

# Preferred citation style

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Axhausen, K.W. (2007) Spatial patterns of social networks and social contacts, *Kolloquium Geographische Informationswissenschaft*, Universität Zürich, Zürich, April 2008.

# Spatial patterns of social networks and social contacts

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# Acknowledgments

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## Collaborators:

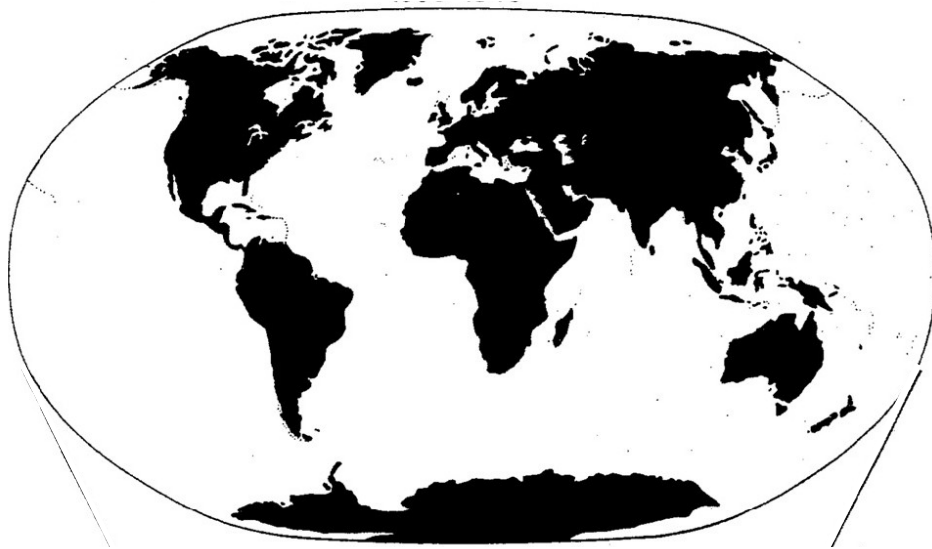
- Andreas Frei, ETH Zürich
- Timo Ohnmacht, HSW Luzern
  
- Jonas Larsen and John Urry, Lancaster University

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# A shrinking world

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Coach and sailing boat until  
1840



Steam ship and locomotive, 1840 - 1930

Propeller aircraft, 1930-1950

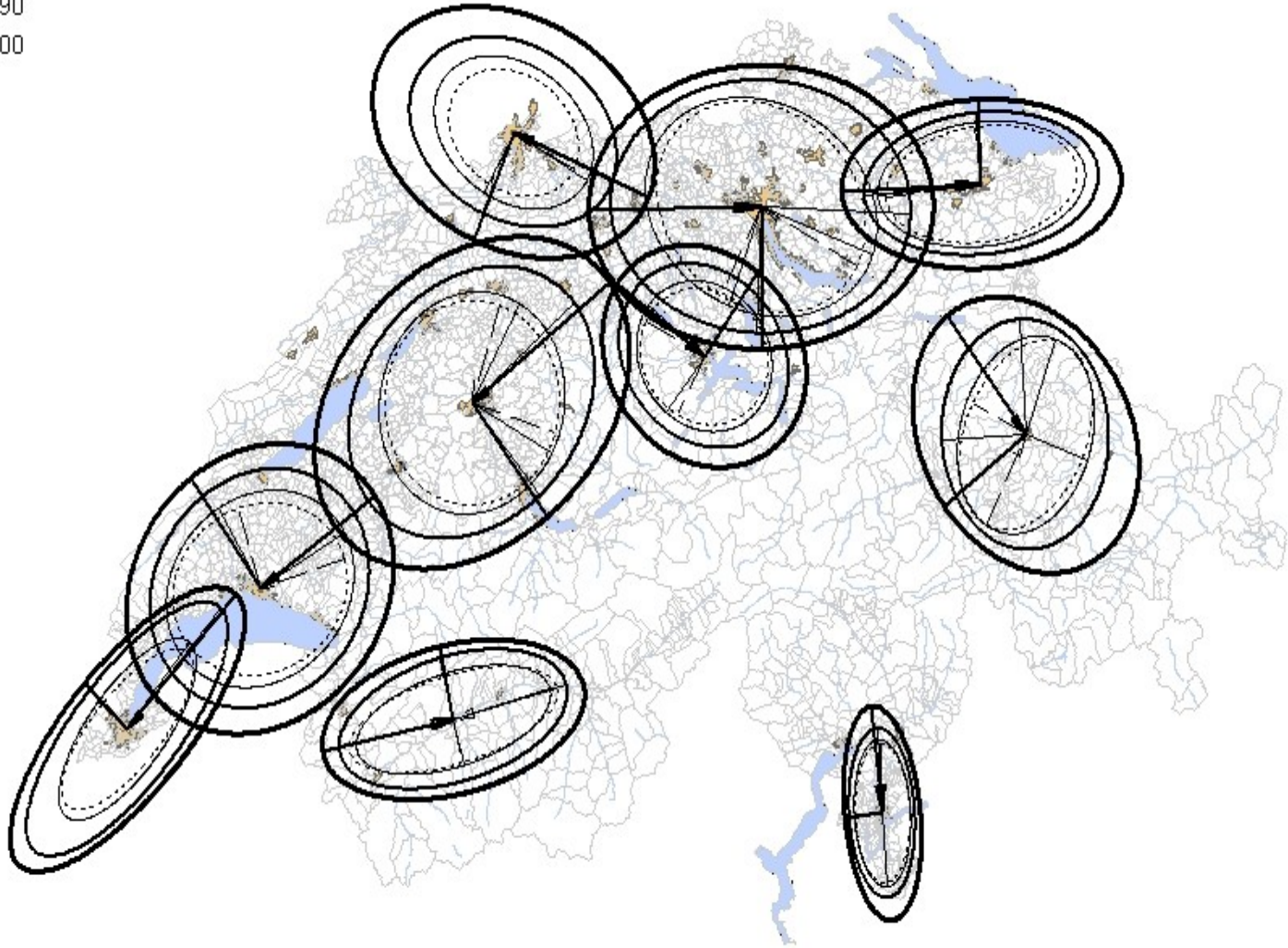


Jets, from 1950



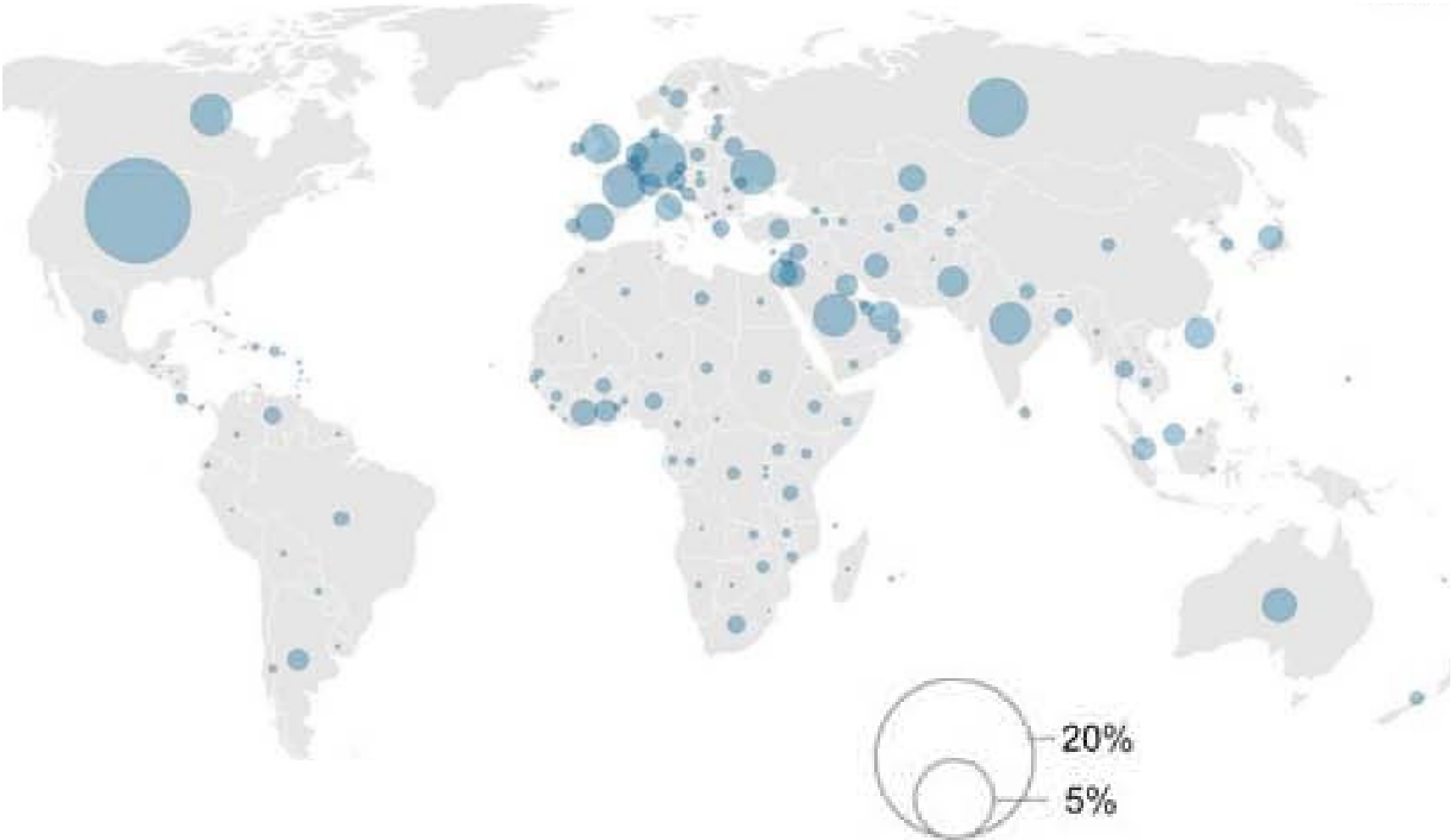
# In-commuter sheds of the ten largest Swiss towns

