

# Patterns of work organisation and their relation to communication and mobility patterns

Barbara Lenz, Katja Köhler, Arne Höltl

ICT Expert Group Meeting 2011 Berlin (Germany), 30 November – 2nd December 2011



# Background



Translated from: Hilty u.a. 1998, p.67



Slide 2 ICT Expert Group Meeting 2011 Berlin > Barbara Lenz > 1st Dec. 2011

# Background

TAPAS (Travel-Activity Pattern Simulation): Agentenbasiertes, mikroskopisches Personennachfragemodell





# In which way are activity patterns influenced by the use of ICT?

**Questions for statistical analysis** 

- ✓ Where do people work? At working place, at home?
- → How long do people work during a week?
- → Does the type of job position play a role?
- → How important is ICT for work?
- → How common are **business trips**?



# Methodological Approach

#### → Cluster Analysis

- Method to form groups of individuals resp. objects
- Objects of the same group should be as homogeneous as possible
- Objects of different groups should be as heterogeneous as possible

#### **TwoStep Cluster Analysis:**

- Combination of partitioning and hierarchical clustering
- Metric and categorial variables can be processed at the same time
- High number of cases is feasible



## **Research Approach and Data**

#### → Data source: ICT-Panel (DLR, TNS Emnid)

- Two waves: 2003 and 2007
- Sample size N = 3500 persons (1945 panelists)
- Representative study for German population of 14 years and older
- Goals: longitudinal analysis (Intrapersonal and intertemporal)
- Research questions
  - How does ICT usage of a person change over time?
  - Does mobility and activity-based behaviour change at the same time?
- Question categories: ICT usage and availability, mobility, travel information, shopping and commerce, leisure activities, ICT and work



# Included variables on work organisation: time-related, spatial and manner-related variables

	variable	categories
When?	Working time per week •In total •At home	hours
Where?	Business trips*	,never' to ,daily'
How?	Job-related importance of media* •Telephone •Mobile phone •internet	,unimportant' to ,very important'
	Leading position/non-leading position	yes; no

\*variables were standardised for cluster analysis



## Included variables on work organisation

- Average working time in total:
  36.2 hours/week
  - → Men: 40.6
  - → Women: 31.4
- Average working time at home: 1.9 hours/week (80% never work at home)
- Share of persons doing business travels: 58%
- Share of persons with leading position: 21%



#### work time per week in total



#### Included variables on work organisation



Deutsches Zentrun

für Luft- und Raumfahrt e.V. in der Helmholtz-Gemeinschaft

#### Job-related importance of media



#### **Frequency of business trips**

Source: ICT Panel 2007

ICT Expert Group Meeting 2011 Berlin > Barbara Lenz > 1st Dec. 2011

Slide 9

# **Two-Step Cluster Analysis**

- N = 2005 respondents
- non-employed persons were excluded from analysis
- several Cluster Analyses were carried out, a satisfying result was observed for three versions (including categorial and steady variables)
- other analyses did not show sufficient statistical significance

#### Model Summary

Algorithm	TwoStep		
Inputs	7		
Clusters	4		

#### **Cluster Quality**



average silhouette = 0.4



## **Choice of cluster size and number**

- 4 clusters are better than 3 (choosing 3 clusters usually results in getting one big cluster which includes all "average" answers)
- clusters are more comparable
  if their size is similar



Size of Smallest Cluster	282 (15.3%)
Size of Largest Cluster	649 (35.2%)
Ratio of Sizes: Largest Cluster to Smallest Cluster	2.30



## **Predictor Importance**

leading position yes/no

job-related importance of media – internet

job-related importance of media – phone

frequency of business trips

job-related importance of media – mobile phone

work time per week – at home

work time per week – in total

für Luft- und Raumfahrt eV

in der Helmholtz-Gemeinschaft



### **Cluster results**

	Cluster:	1	2	3	4	
		28.4%	15.3%	21.2%	35.2%	
	Cluster Name	ʻfixed' low ICT users	highly 'mobiles'	mobile ICT users	average persons	
	leading position	no	no	yes	no	
importance of	internet	unimportant	rather unimportant	important	important	
	telephone	rather unimportant	partly	very important	very important	
	mobile phone	unimportant	important	important	partly	
frequency of	<sup>-</sup> business trips	rarely	several times a week	several times a month	on average (2 to 4 times a year)	
working time at home		0,3 h	7,5 h	2,5 h	0,4 h	
(average)	in total	31,9 h	41,2 h	41,1 h	35,6 h	



## **Professional activites by industry sectors – Shares**

Professional activity in	1	2	3	4	total
agriculture / forestry / fishery / mining	1%	3%	3%	1%	2%
processing / producing / fabrication	31%	20%	25%	11%	21%
Technical profession	1%	2%	4%	6%	3%
consultancy / marketing / PR	0%	1%	3%	3%	2%
wholesale and retail	16%	5%	10%	10%	11%
banking / insurance / financing	1%	4%	4%	8%	4%
public administration / education / justice	6%	11%	9%	<mark>16%</mark>	11%
press / radio / television / journalism	0%	0%	0%	1%	1%
data processing / hardware-/software development	0%	0%	2%	4%	2%
building industry	1%	4%	2%	0%	1%
public health / welfare	<b>10%</b>	7%	11%	10%	10%
transportation	0%	16%	5%	2%	4%
hotel and restaurant sector / tourism	4%	1%	3%	3%	3%
research / science	0%	0%	1%	2%	1%
Other profession	27%	26%	19%	22%	24%
Total	100%	100%	100%	100%	100%

#### Yellow marked figures show particular 'affinity' to a cluster



Deutsches Zentrum DLR für Luft- und Raumfahrt e.V. in der Helmholtz-Gemeinschaft

## Socio-demographic factors: Qualification





## Socio-demographic factors: Gender



#### Percentage of men



## Socio-demographic factors: Personal net income



The average number of persons and children per household is approximately equal in all clusters.



### Factor communication: Job-related usage – en route







notebook



#### Factor communication: Job-related usage – at workplace



#### mobile phone



#### computer / notebook

Deutsches Zentrum für Luft- und Raumfahrt e.V. in der Helmholtz-Gemeinschaft

# Factor communication:

## Means of communication for business purposes



in der Helmholtz-Gemeinschaft

## Means of transportation on business trips – short distance

Private car



#### Company car / rental car



#### **Utility vehicle**



Local public transport







Source: ICT Panel 2007

Slide 21 ICT Expert Group Meeting 2011 Berlin > Barbara Lenz > 1st Dec. 2011

## Means of transportation on business trips – long distance

**Private car** 



Doutschos Zontrur

für Luft- und Raumfahrt e.V. in der Helmholtz-Gemeinschaft

#### Company car / rental car



#### **Utility vehicle**



Aeroplane



Train



# **Conclusion and Next Steps**

#### Conclusion

- Based on time, space and work related variables four different communication and mobility patterns can be distinguished
- → Appearance of communication patterns in business sectors differ

#### Next steps

- → Regression analysis between pattern variables
  - $\neg$  Correlations which are not found with cluster analyses
- More deep analysis of communication and mobility patterns in different business sectors
  - Comparison with time indication for working times in the panel's "activity diaries"
- → Correlations between work-related and private usage of ICT

