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# Interest into travel-related interventions among urban movers and non-movers

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Research Highlights:

- Studying interdependencies between residential relocations, life events, policy intervention and travel behaviour change
- Predicting interest in policy intervention as indicator of a preparational stage of behaviour change
- Only perceived accessibility (but not relocation) predicts interest in interventions
- Perceived mobility relevance of residential relocation crucial to understand travel behaviour change

## Interest into travel-related interventions among urban movers and nonmovers

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Declarations of interest: none

## Interest into travel-related interventions among urban movers and nonmovers

#### Abstract

Movers are expected to be more open to travel behaviour change and corresponding interventions than non-movers due to weakened mobility habits. However, evidence is mixed, the role of relocation for travel behaviour (change) is not yet well understood, and the assumed openness to change has hardly been addressed systematically. This study focuses on how far relocation predicts individual interest into an intervention to motivate the use of alternative travel modes. We emphasize the theoretical argumentation and explore how to address this question empirically. We surveyed movers before their move (N=186) and non-movers (N=572), and offered them the chance to order a Mobility Package promoting public transport, cycling, and carsharing. Whether participants ordered a package, thus indicating a preactional stage of travel behaviour change, was regressed on relocation, current changes in life, mobility habit strength, consideration to reduce car use, and perceived destination accessibility. While changes in life and relocation did not predict interest, the interaction revealed a negative impact: Movers who reported that moving house was provoked by changes in their personal life were clearly less interested. Unexpectedly, mobility habit strength and enhanced consideration to reduce car use revealed no impact on interest, while perceived accessibility enhanced interest. We interpret that not relocation as such, but the experienced mobility relevance that derives from changed individual and structural conditions associated with residential relocation or changes in life might be a better indicator of interest. We suggest further research on the conceptualization, measurement and fertilization of mobility relevance during changing circumstances.

#### Keywords

residential relocation, habit, behaviour change, intervention, openness to change, mobility relevance

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2 movers

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#### 40 **1. Introduction**

41 Although knowledge about the impact of carbon-based travel as well as pro-environmental attitudes 42 are constantly on the increase within the population of Germany and great parts of the European 43 Union, an adequate shift towards less carbon-intense travel behaviour cannot be observed (European 44 Commission 2014, European Environment Agency 2015, Umweltbundesamt 2012, 2014). Research on 45 voluntary behaviour change considers the concept of personal habits to represent one of the 46 bottlenecks of transforming motivation into action, since the automaticity of behaviour outperforms 47 the deliberate intention to behave otherwise (Wood and Rünger 2016, Gardner 2015, Orbell and 48 Verplanken 2015, Schwanen et al. 2012, Klöckner and Verplanken 2013).

49 One occasion when mobility habits are expected to be weakened, though, is residential relocation, due 50 to associated changes in everyday life and spatial patterns. This might thus provide a suitable moment 51 to implement information and incentive based interventions to change travel behaviour. Many studies 52 report considerable changes in travel behaviour after a residential relocation (Aditjandra et al. 2012, 53 Beige and Axhausen 2012, Klinger and Lanzendorf 2016, Kroesen 2014, Scheiner and Holz-Rau 2013a, 54 2013b, Thomas et al. 2016, Verplanken et al. 2008). However, studies testing the hypothesis that these 55 changes are likely to be reinforced or directed by adequate interventions reveal mixed results and, if 56 at all, small-size effects (Graham-Rowe et al. 2011, Richter et al. 2011, Müggenburg et al. 2015, 57 Chatterjee and Scheiner 2015). These empirical data are not yet fully reliable, neither permitting an 58 understanding of the processes of reacting to interventions nor the derivation of practical 59 recommendations. In fact, the most critical point is that hardly any of these studies tested how 60 residential relocation affects travel behaviour change.

61 In terms of information and incentive based interventions, Bamberg (2006, 2013b) showed that 62 individual motivation is central to the intervention's success. In an experimental study he offered a 63 mobility package to people who plan to move to Frankfurt. Those who reported the highest motivation 64 to change behaviour benefitted most from the intervention (2006:834). This insight has been 65 reinforced by studies demonstrating the importance of intrinsic as well as incentive-led interest in an 66 intervention either theoretically (Lally and Gardner 2013) and or implicitly (Verplanken and Roy 2016, 67 Eriksson et al. 2008). In the latter studies, subjects could choose between interventions targeting at 68 different behavioural domains in order to assure the highest motivation in the applied intervention. 69 However, to the best of our knowledge interest in an intervention has neither been addressed explicitly 70 as a variable nor been related to residential relocation and accompanying life events. We do not know 71 yet, when and which people are likely to be interested in interventions promoting more sustainable 72 travel behaviour. Based on the habit concept (Verplanken and Orbell 2003), we only assume movers 73 are.