- 1970
- 1980
- 1990
- 2000



# Worldwide flows: 2005 Share of world's migrants

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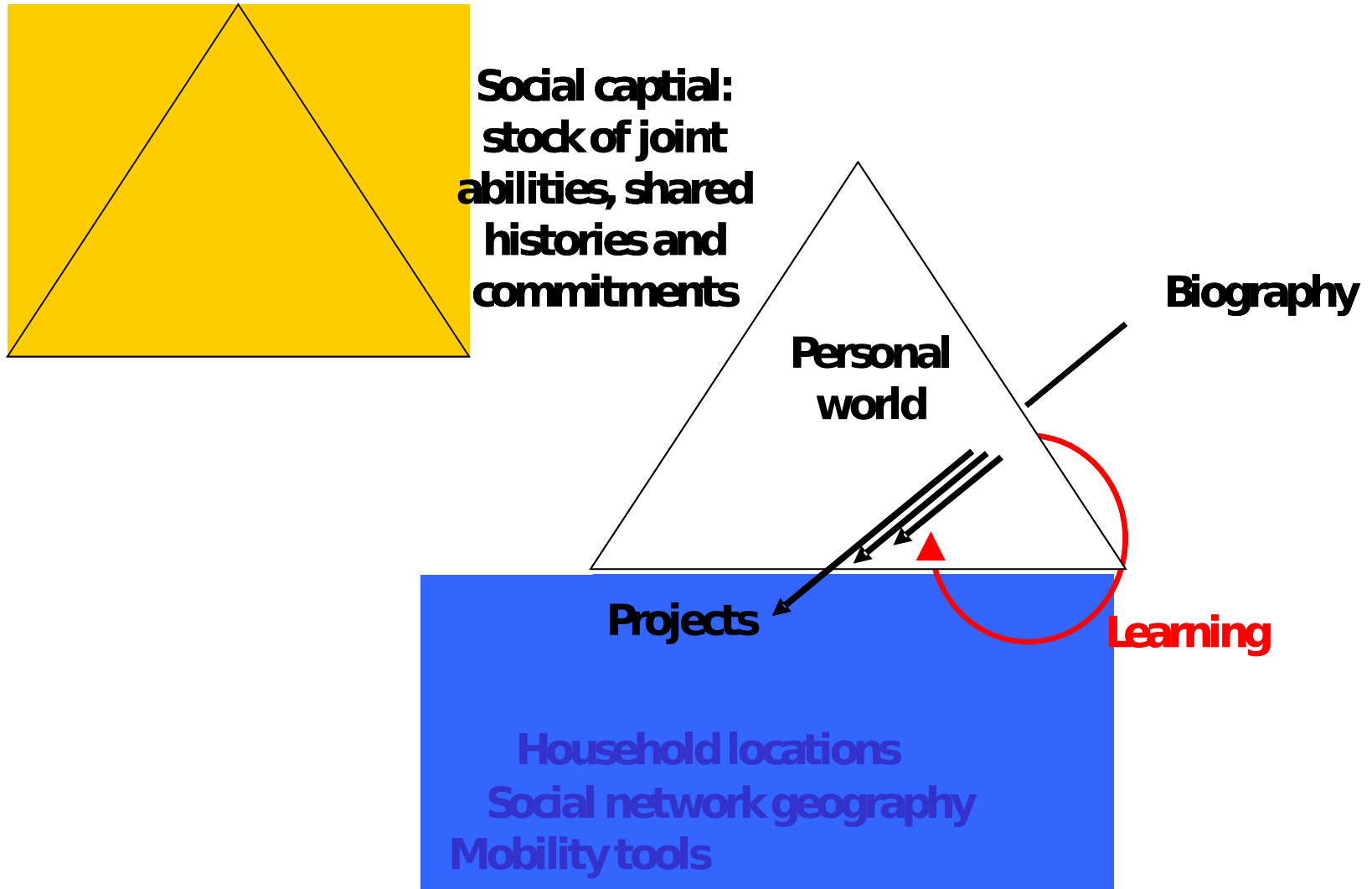
# How to explain travel ?

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- Distribution of activities
- Distribution of land uses
  
- Generalised costs on the available infrastructure
- Generalised costs of the activity (time, money, social content)
  
- Budget constraints
- Capability constraints

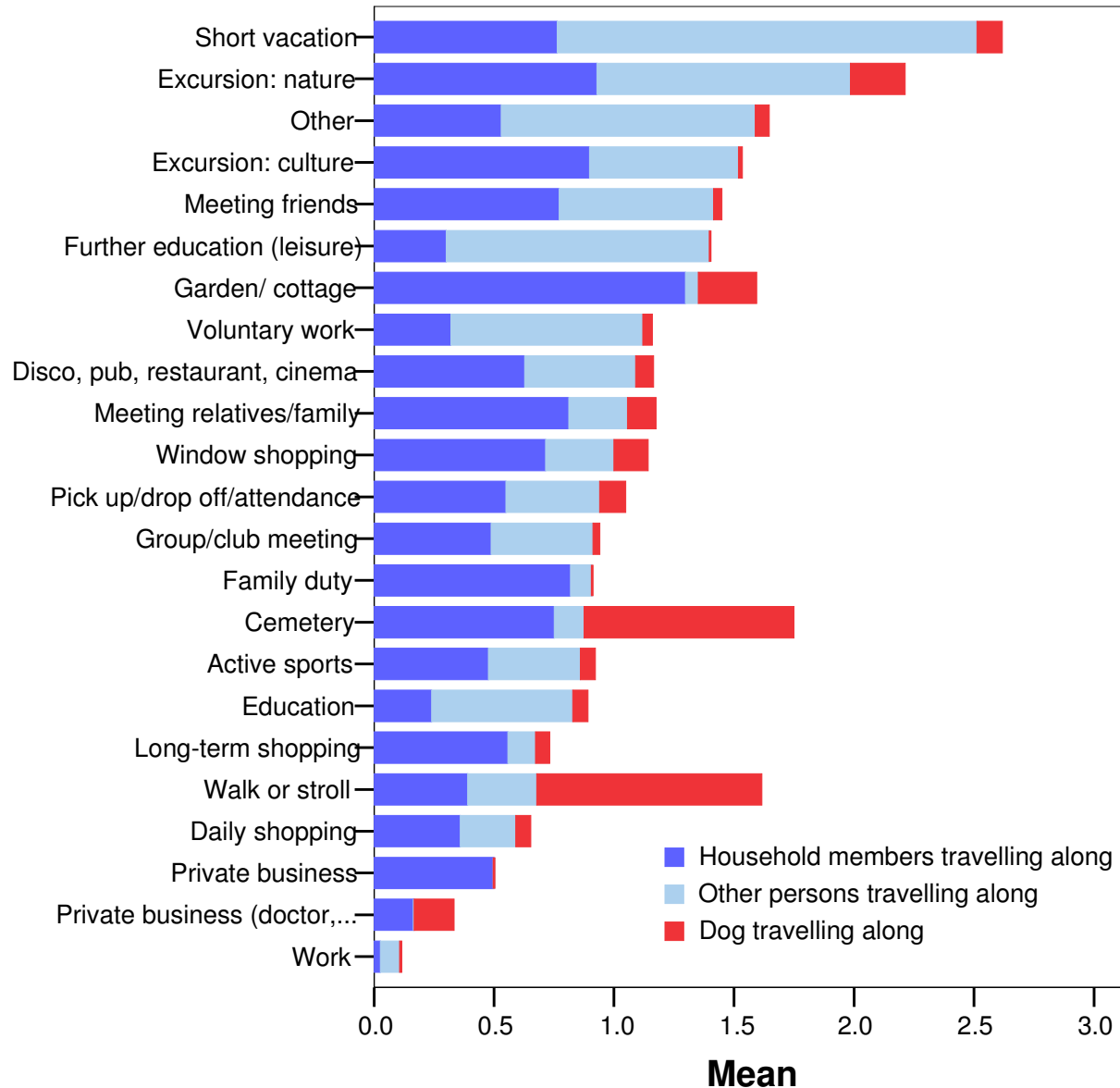
# Context: Networked actor

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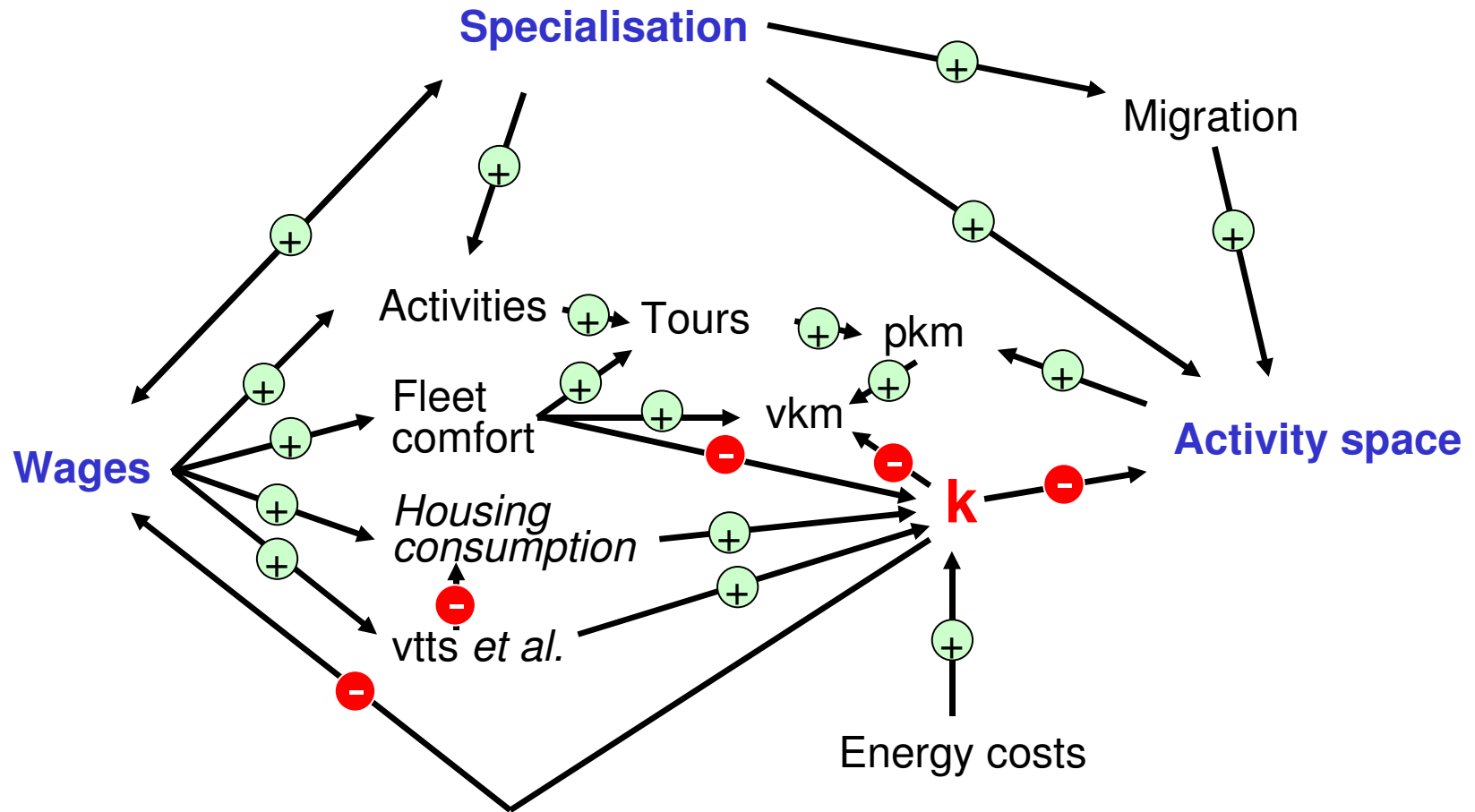




