Exclusion of excluded areas

---





## Additional information

---

### Confidence ellipse:

- Angle of the main axis relative to reference point
- Mean vector between point of interaction and base

### Kernel densities:

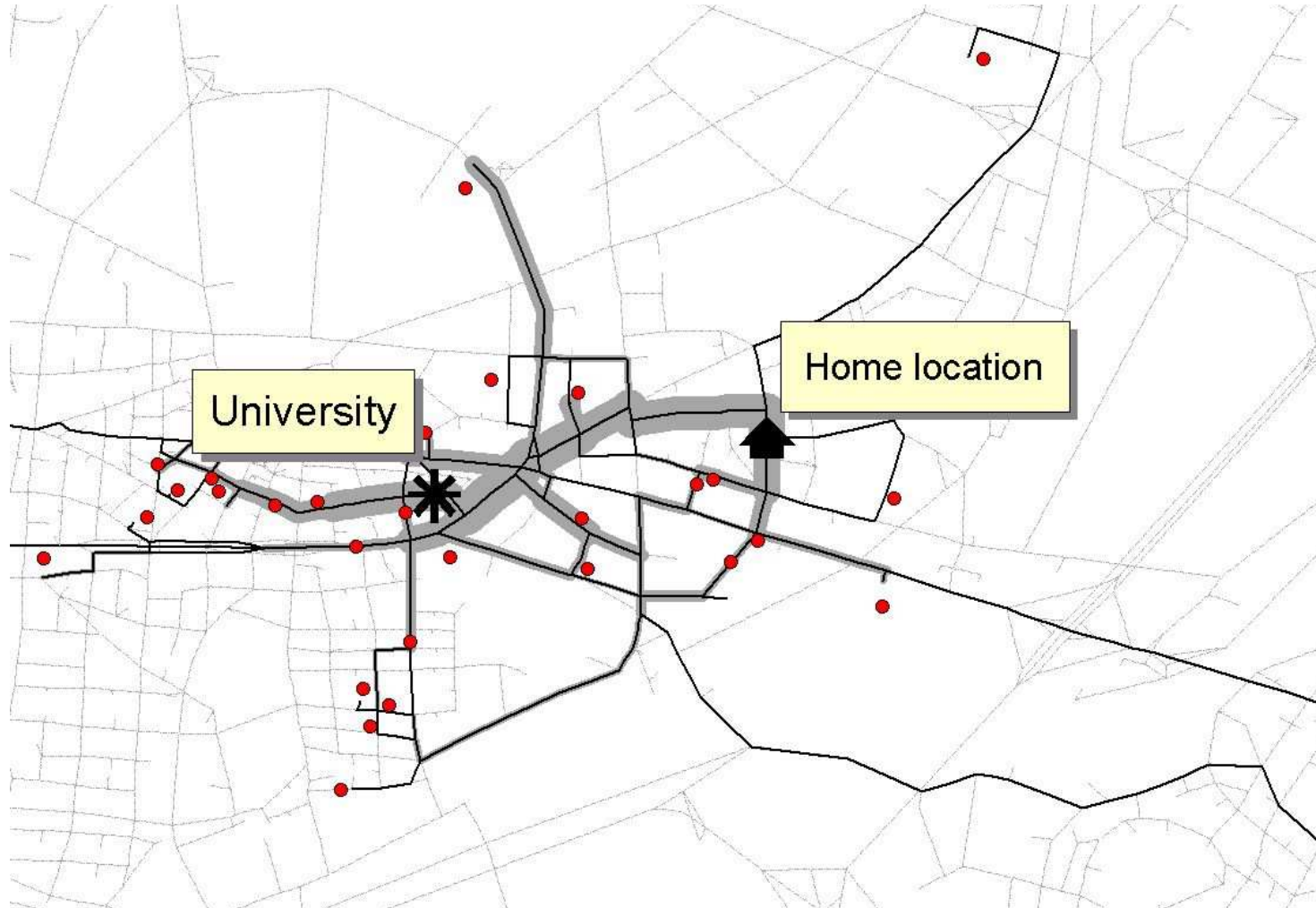
- Number of contiguous areas (clusters)

### Shortest path networks:

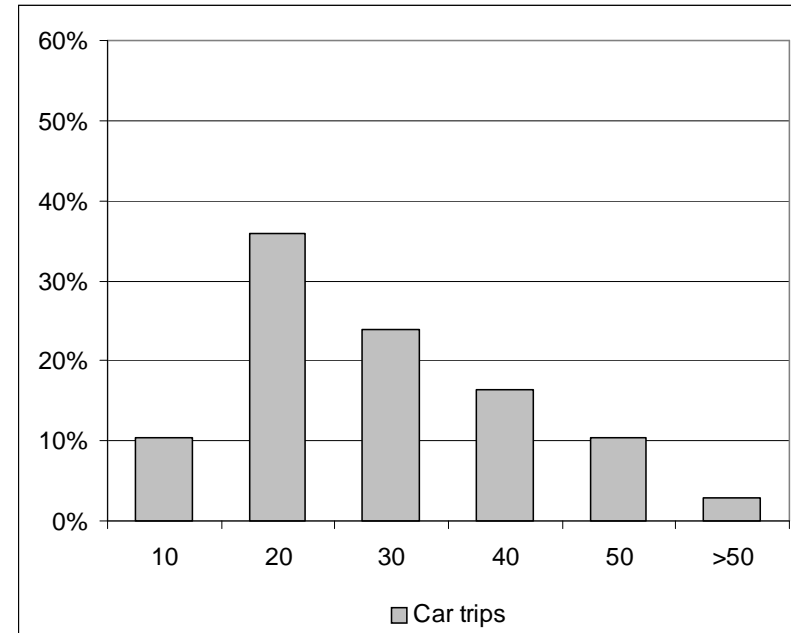
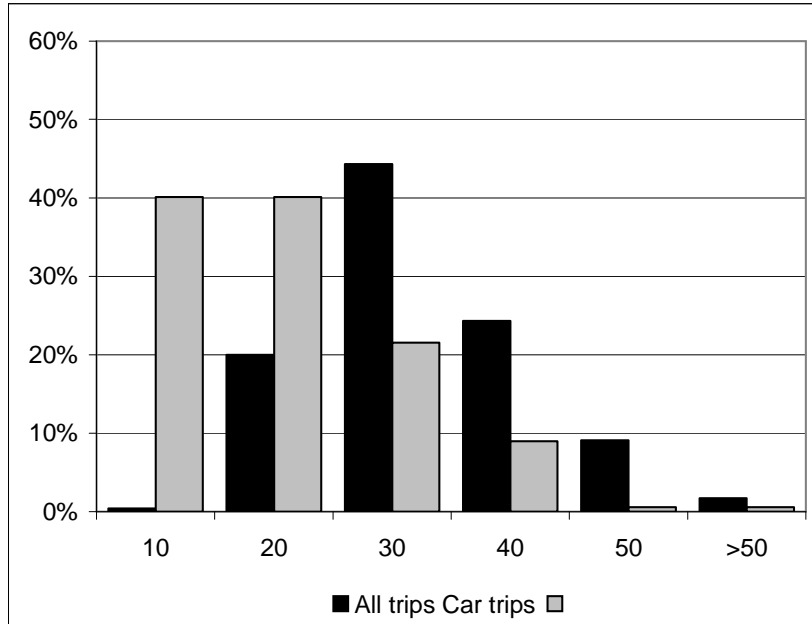
- All descriptive statistics for network graphs
- Flow estimates