74 Hence, this study aims to contribute to existing research in three ways. First, it approaches interest in 75 an intervention as an outcome variable, measured in a non-self-reported manner. Second, it widens 76 the theoretical approach by considering relocation as predictor simultaneously with variables from both a psychological and a planning perspective. Third, it adds field data of a sample of both inner-city 77 78 movers and non-movers to the body of evidence. In the following, we derive hypotheses from the 79 current state of knowledge (Section 2), introduce the method and variables applied to test them 80 (Section 3), report the results of data analyses (Section 4), and discuss these results against the state 81 of knowledge (Section 5). We conclude by reflecting on the study's contribution to research and 82 practice.

#### 83 2. Residential Relocation, Interventions, and Travel Behaviour Change

84 First, in this section we refer to work on the habitual and stable character of everyday travel behaviour. 85 Second, we focus on studies analysing the role of residential relocation for weakening habits and 86 trigger changes in travel behaviour. In doing so, we discuss three different causal perspectives of how 87 relocations and travel behaviour relate to each other. Third, we reflect on the role of individual and 88 structural variables in the context of a residential move. Fourth, we review work analysing if 89 interventions such as awareness campaigns or trial tickets for public transport reinforce the relation 90 between residential relocation and travel behaviour change. Fifth and most importantly, we address 91 the need to understand behavioural change as a stage-based cognitive process. Finally, we derive 92 hypotheses guiding the data collection and analysis.

#### 93 Habitual travel behaviour and likelihood of behavioural change

94 Everyday travel behaviour shows a highly habitual character, people do not deliberately decide every 95 day on the mode, route and time they travel, for example to work or school. Habit is understood here 96 as "cognitive structures that automatically determine future behaviour by linking specific situational 97 cues to (...) behavioural patterns" (Klöckner and Verplanken 2013: 198). Habitual behaviour is 98 reinforced by four central features, i.e. frequency, stable circumstances, success and automaticity 99 (ibid). Thus, the more a certain travel behaviour is repeated successfully on a regular and automatic 100 basis as well as within an unchanged spatial and social context, the less behavioural change is likely to 101 occur (ibid). The concept of habitual travel behaviour and empirical findings indicate that past travel 102 behaviour is the strongest predictor of present travel behaviour, a phenomenon which became known 103 as 'state dependence' (Beige and Axhausen 2012, Klinger and Lanzendorf 2016).

#### 104 Habitual behaviour, residential relocation and behavioural change

105 As a consequence of this habitual character of everyday travel it is a plausible, but yet untested 106 assumption that travel habits are weakened by residential relocation, and mediate or moderate a 107 change in travel behaviour. Various scholars critically discuss this assumption as somewhat simplified 108 (Chatterjee and Scheiner 2015, Cao et al. 2009, Walker et al. 2015, Gardner 2015, Verplanken and Roy 109 2016). However, the proposed close link between habitual behaviour and stable contextual factors is 110 in line with studies showing that the impact of residential moves on travel behaviour is especially 111 strong when the move involves a change of urban form and accessibility characteristics (Beige and 112 Axhausen 2012, Scheiner and Holz-Rau 2013a, 2013b) The same applies for studies indicating the 113 influence of a changing social environment in the course of a residential relocation (Aditjandra et al. 2016, Lin et al. 2018, Gim 2017). It is still debated, though, how residential relocation affects travel 114 115 behaviour (Bamberg 2006).

116 Furthermore, the theoretical rationale in terms of motivation to change, which is inherent to voluntary 117 behaviour change, is widely neglected. It seems that the underlying hypothesis states that residential 118 relocation brings about a tabula rasa due to weakened habits, so to say an openness to change in the 119 direction suggested by the content of the intervention. But conventional wisdom suggests that 120 residential relocation occurs for a reason and, thus, is most often associated with further internal or external changes in a person's life that may affect travel behaviour. Hence, the mobility biography 121 122 approach discusses three alternative causal perspectives regarding the role of residential relocation 123 (Müggenburg et al. 2015):

A) Residential relocation is the *consequence* of an intended or necessary change in travel behaviour (e.g. Stanbridge and Lyons 2006, Chatterjee and Scheiner 2015). For example, a continuous rise in environmental concern finally motivates the disposal of one's car (Kaiser et al. 2010), or an illness impedes a person from continuing to drive a car, both changes leading to the necessity to relocate in order to travel with alternative modes (Hefter and Götz 2013). Characteristically, to our knowledge, the role of personal reasons and motivations for moving house has not yet tested with an experimental and control group design.

131 B) Residential relocation is a mediator, affecting travel behaviour via self-selection processes (pre-132 move) and adaption processes (anticipated and post-move) (Bamberg 2006, 2007, Cao et al. 2009, Oakil et al. 2014, Scheiner and Holz-Rau 2013b). For example, a person moving in with her partner 133 134 might self-select to the area that supports the travel behaviour to which she aspires, whether it be the 135 former or a different one. In contrast, a person moving to a bigger home in a more expensive district 136 due to higher income adapts to the local social norm or car-promoting infrastructure (e.g. available 137 parking space, poor accessibility/lack of alternative modes) by buying a car, whether in anticipation 138 before or in realization after the move (see also Thomas et al. 2016).