# Number of accompanying travellers (2003 Thurgau)



# Activity spaces inc. network geographies: A hypothesis



⊕ Elasticity > 0  
 ⊖ Elasticity < 0

k: personal short term generalised costs of travel

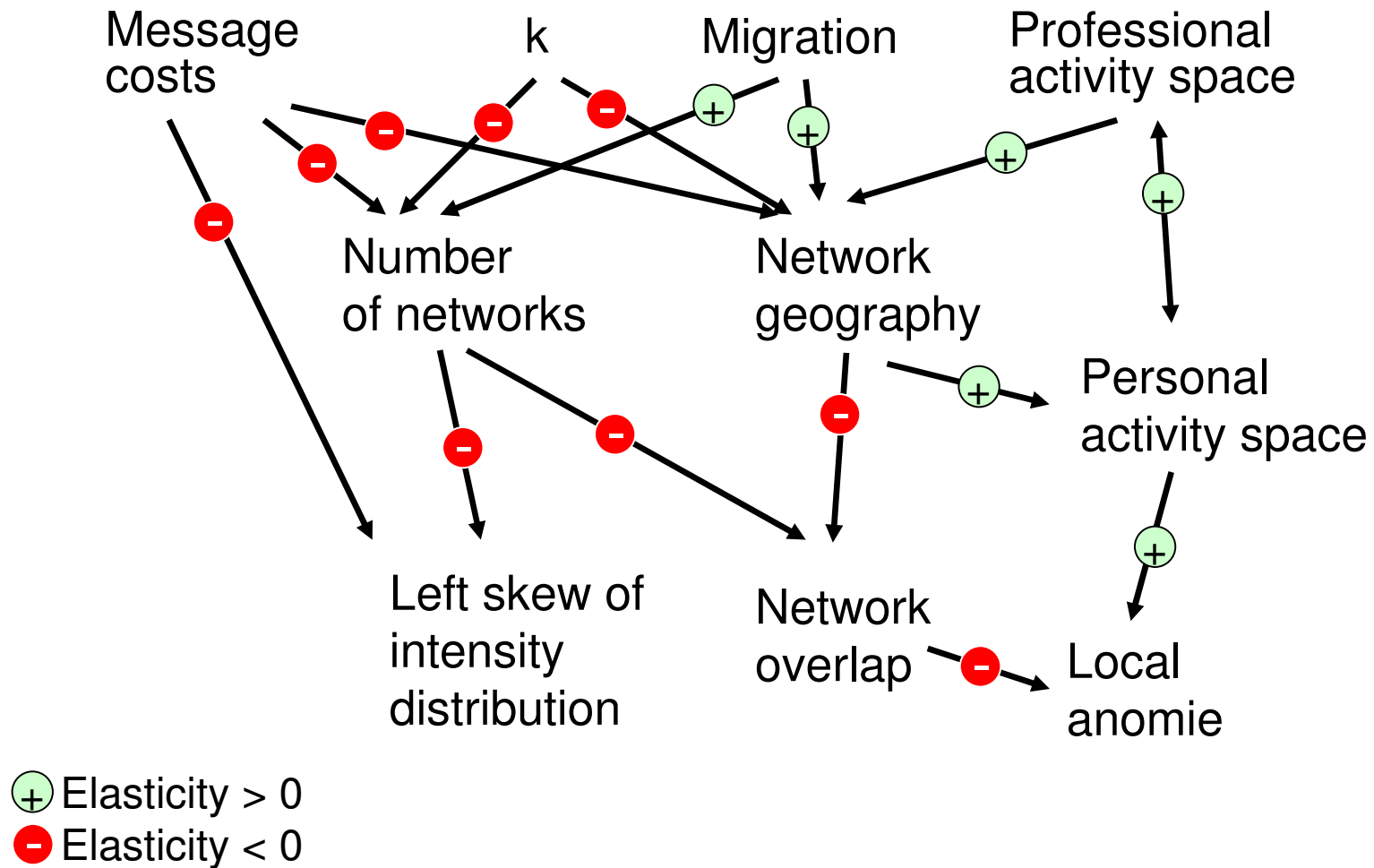
# Travel and social networks

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Maintenance of the networks requires:

- Face to face interaction
- Balanced by other forms of interaction
- Travel ~ Physical spread of the contacts
- Trade-off between losing contacts and “social” capital and investing in new contacts closer to home

# Hypotheses



# First set of research issues

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## Benchmarking the current state:

- Numbers of contacts
- Distance distributions
- Geographies
- Frequency and mode of contact
  
- Productivity
- Levels of local anomie
- Levels of local trust
- Level of place attachment

# Items to capture the social network geographies

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- Name generators
- Name interpreters
  - Type and length of contact
  - Frequency by mode of contact
  - Home location
- Description of the last face-to-face contact

# Items to characterise the mobility biography

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- Home and second home locations
- Work and school locations
- Household composition
- Mobility tools
- Income

# Representativeness of the data

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Variable	Survey Mean	Population Mean	Difference
Age	50.76	46.90	+8.2%

Variable	Survey Share	Population Share	Difference
Males	43.6%	46.4%	-2.80%
Education			
N.A.	5.2%	2.6%	2.60%
Obligatory schooling	8.0%	12.5%	-4.50%
Vocational training	31.8%	42.3%	-10.50%
Highschool diploma	8.3%	9.2%	-0.90%
Further technical training	20.8%	15.6%	5.20%
University degree	26.0%	17.8%	8.20%
Car available			
Always	44.6%	42.8%	1.80%
Frequently and rarely	17.0%	18.4%	-1.40%
Public transport season tickets			
50% discount card (Halbtax)	49.5%	37.9%	11.60%
National season (GA)	24.6%	14.2%	10.40%
Regional season	13.8%	18.7%	-4.90%