# Additional information: Flow estimates

---



# Number of trips in 6 weeks

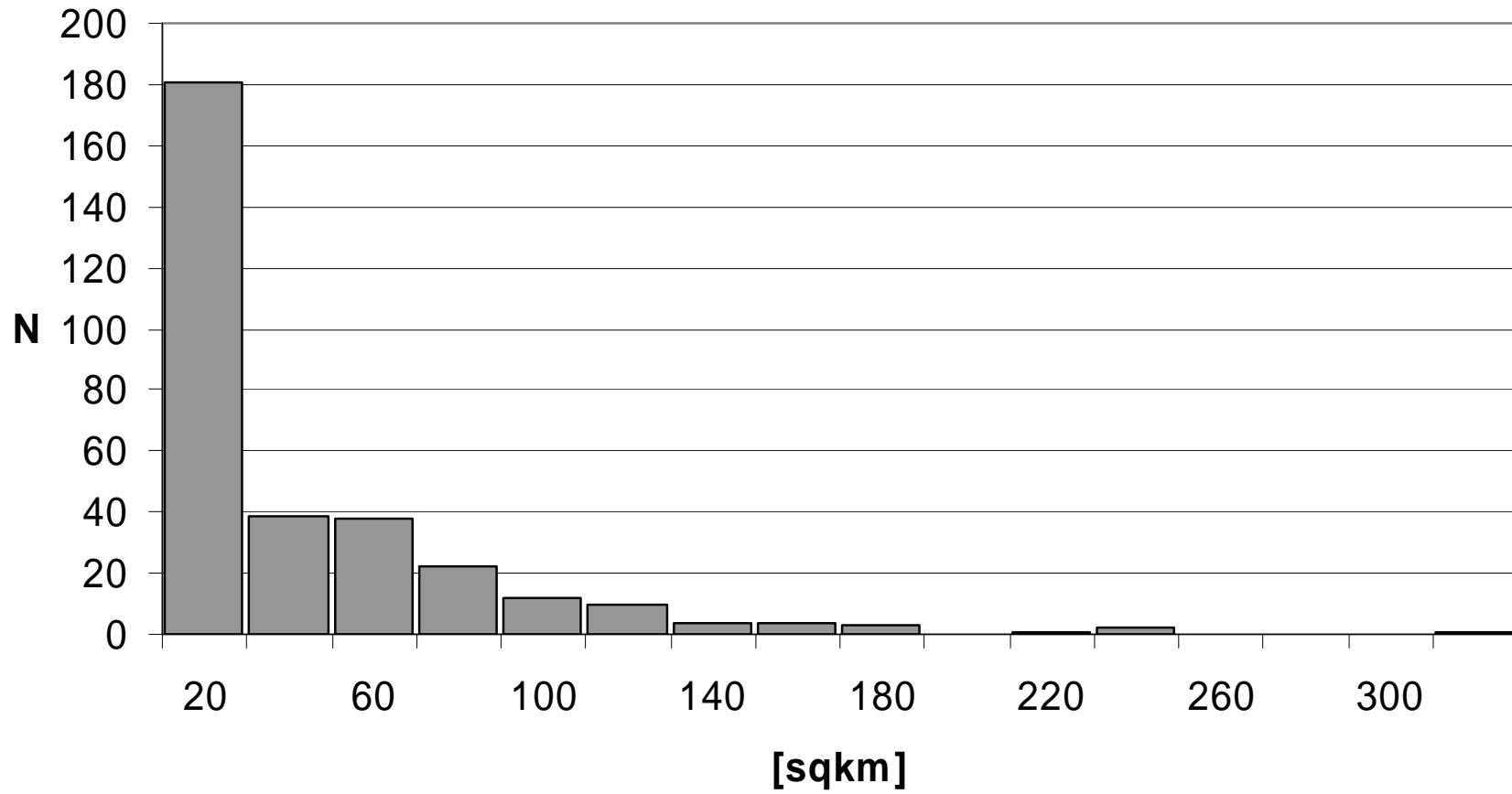


Mobidrive;  
All trips of respondents  
Car trips of "car users"

Borlänge GPS;  
Car trips of "car users"