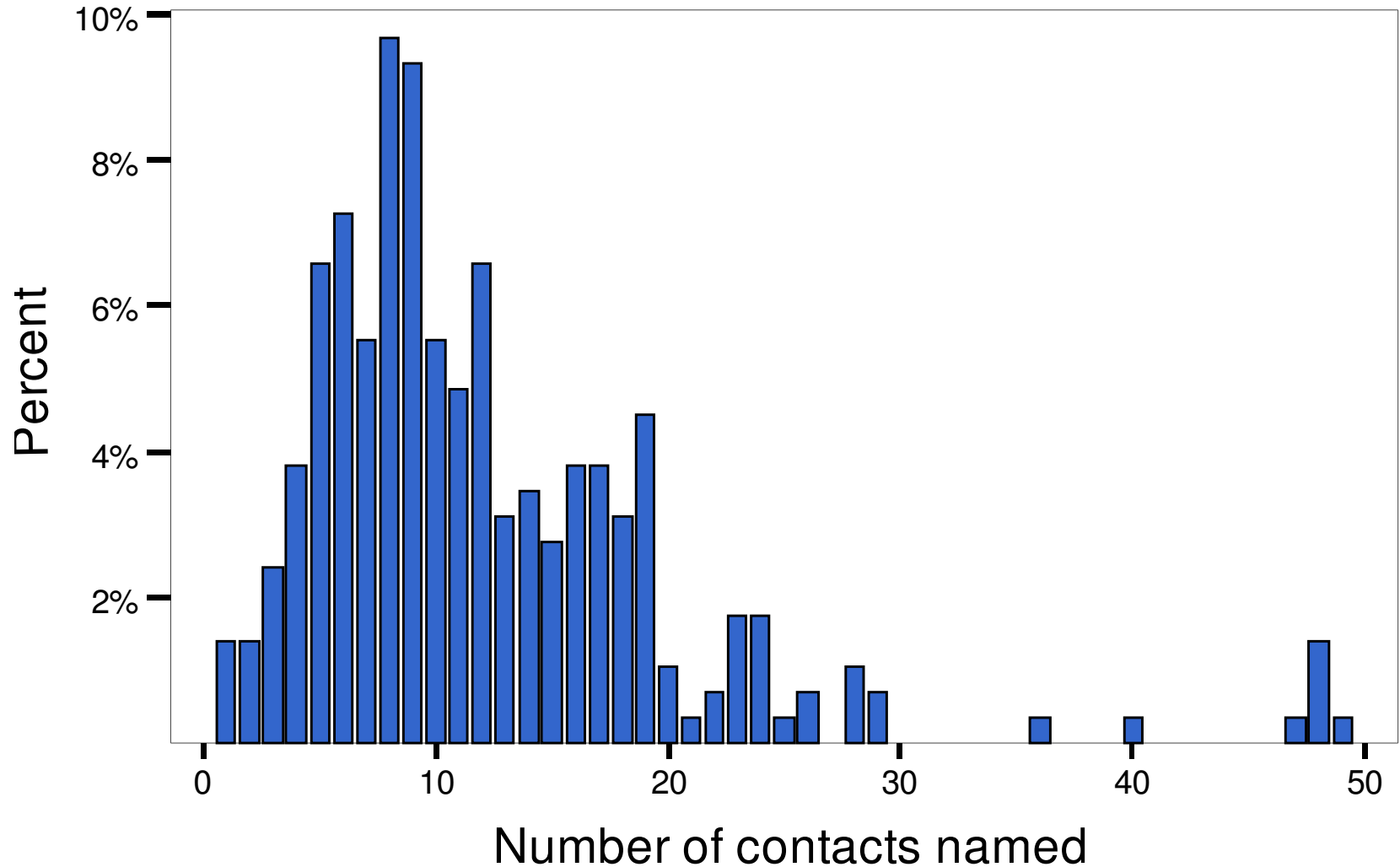
# Comparison of the instrument

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Variable	East York	NCCS	GSS	IVT
Instrument				
Name-generator	1 prompt (feel close to)	11 prompts	1 prompt (discuss important matters)	4 prompts
Generator limitation	6	No limitation	5	No limitation
Ego-centric network				
Size ( $\emptyset$ )	4.70	18.48	3.01	12.35
Share of relatives ( $\emptyset$ )	0.50	0.44	0.61	0.31
Share of weak ties ( $\emptyset$ )	0.18	0.32	0.23	0.48
Duration ( $\emptyset$ )	>10 for 57%	16	-	20.6
Contact freq. per year ( $\emptyset$ )	150.4	-	194.6	59.0

# Number of contacts reported

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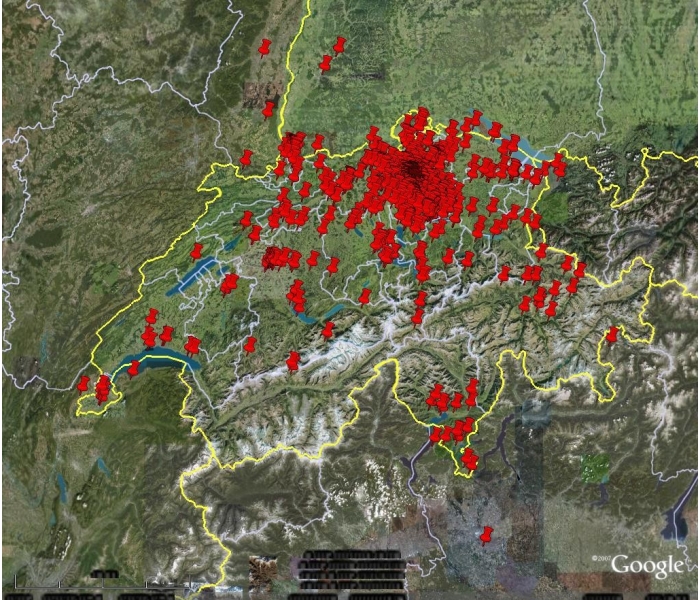
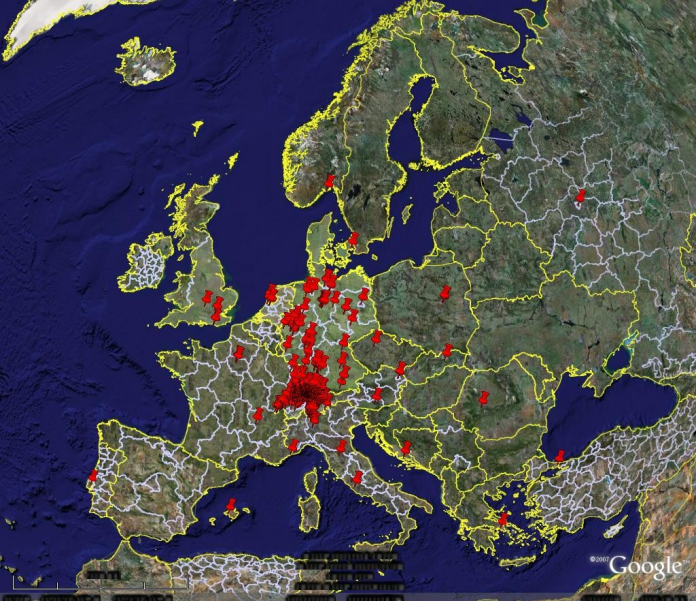
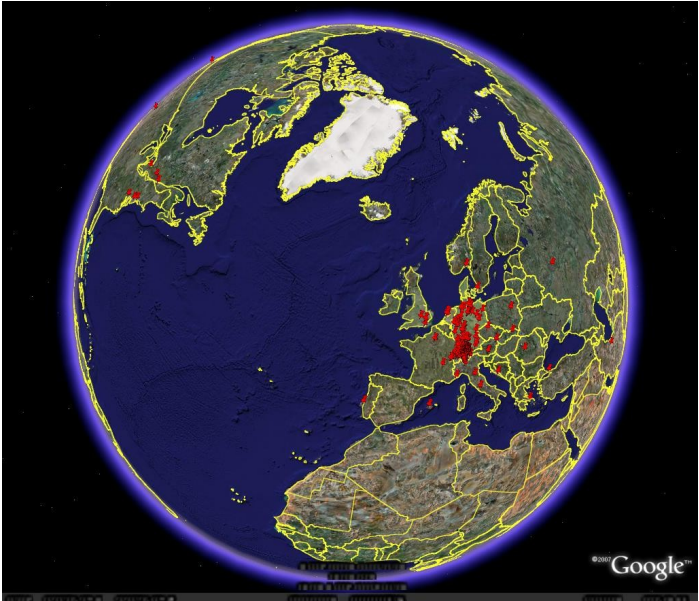


## Negative binominal regression (Number of contacts)

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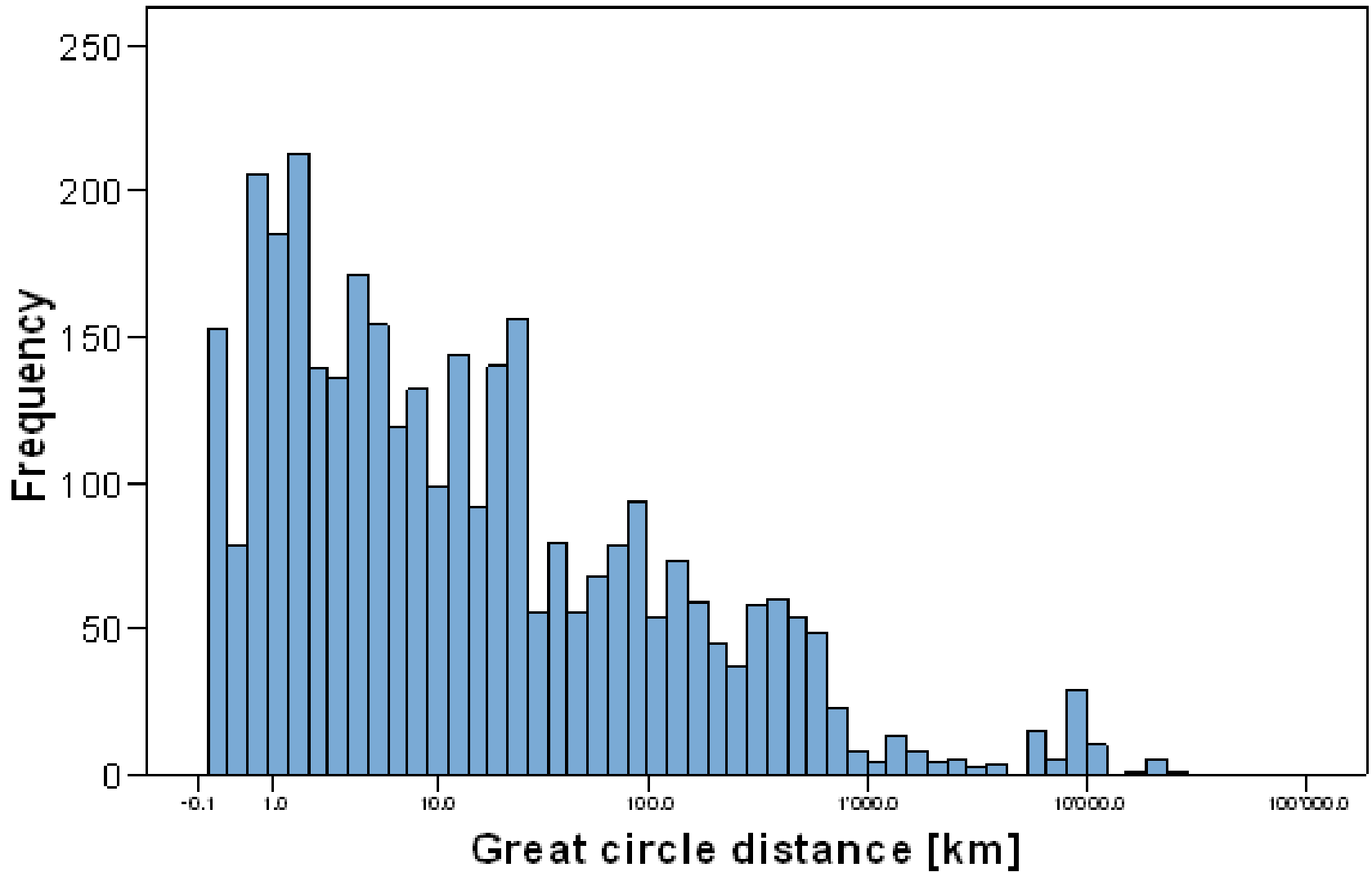
Variable	Mean	St.dev.	Beta	Sign.
Constant			3.092	0.000
Age [years]	53.283	19.163	-0.040	0.002
Age <sup>2</sup> /1000 [years <sup>2</sup> /1000]	3.208	2.081	0.352	0.005
Annual or monthly public transport ticket [y/n]	0.853	0.893	0.242	0.042
Number of relocations []	5.963	3.116	0.038	0.003
University degree [y/n]	0.247	0.430	0.178	0.055
Part time employed [y/n]	0.170	0.382	-0.256	0.020
Retiree [y/n]	0.327	0.469	-0.302	0.045
Children < 18 y [y/n]	0.250	0.434	0.177	0.021
N	300			