# Mobidrive: 95% confidence ellipses

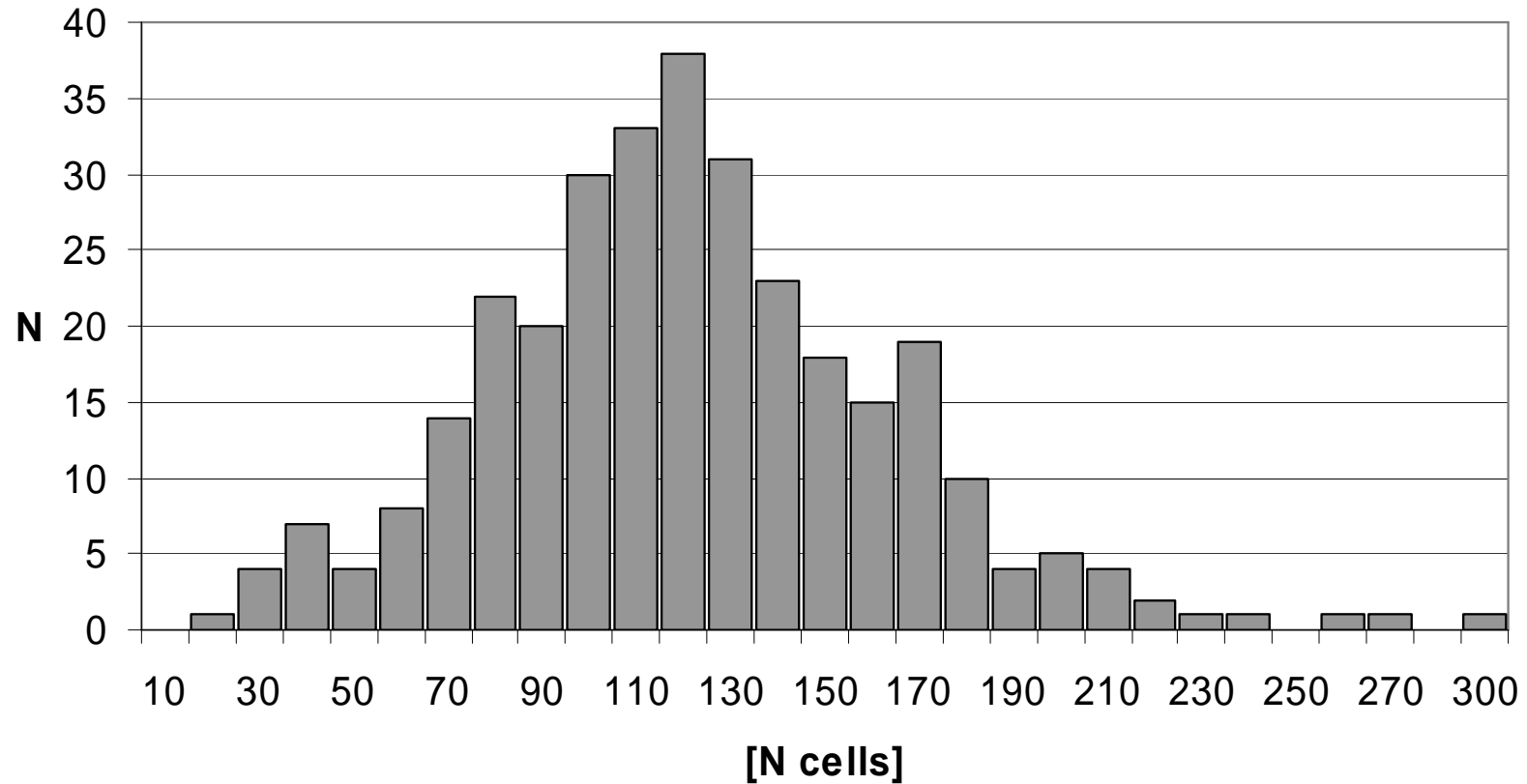
---



\* Local trips only

# Mobidrive: kernel density estimates

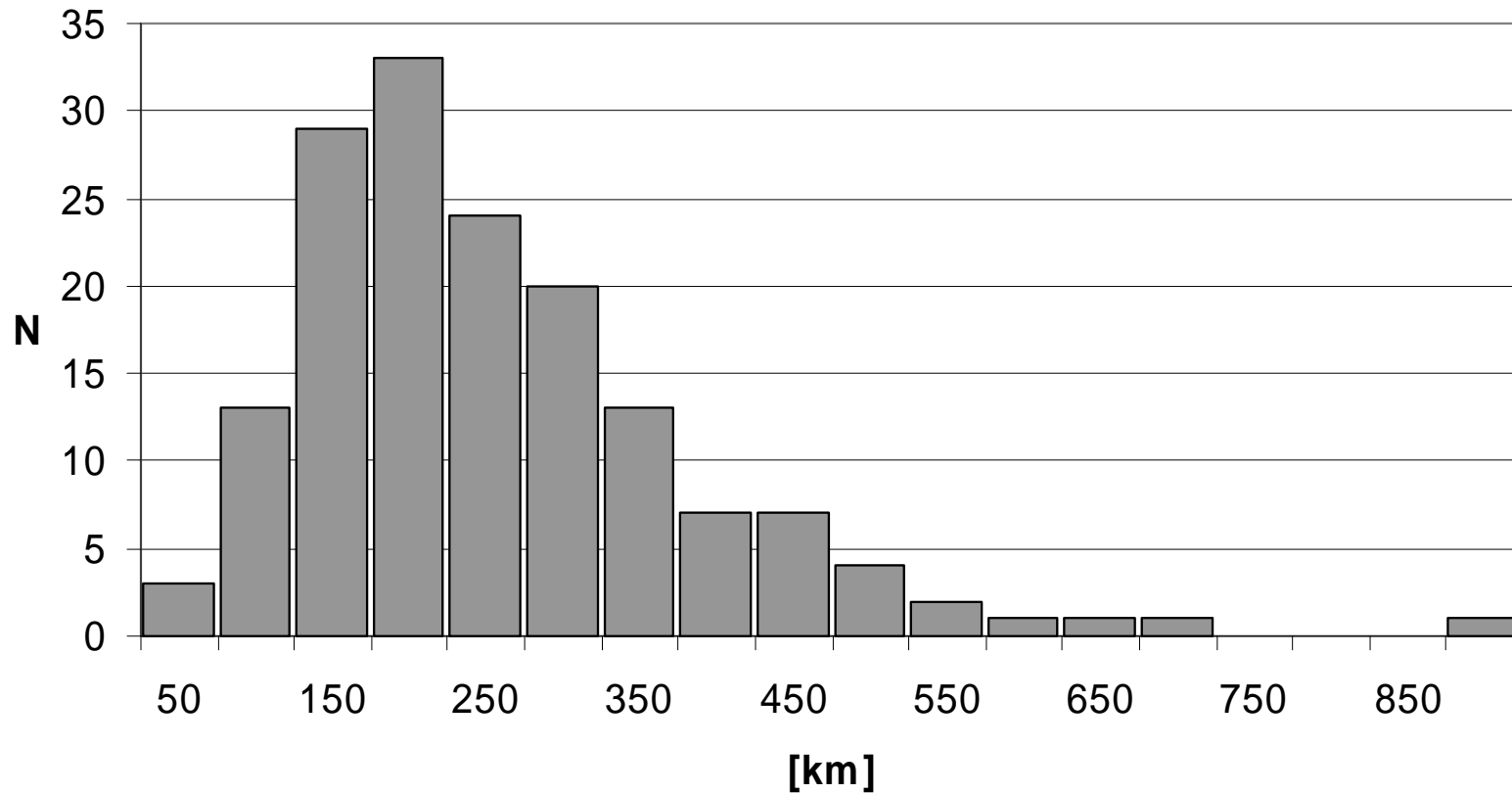
---



\* “Visited area”, grid cells with positive Kernel densities value [500\*500m]

# Mobidrive: shortest path networks

---



\* Minimum network based on observed O-D-relations

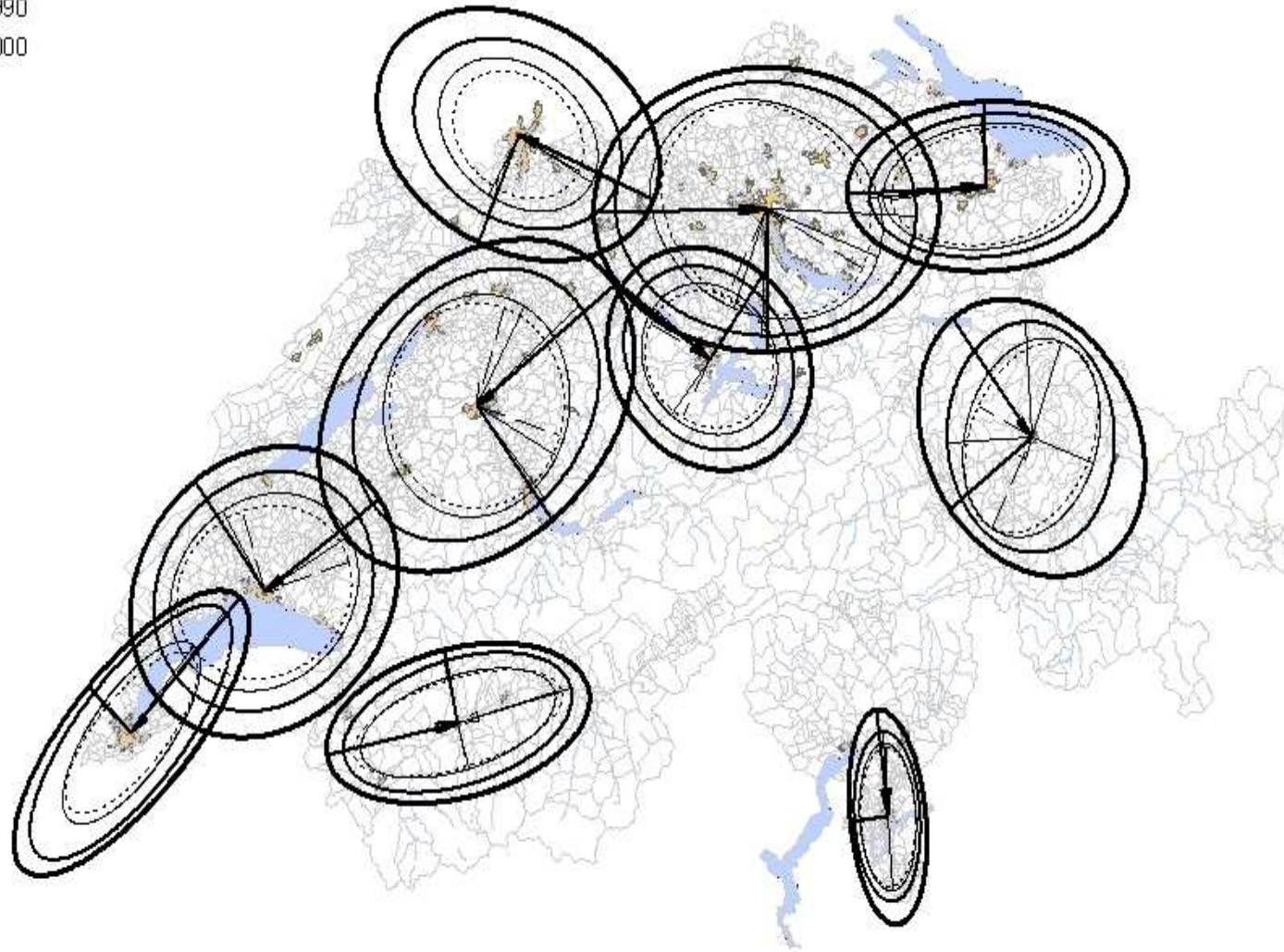
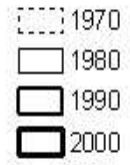
# Advantages and disadvantages

---

Approach	Plus	Minus
Confidence Ellipse	Simple Useful secondary measures	Too rigid Overestimate
Kernel density	Identification of clusters, Follows pattern	Complex calculation
Shortest path network	Travel impacts obvious	Large data needs