# Geocoded home locations



# Distances between home locations

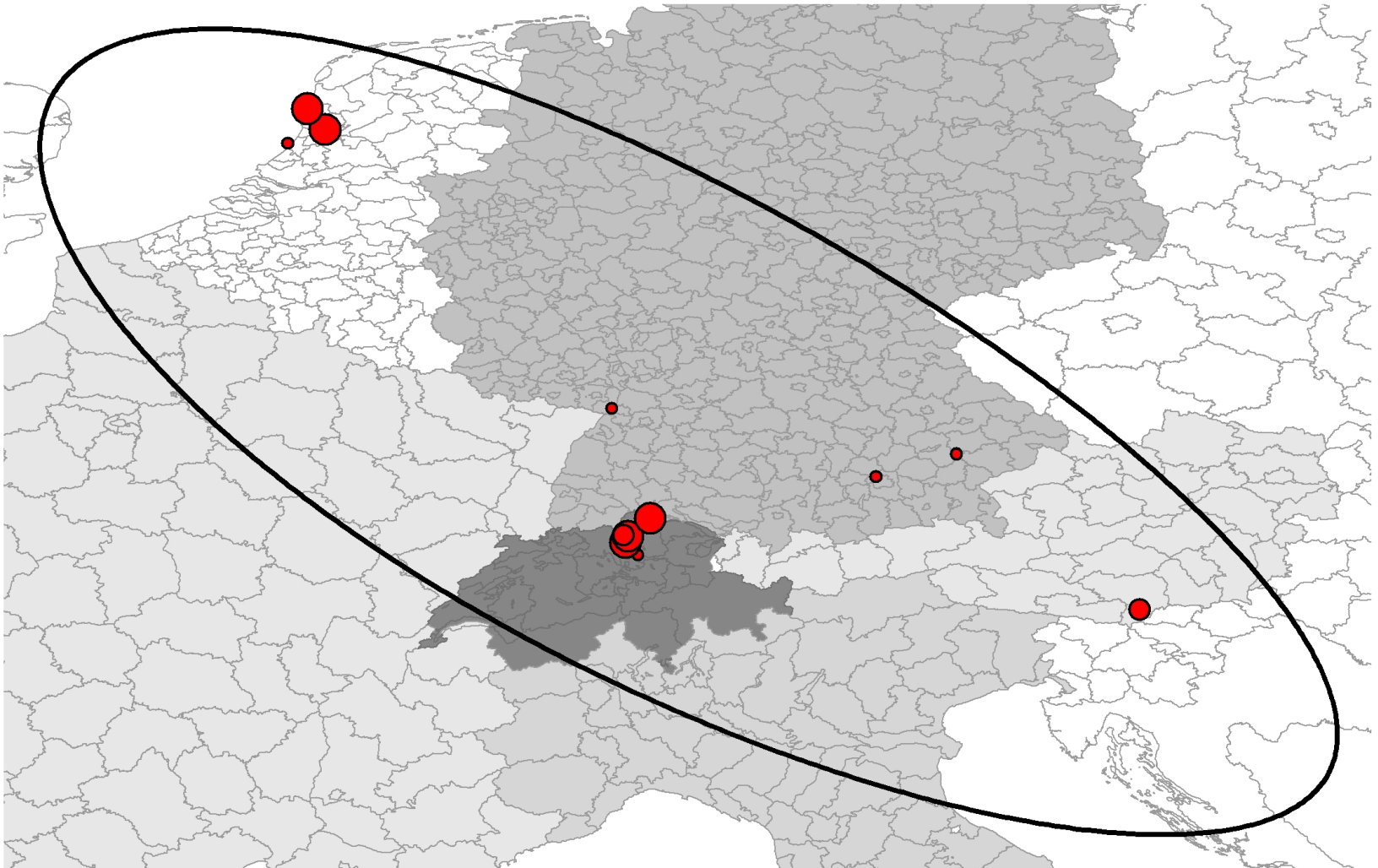
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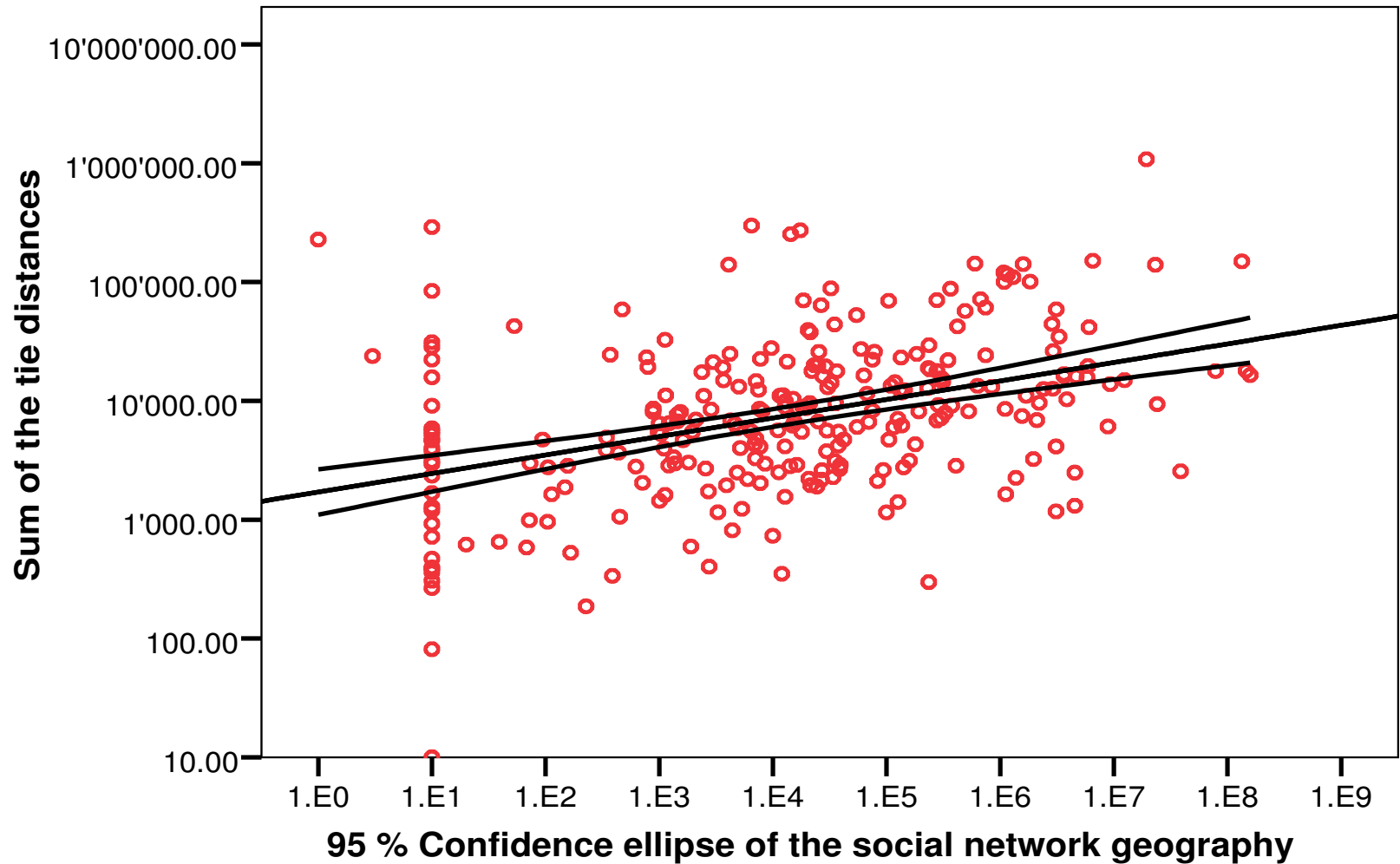


# Example of a social network geography

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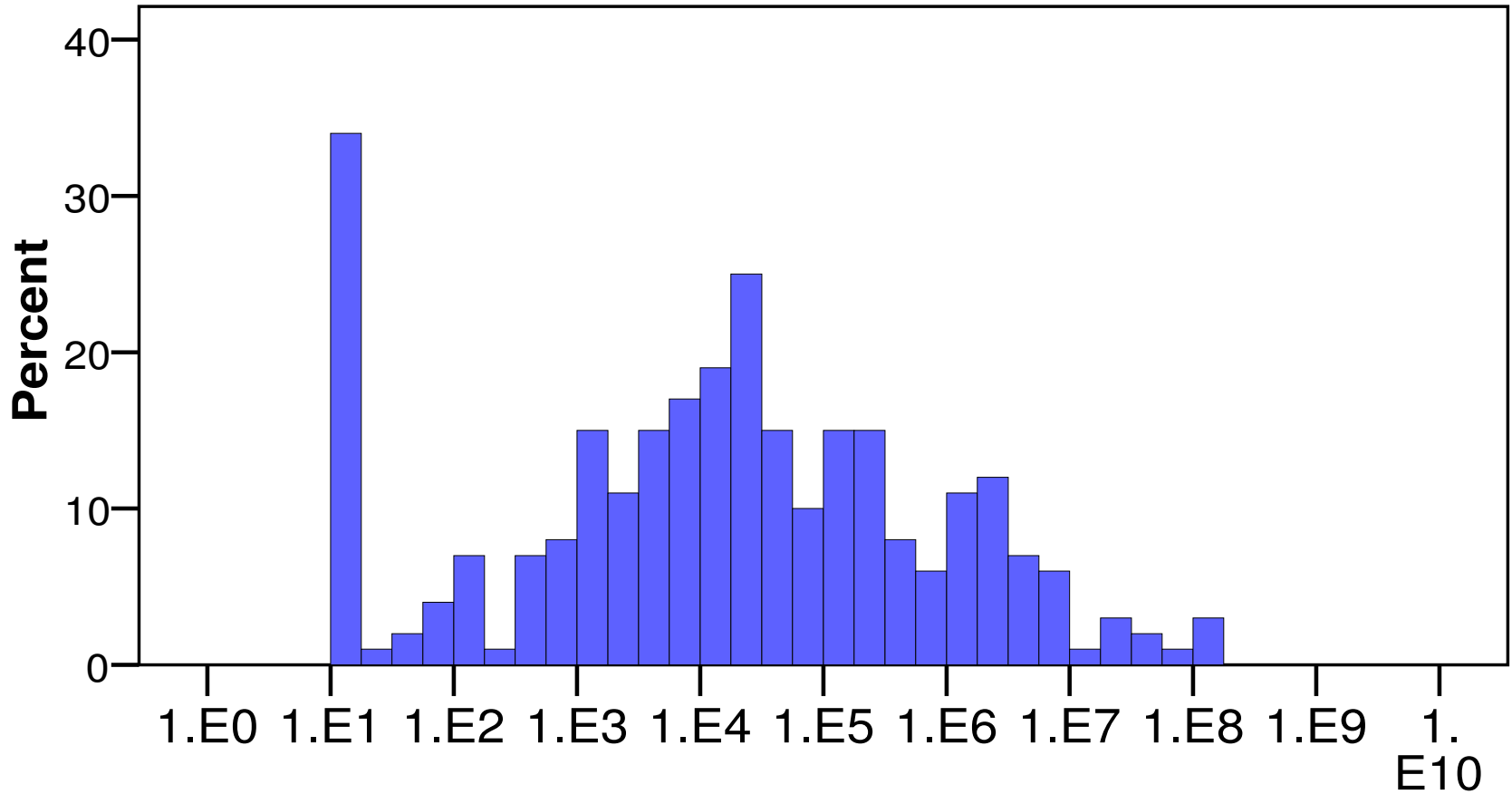


# Size of social geographies vs. sum of distances



# Size of network geometries

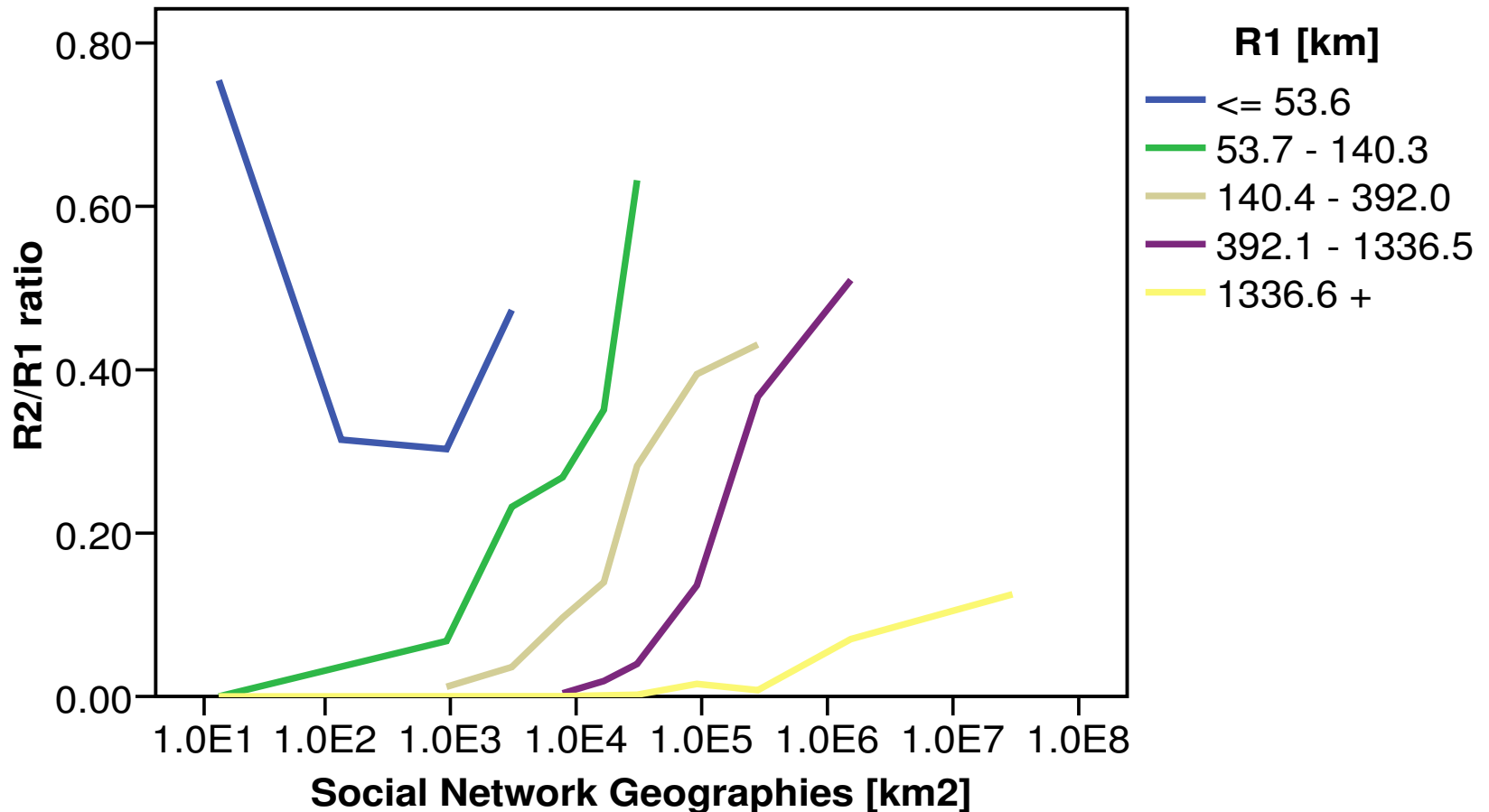
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**95%-confidence ellipse of the social network geography**