# An aside: Swiss commuter sheds

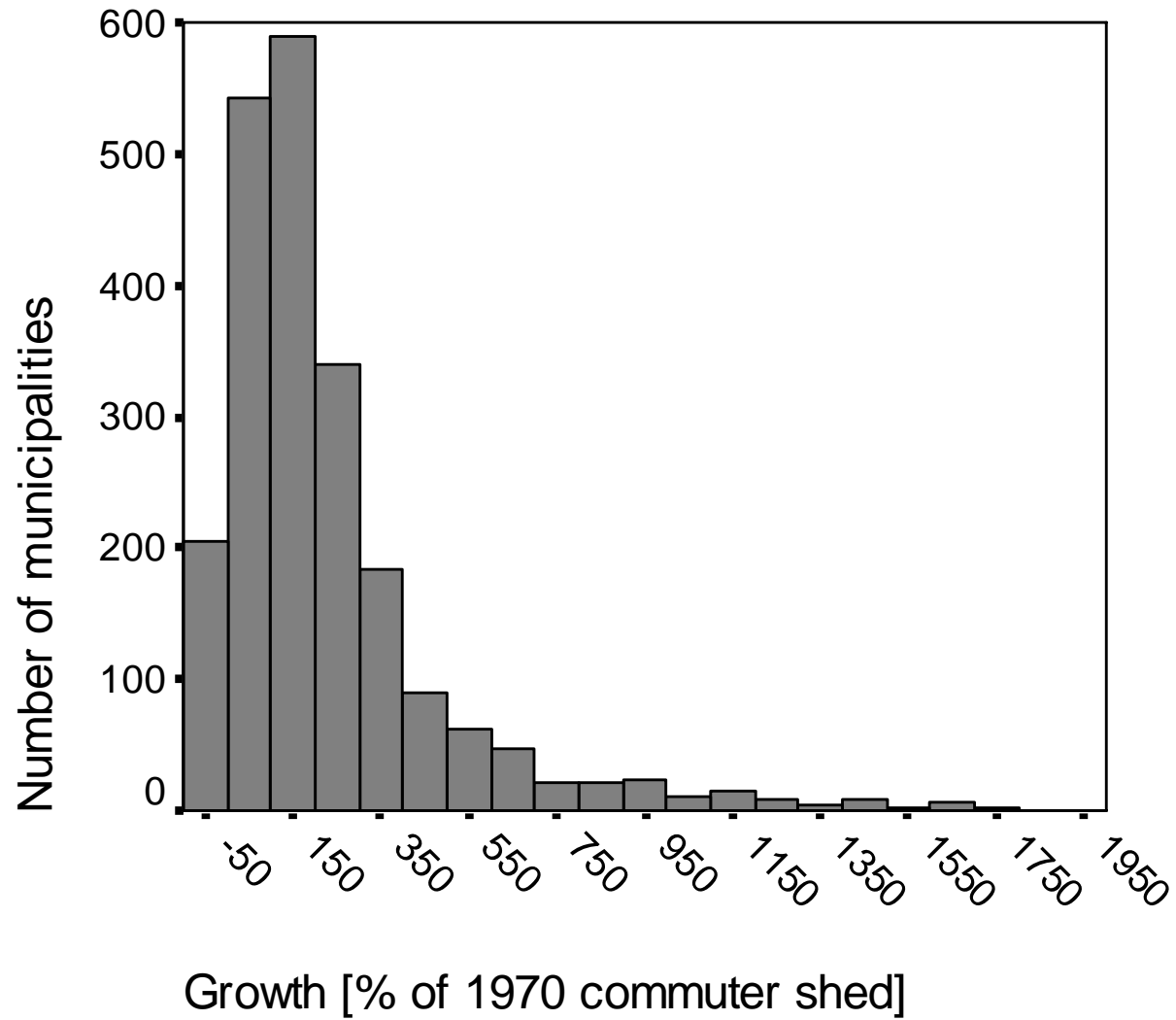
---





# Swiss commuter shed growth 1970 – 2000 (95% CE)

---



## Swiss commuter shed growth 1970 – 2000 (95% CE)

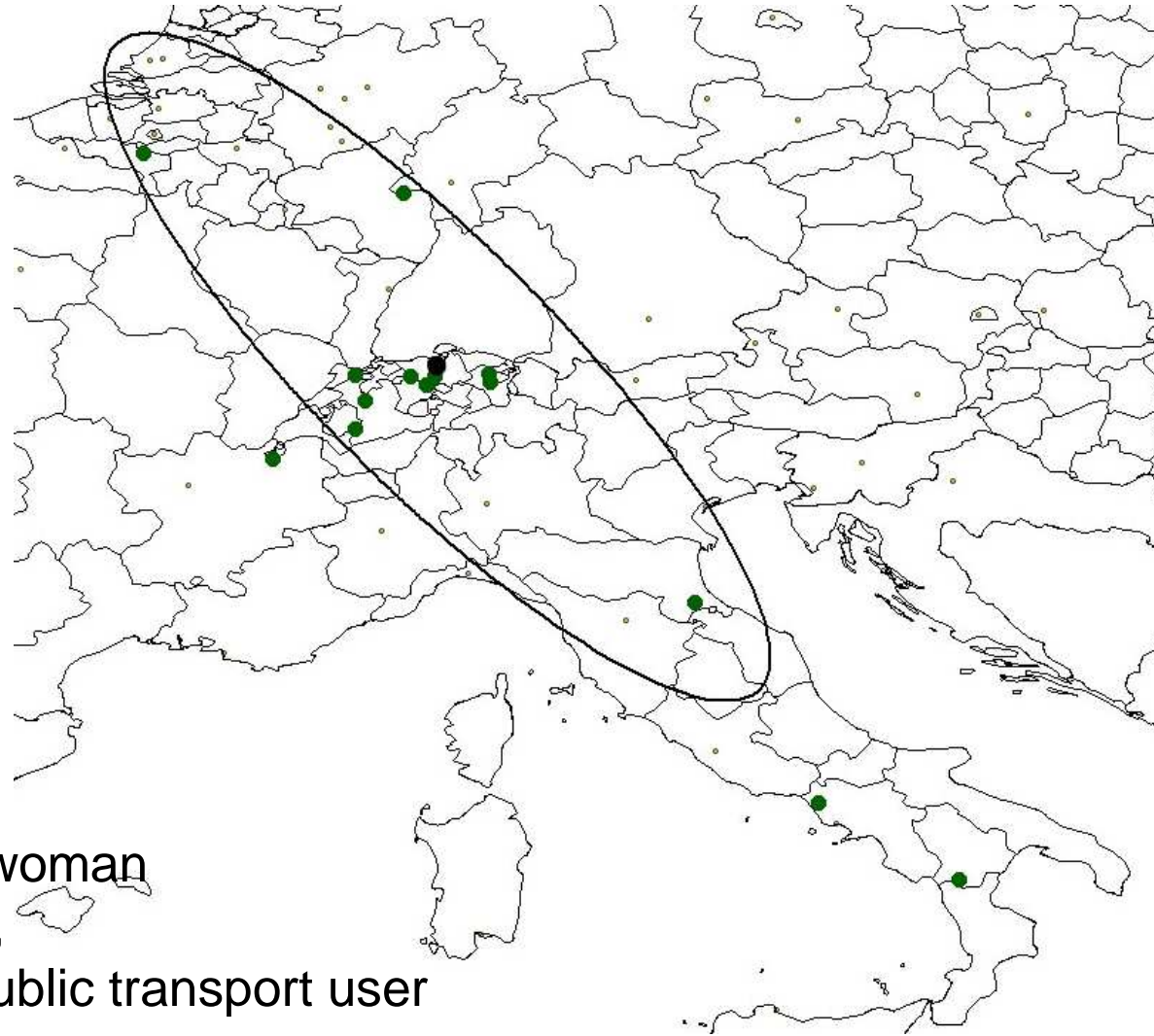
---

Type of municipality:

	Core	Secondary centre	First ring	Second ring
Mayor centre	160	207	371	243
Mid-sized centre	145		239	321
Small centre	141			
„Commuter“	300			
Industrial	298			
Semi-rural	391			
Rural	450			

## An aside: A social network geograpy - friends

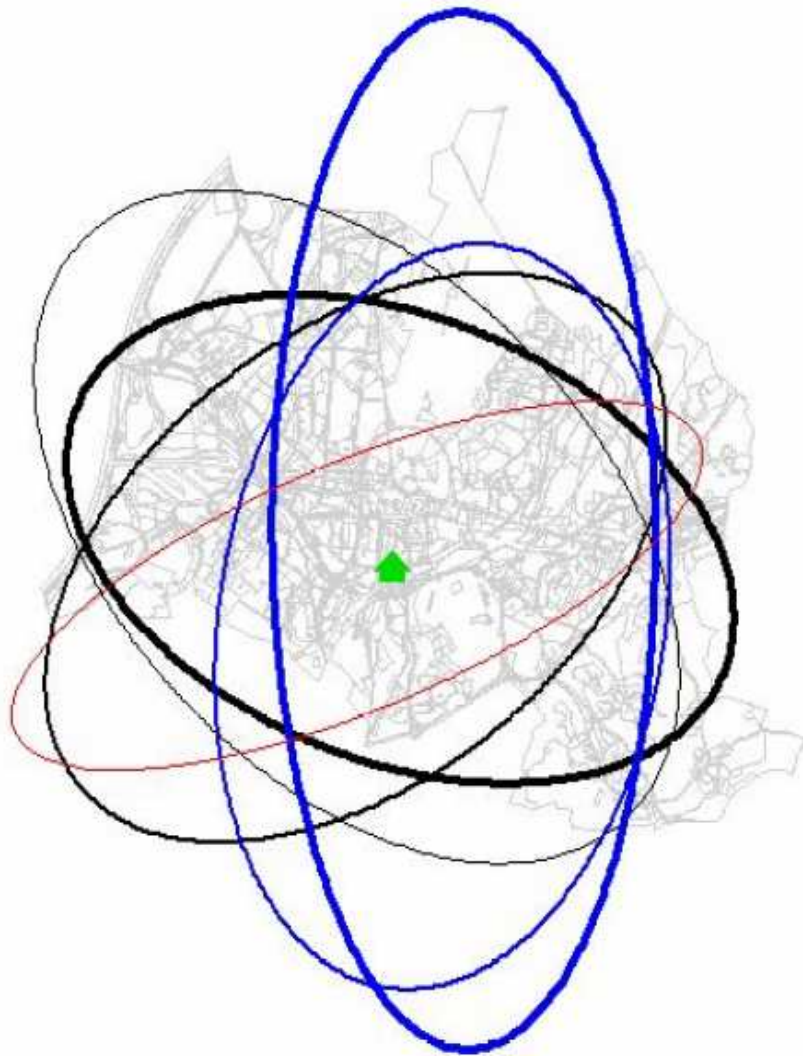
---



28 year woman  
5 moves,  
Mostly public transport user

# Variance of activity spaces: A Mobidrive example

---



Male, Full time

Black: Working days

Blue: Weekend

Line width:

Weeks 1+2; 3+4 and 5+6

## Variance of activity spaces over time

Correlation coefficient		Last period		
		Trips	Places	95% CE
This period				
Trips	Borlänge	0.71		
	Copenhagen	0.66		
Places	Borlänge		0.62	
	Copenhagen.		0.62	
95% CE	Borlänge			0.62
	Copenhagen			0.52
N periods	Borlänge	849	849	849
	Copenhagen	252	252	252

# Number of unique locations

---

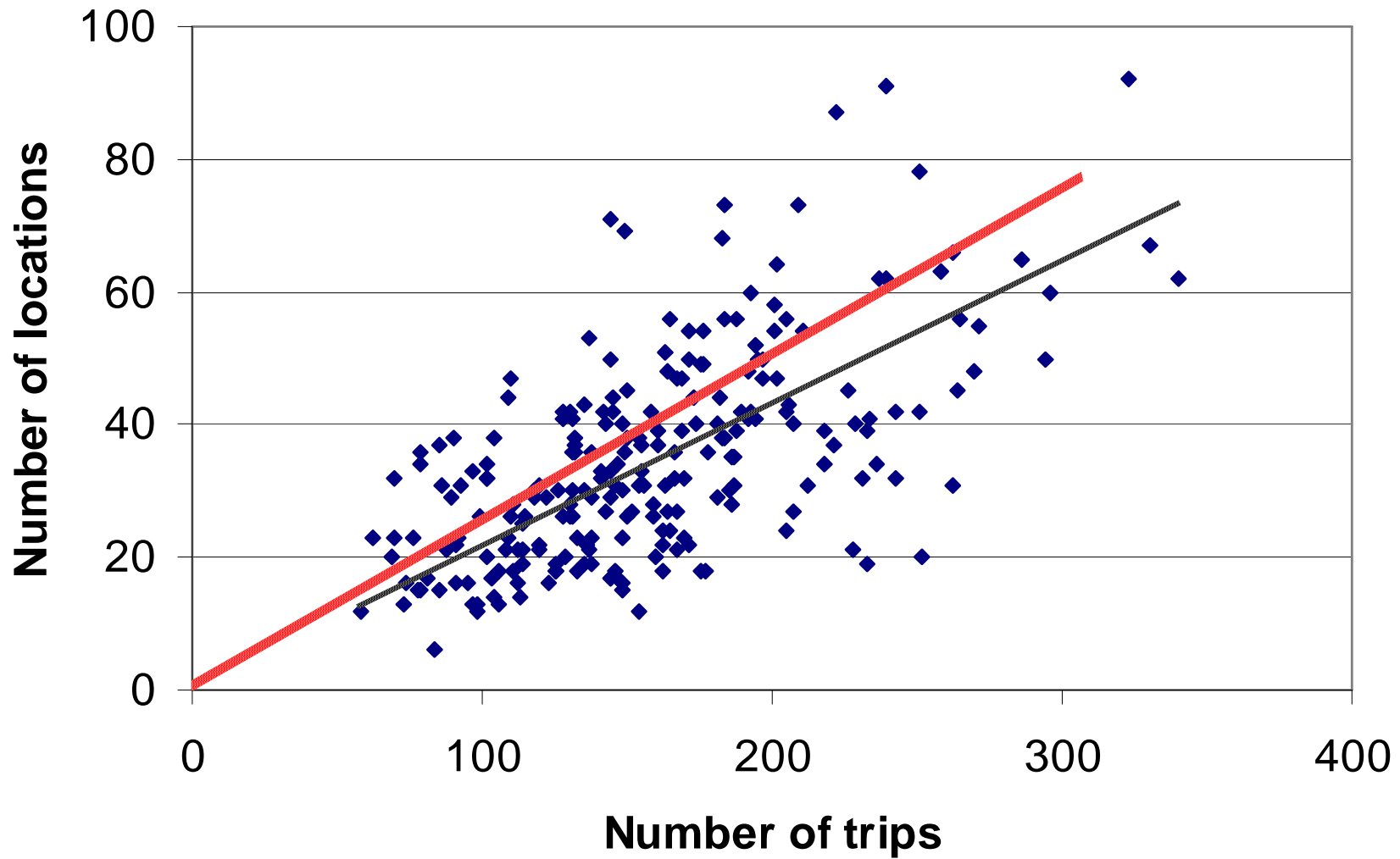
“Unique location” is defined as a combination of

- Address (street address, zip code, municipality code etc.)
- Activity purpose

Systematic problem of GPS – data:

- How to “summarise” varying parking positions to a single location?

# Locations as function of number of trips (Thurgau 2003)



## Number of places as function of number of trips

---

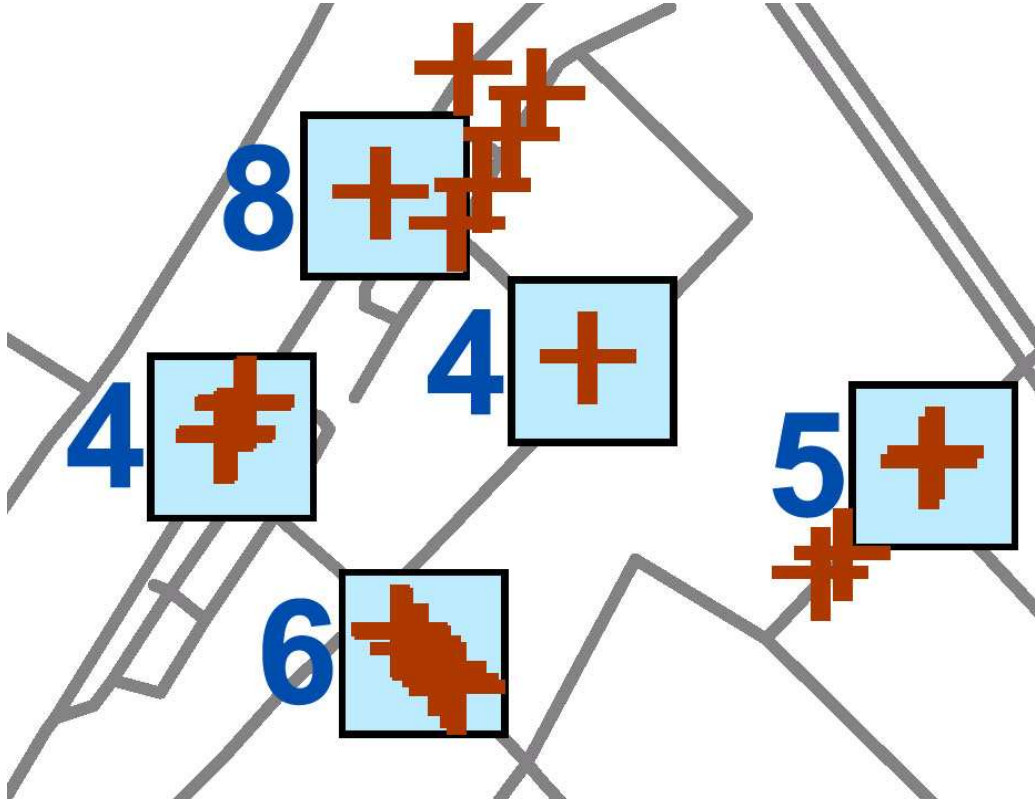
	Slope		R <sup>2</sup>
<i>Mobidrive</i>	All	0.18	0.47
	Car drivers	0.22	0,71
Thurgau	All	0.22	0.37
	Car drivers	0.25	0.73
Uppsala	All	0.22	0.40
	Car drivers	0.25	0.75
Copenhagen	Car drivers	0.28	0.51
Borlänge	Car drivers	0.13	0.39