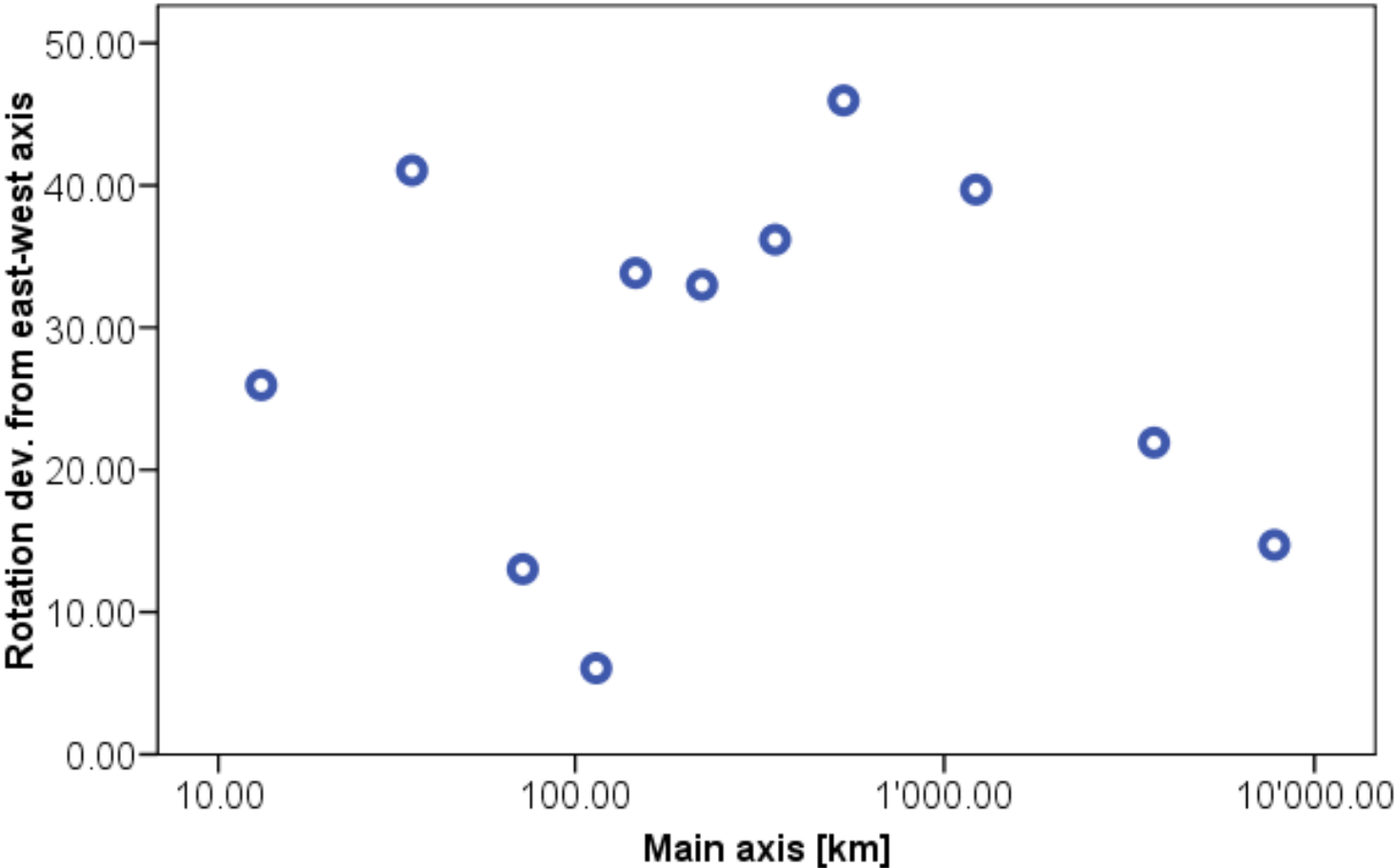


# Size vs. main/minor axis (R1/R2) ratio



# Orientation of the social geographies

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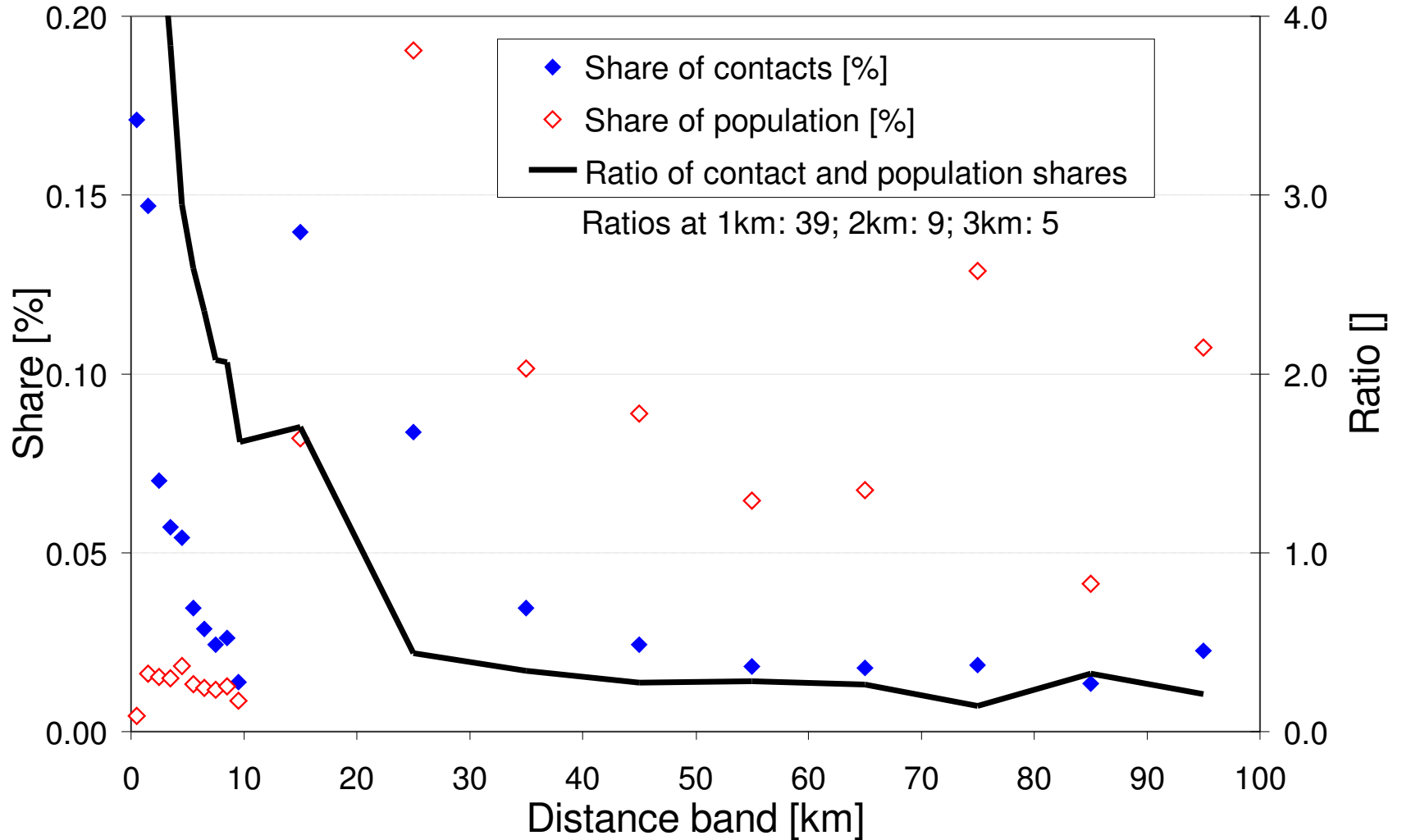


Only values from the 1st thirtilite of the axis-ratio are shown (< 0.09).

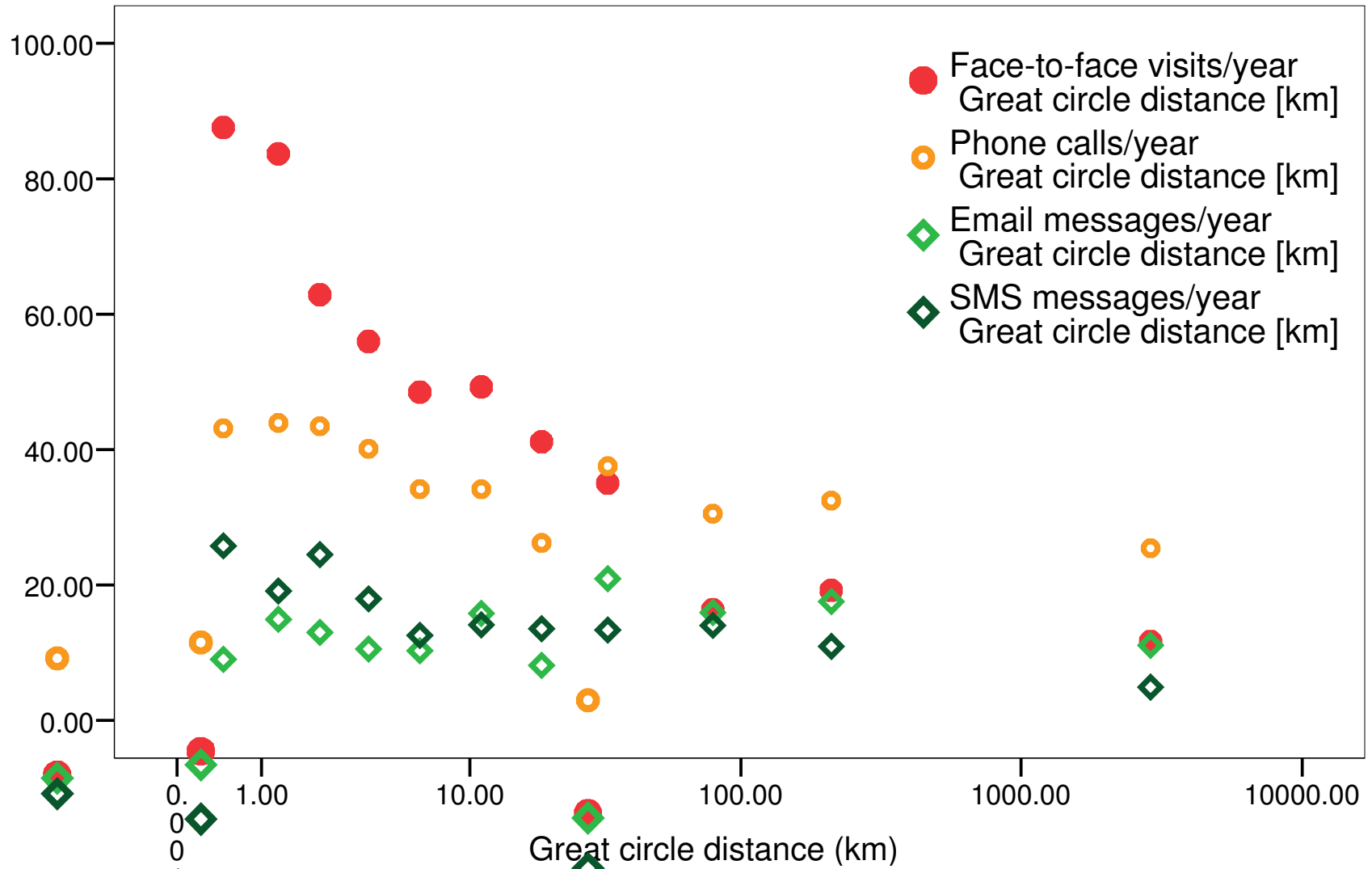
## Tobit regression of the Ln (social geographies)

Variable	Mean	St .dev.	Tobit model	
			Beta	Sign.
Constant	-	-	9.929	0.00
Age [years]	53.430	19.305	-0.296	0.00
Age <sup>2</sup> /1000 [years <sup>2</sup> /1000]	3.226	2.099	2.946	0.00
Car ownership [y/n]	0.472	0.500	1.609	0.01
Number of relationships []	12.406	8.454	0.201	0.00
Education/workplace changes []	3.336	2.475	0.289	0.02
Further technical training [y/n]	0.213	0.410	2.485	0.00
University degree [y/n]	0.245	0.431	2.617	0.00
Income >6000 sFr./month [y/n]	0.262	0.441	-1.643	0.028
N				286
Goodness-of-fit			Adjusted R <sup>2</sup> =0.25	