# Issue: Clustering GPS points into locations

---

Schönfelder and Samaga, 2003



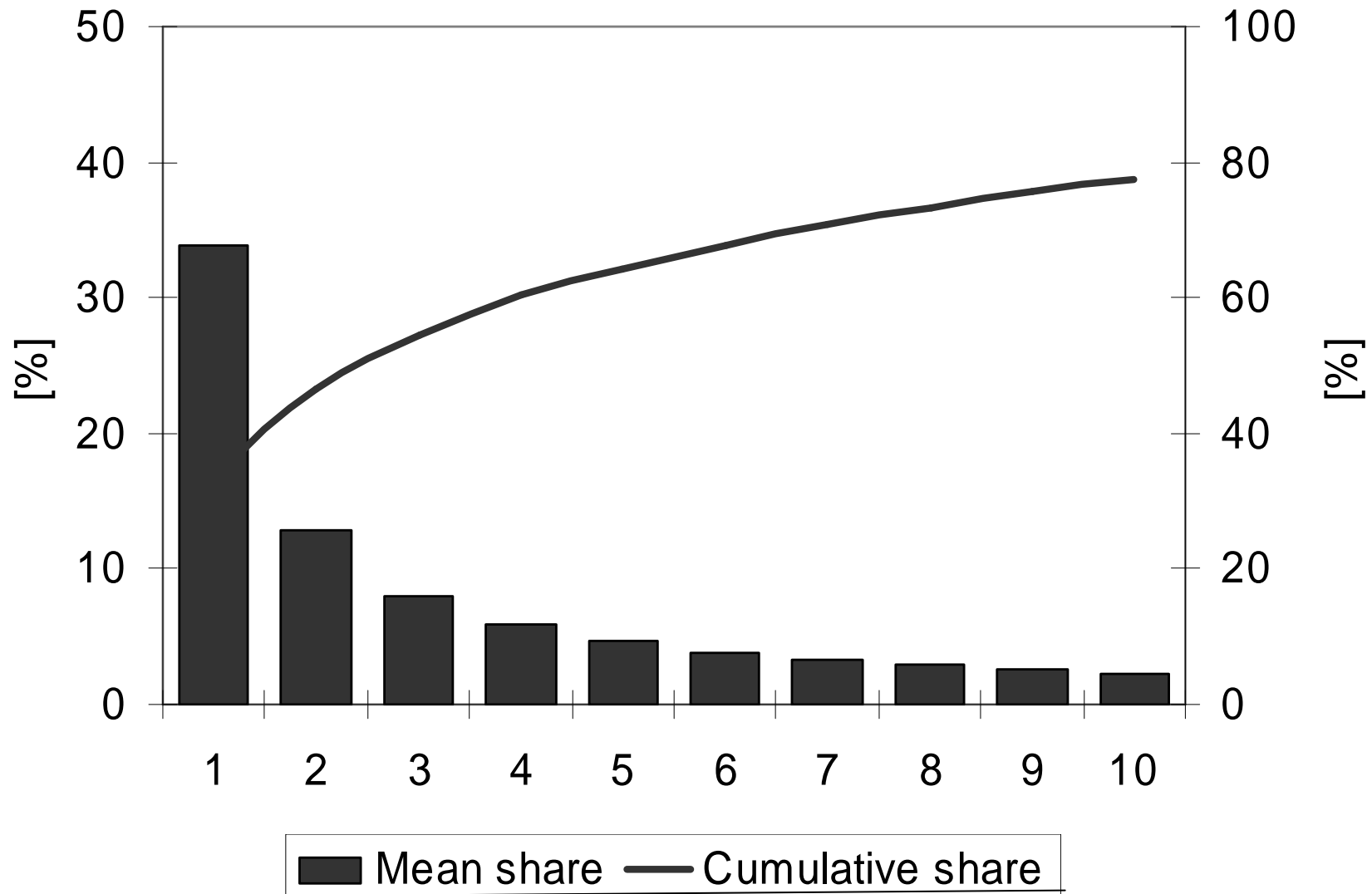
# Structure of activity spaces

---

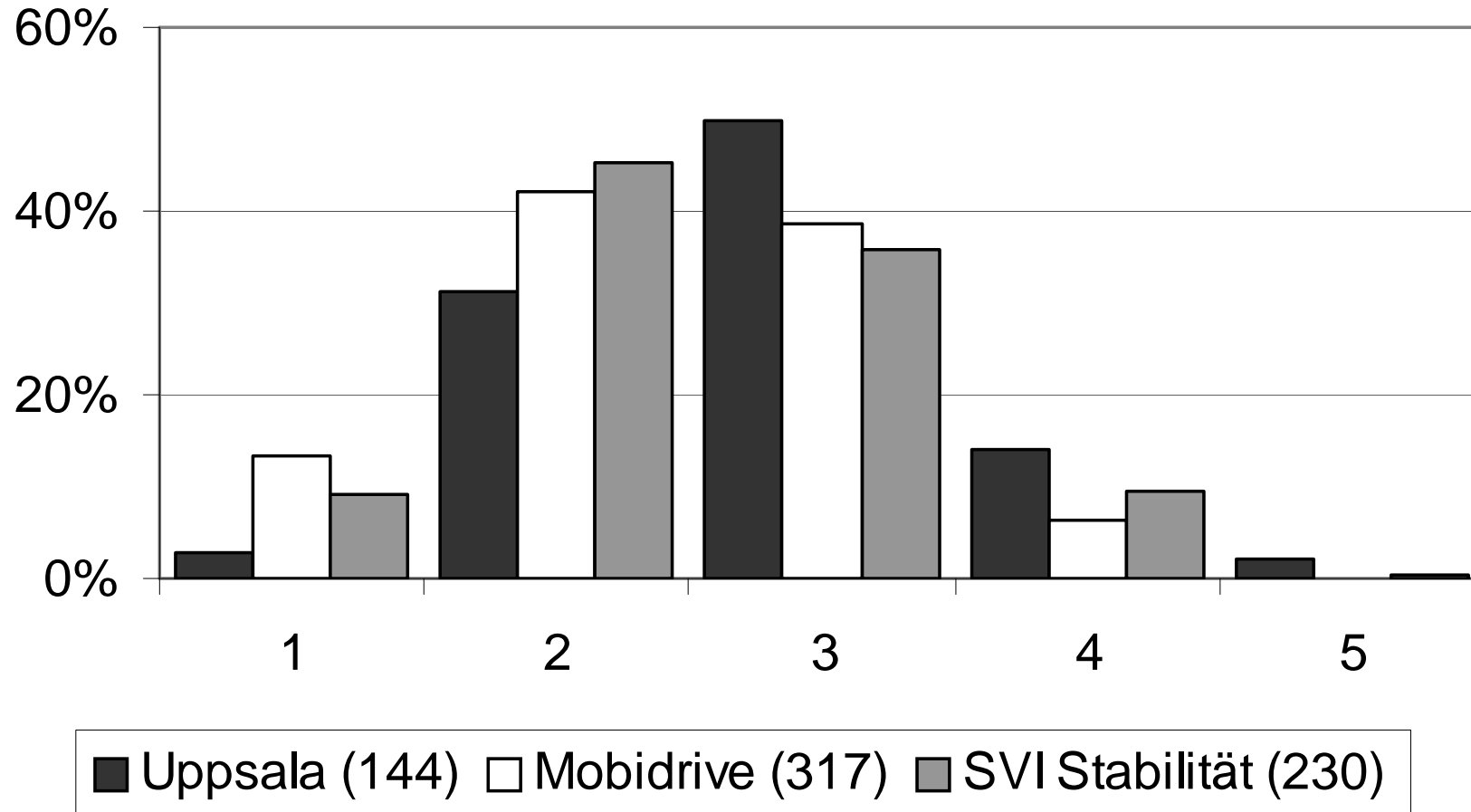
Criteria:

- Share of trips to most visited locations
- Cluster

# Share of most important destinations (Mobidrive)

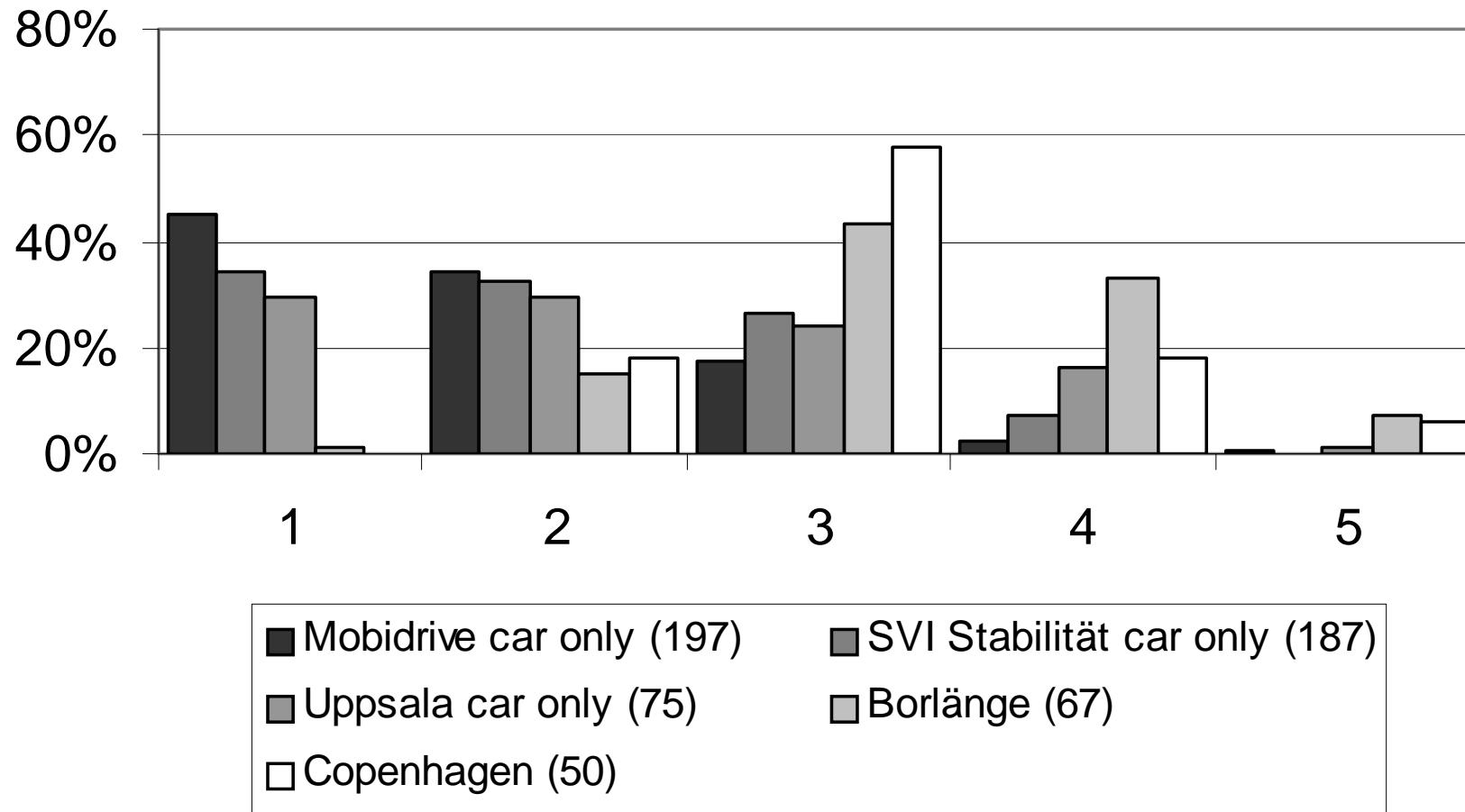


## Distribution of activity clusters – number (All trips)



Cluster: 1 km radius; minimum 3 unique locations and 10% of all trips

## Distribution of activity clusters – number (car drivers)



Cluster: 1 km radius; 3 unique locations and 10% of all car trips

## Centre of clusters: Activity purposes

---

Purpose	Mobi		Thurgau		Uppsala	
	All	Fulltime	All	Fulltime	All	Fulltime
Home	55	57	43	42	44	44
Leisure	12	11	14	10	12	12
Work	11	24	15	22	18	25
School	8	1	8	11	0	1
Grocery	6	4	9	5	19	12
Private business	5	0	3	1	2	1
Long-term shopping	1	1	0	1	1	0
Pick/Drop	1	1	4	4	2	3
Work related	1	0	4	4	0	0
Other	0	1	0	0	2	2

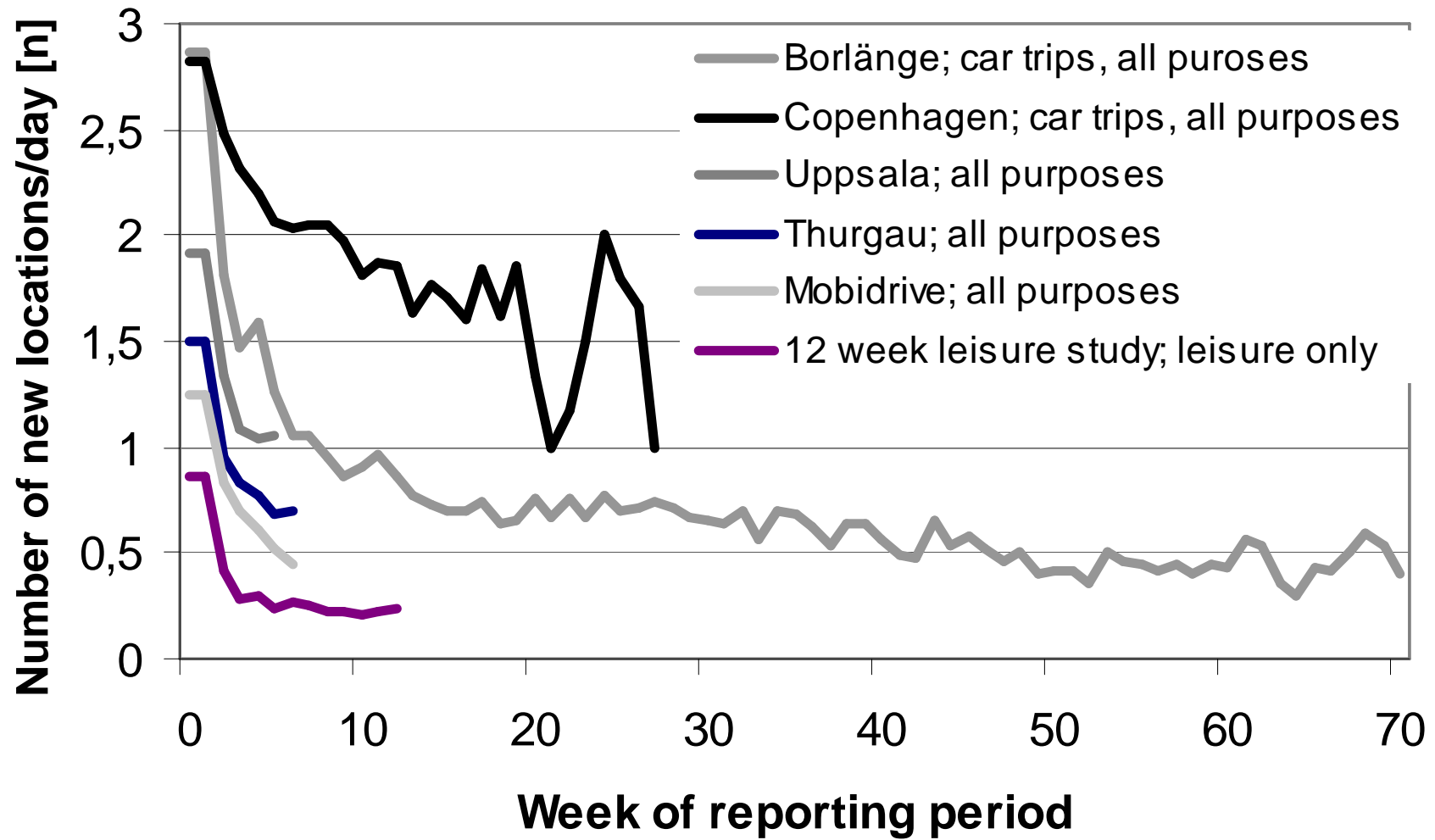
# Innovation in destination choice

---

Two types of observation:

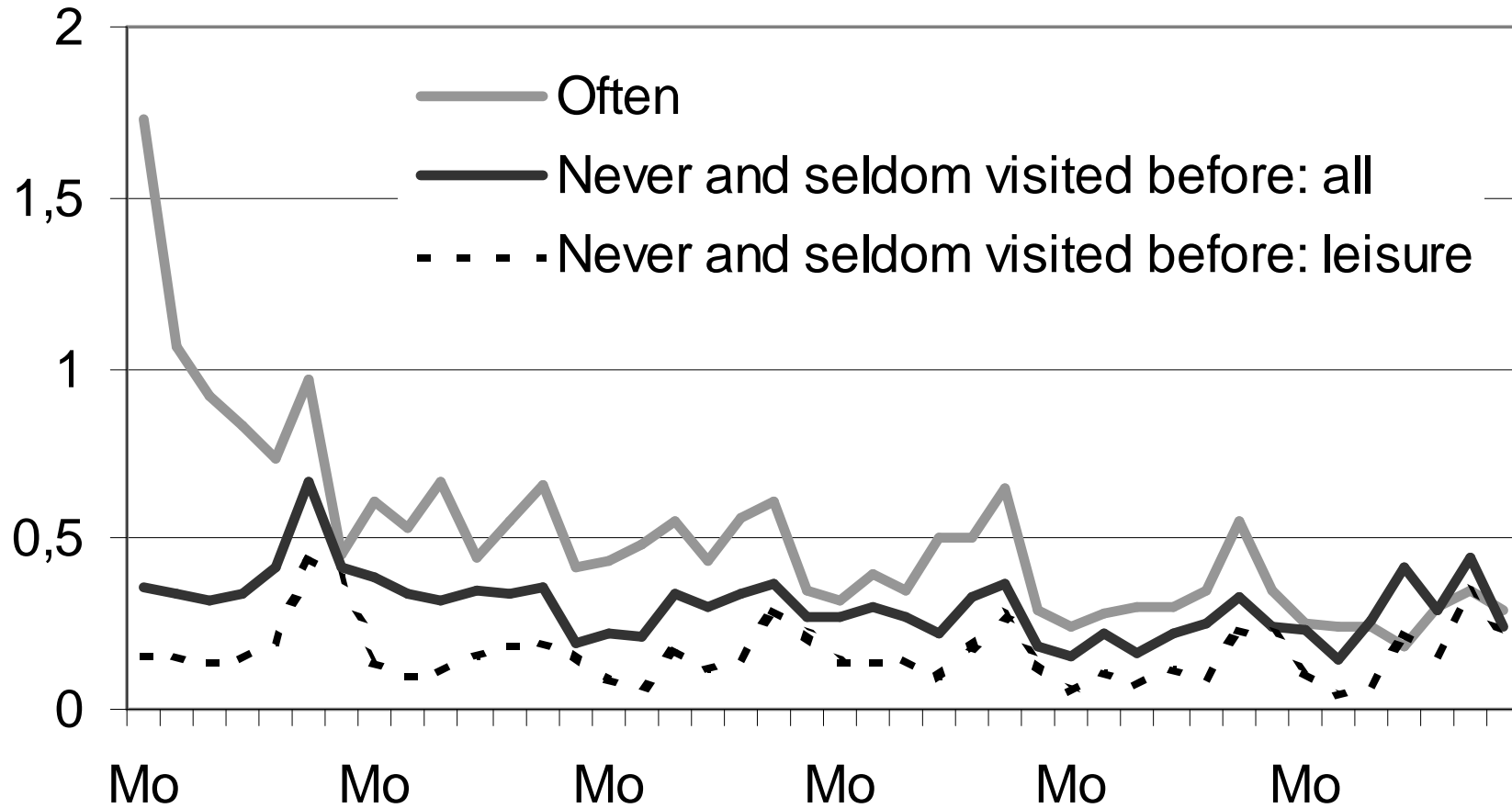
- “New” locations over the reporting / monitoring period
- Locations visited for the first time

# “New” locations





# Places visited for the first time (Thurgau 2003)



First time or never before less than 4 visits  
Often: 4 to 10 visits

# Summary

---

- Activity spaces are measurable
- The relationship between number of trips and number of unique locations seems constant
- Activity space has a structure with few clusters
- The “rate of innovation” is constant
- The size of activity spaces is temporarily not or only partly stable

# Measurement issues

---

- Are these the best measures ?
- What refinements are needed ?

# Empirical issues

---

- Are the finding really robust ?
- Are there „scaling laws“ ?
- Are there links between the distributions and the characteristics of the area ?
- Weak link between activity space size and socio-demographics
- Weak link between activity generation and socio-demographics

# Modelling challenges

---

## Static (agent-based) models:

- Definition of choice set for location choice (see route choice)
- Cope with innovation and clustering
- Less emphasis on work as a behavioural „peg“

## Dynamic (agent-based) models:

- Maintain link between number of locations and trips
- Reproduce the dynamics of the activity space
- Reproduce innovation rates

# Literature

---

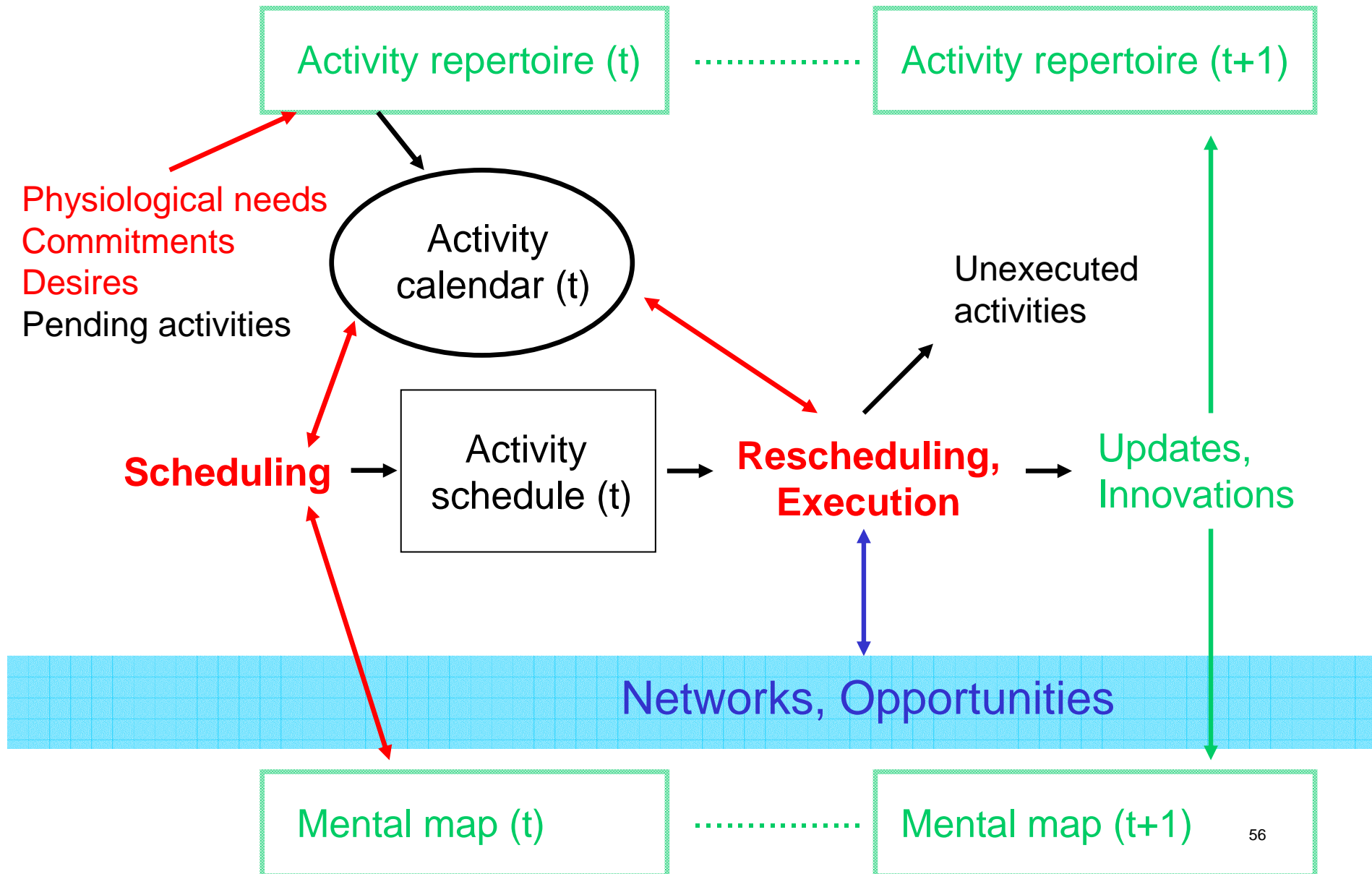
- Botte, M. (2003) Strukturen des Pendelns in der Schweiz, Diplomarbeit, Fakultät für Bauingenieurwesen, TU Dresden, August 2003.
- Ohnmacht, T. (2004) Soziale Netze und persönliche Mobilität: Grundlagen für eine empirische Erhebung, *Arbeitsbericht Verkehrs- und Raumplanung*, **250**, IVT, ETH Zürich, Zürich.
- Schönfelder, S. and K.W. Axhausen (2004) Structure and innovation of human activity spaces, *Arbeitsberichte Verkehrs- und Raumplanung*, **258**, IVT, ETH Zürich, Zürich.
- Schönfelder, S. and K.W. Axhausen (2003) On the variability of human activity spaces, in M. Koll-Schretzenmayr, M. Keiner und G. Nussbaumer (eds.) *The Real and Virtual Worlds of Spatial Planning*, 237-262, Springer, Heidelberg.
- Schönfelder, S. and U. Samaga (2003) Where do you want to go today? - More observations on daily mobility, Presentation at STRC 2003, Ascona, March 2003.

# Literature

---

Srivastava G. und S. Schönfelder (2003) On the temporal variation of human activity spaces, *Arbeitsberichte Verkehr- und Raumplanung*, **196**, Institut für Verkehrsplanung und Transportsysteme (IVT), ETH Zürich, Zürich.

# Position: Personal daily dynamics





# Position: Personal long-term dynamics