# Ratio of contacts to population

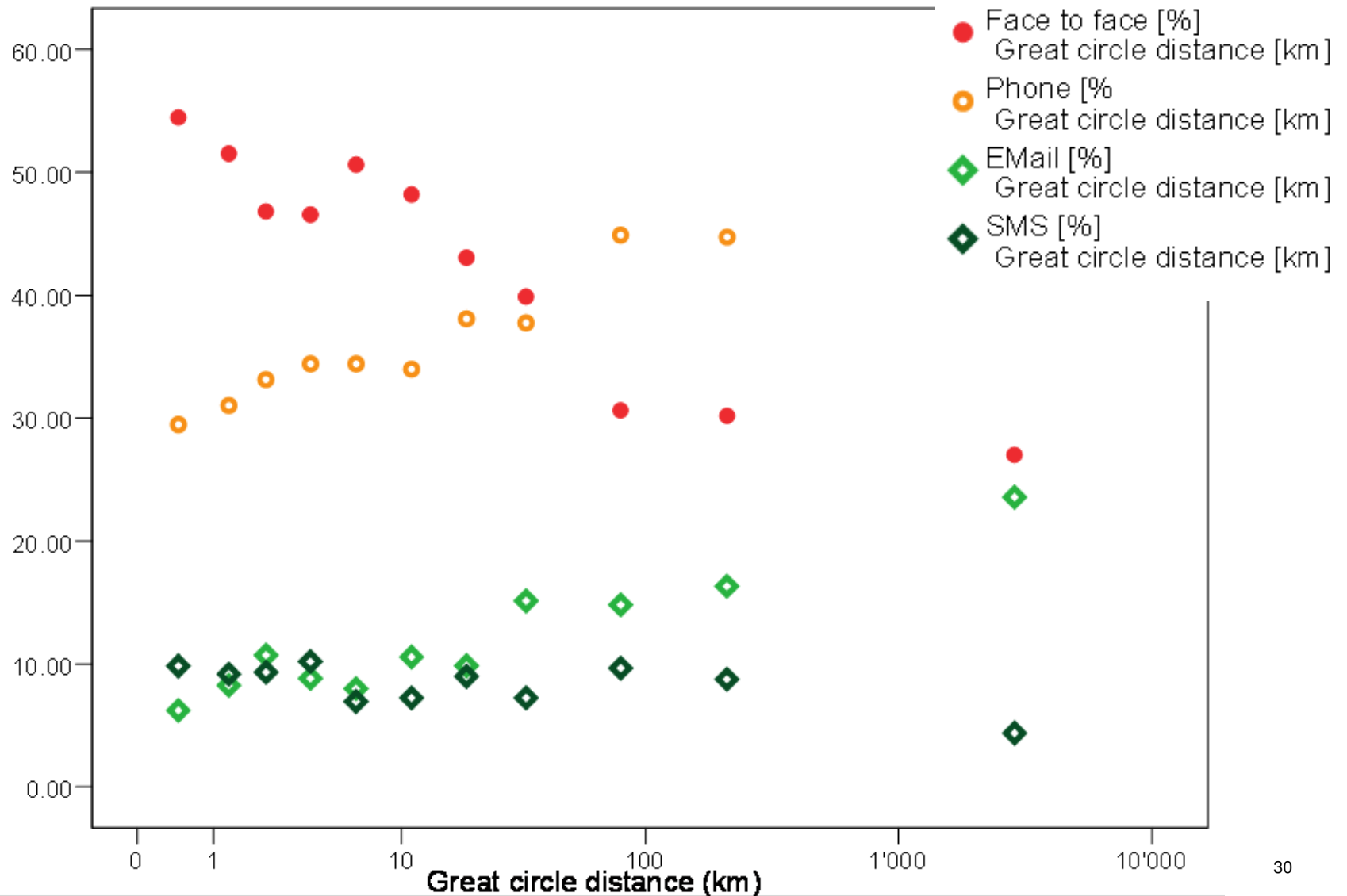


# Interactions by mode and distance between homes



Fa  
G  
Ph  
G  
Em  
G  
SM  
G

# Market share by contact mode



# Marginal effects/market share elasticities

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Variables	Face-to-face	Phone	SMS	Email
Duration of contact	-0.01	0.15	<b>-0.34</b>	<b>-0.43</b>
Within 2.5km of respondent	<b>0.04</b>	0.00	<b>-0.12</b>	<b>-0.09</b>
Ln(Great circle distance)	<b>-0.19</b>	0.09	<b>-0.35</b>	<b>0.34</b>
Workmate	<b>-0.06</b>	0.00	0.04	<b>0.10</b>
Family member	<b>-0.06</b>	<b>0.05</b>	0.01	-0.03
Under 30 years	0.00	-0.01	<b>0.08</b>	<b>-0.08</b>
30 to 44 years	-0.02	0.03	0.03	-0.04
60 years and older	<b>0.05</b>	<b>0.02</b>	<b>-0.29</b>	<b>-0.38</b>
Number of moves	<b>0.23</b>	-0.02	<b>-0.58</b>	<b>-0.41</b>
High school	<b>0.01</b>	<b>-0.03</b>	-0.01	0.02
Vocational training	0.05	<b>-0.06</b>	0.05	<b>-0.11</b>
More then 6000 sFr/month	0.05	-0.02	<b>-0.11</b>	<b>-0.12</b>
Driving licence	<b>0.13</b>	<b>-0.13</b>	-0.04	-0.04
Car always available	-0.04	<b>0.05</b>	-0.08	0.00
National season ticket	-0.03	0.01	-0.03	<b>0.07</b>

## Second set of research issues

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- Reconstruction of historical/prior activity spaces
- Taste differences in network form and geography
- Social/cultural preferences for network form and geography
- Stability of the geographies under pressure
- Elasticities to policy (or environmental) change
- Time until trend change

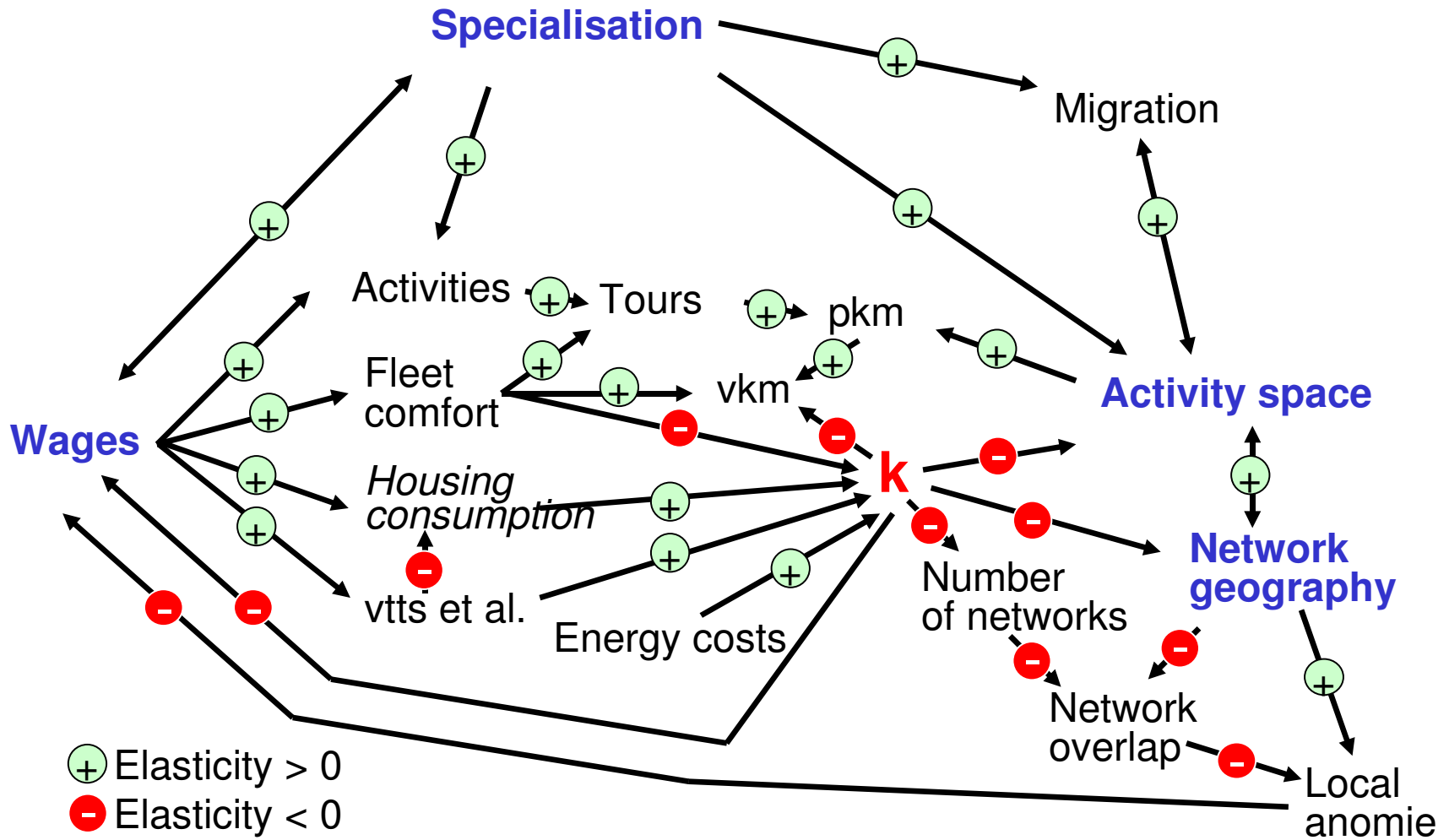


# Policy questions

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- Is „happiness“ still growing ?
- How large are the social externalities ?
- How stable is the overall system under pressure ?
- How can public policy support a possible need to reconstruct the networks ?

# The hypotheses summarized



For more information see

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[www.ivt.ethz.ch](http://www.ivt.ethz.ch)

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# Literature and references

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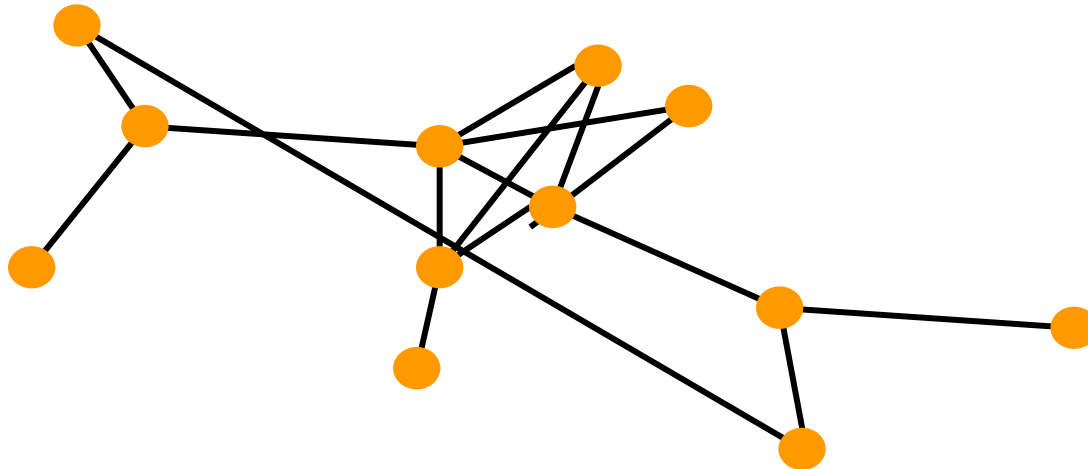
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# Definition of a social network

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The topology of a social network describes

- Which person/firm (node) is linked to which other persons/firms
- By contacts (links) of a certain quality (impedance or cost)



Closeness  $\sim 1/\text{Impedance}$

# Social networks: Hypotheses

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- [1] The size of the social network geography is inversely proportional to the generalised costs of travel and communication
- [2] The number of contacts individuals maintain is inversely proportional to the generalised costs of travel and communication
- [3] The probability of being linked to a member of one's network through multiple networks increases with the spatial density of one's contacts
- [4] The distribution of effort on non-household members will become more left skewed as the spatial social network tightness decreases
- [5] The knowledge about the contacts of contacts in a social network is proportional to the generalised costs of travel and communication

## Social networks: Hypotheses (2)

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- [6] The activity space of an individual is proportional to its social network geography
- [7a] The size of the local activity space of an individual stabilises after an initial exploration.
- [7b] The size of the total activity space will grow in line with the growth of social network geographies.
- [8] The reliance on commercial or publicly funded personal services increases proportionally with the geography of social networks
- [9] The welfare of the individuals should increase inversely proportional to the generalised costs of travel