C) Residential relocation is a *correlate* of other changes that cause a change in travel behaviour,
especially changes in household composition, job conditions, levels of income and status, and
accessibility patterns (Scheiner and Holz-Rau 2013b, Schäfer et al. 2012, Müggenburg et al. 2015,
Walker et al. 2015, Graham-Rowe et al. 2011, Prillwitz et al. 2007) but also some unmeasured
processes (Thøgersen 2012, Thomas et al. 2016). For example, the birth of a child may independently
entail the purchase of a car and moving house to a bigger residential unit.

145 Thus, all three alternative causal perspectives challenge the simplified assumption that a residential 146 relocation and accompanying habit discontinuity lead to more or less undirected openness to any sort 147 of behaviour. Instead, residential relocation should be perceived as an opportunity to activate 148 behavioural orientations, which already latently exist. Ultimately, research suggests different 149 directions regarding whether and how residential relocation might be related to travel behaviour 150 (change) and little is known about how to describe the circumstances that enhance the motivation to 151 change one's travel behaviour as well as the interest in related interventions. This is to say that the 152 habit concept in the course of residential relocation is best understood as being interlinked with 153 preferences, biographical traits, and motivations to move. This tension between changing context and 154 enduring preferences reveals the need for exploratory work (Müggenburg et al. 2015, Chatterjee and 155 Scheiner 2015).

#### 156 Individual and structural perspectives: biographical influence, life events and socio-spatial context

157 Each of the three causal perspectives on the relationship between residential relocation and travel158 behaviour implies certain interdependences of individual and structural or contextual aspects.

First, to better understand the individual dimension, it seems reasonable to draw from a life-course perspective and the concept of mobility biographies. Correlational studies based on national panel surveys or retrospection show a coincidence of residential relocation with changes in household composition and employment/education conditions, while at the same time demonstrating that such changes can affect travel behaviour much more than they induce residential relocation (Müggenburg et al. 2015). Additionally, "the functional value as well as the meaning of consumption activities could change with life events" (Schäfer et al. 2012). Beyond altered capabilities, life events probably involve 166 changes in social roles, personal values, or short- or long-term priorities that are presumably but not 167 necessarily reflected in travel behaviour (Bamberg et al. 2015, Clark et al. 2016, Prillwitz et al. 2007, 168 Scheiner and Holz-Rau 2013b, Jaeger-Erben 2010). This fuzzy "mind-set of being 'in the mood for 169 change'" (Verplanken and Roy 2016) is a challenge for the design of any targeted behaviour change 170 intervention. There is considerable demand for both conceptual work and systematic analysis of 171 interactions between life events and contextual factors in different domains and their interaction with 172 travel behaviour and interest in related offers and interventions (Müggenburg et al. 2015, Chatterjee 173 and Scheiner 2015, Scheiner and Holz-Rau 2013b). It seems appropriate to at least measure parallel 174 life events when examining the impact of residential relocation on travel behaviour.

175 Second, psychological as well as planning and transport research agree on the necessity to 176 complement the individual dimension by a structural perspectives to predict behavioural change. In 177 addition to the relevance of habit strength and consideration to reduce car use, the impact of structural 178 conditions at the (new) place of residence such as spatial arrangements and socioeconomic patterns 179 is striking. Travel behaviour is so deeply connected to the socio-spatial context (Gardner 2015, 180 Bamberg et al. 2015) that not only transport research finds structural variables, especially destination 181 accessibility, to be some of the strongest predictors of travel behaviour (Prillwitz et al. 2007, Scheiner 182 and Holz-Rau 2013b, Cao et al. 2009, Ewing and Cervero 2010), but also studies focusing on individuals 183 increasingly consider structural variables relevant (Verplanken and Roy 2016, Bamberg 2006, 2007, 184 Walker et al. 2015, Cairns et al. 2008, Thøgersen 2012, Schäfer et al. 2012, Müggenburg et al. 2015). 185 In studies focusing on residential relocation influencing individual travel, spatio-structural and socio-186 structural variables have been included as changes in personal social networks and social environment 187 (Lin et al. 2018), the inclination towards a certain travel mode among residents (Gim 2017) as well as 188 perceived safety, sociability and accessibility (Aditjandra et al. 2016). However, most psychological 189 models still empirically neglect structure-related variables beyond perceived behavioural control or 190 rated attractiveness. There is generally a need to simultaneously examine individual and structure-191 related variables and explore their respective impact on travel behaviour. In this study, we focus on 192 mobility habit strength and the level of consideration to reduce car use, thus assuming an individual-193 focused perspective, and perceived accessibility, thus assuming a structural perspective.

#### 194 Travel-related interventions targeted at residential movers

195 Practitioners have taken the potential impact of residential relocations on everyday travel behaviour 196 as an opportunity to design travel-related interventions, tailored at the people who are new or soon-197 to-be new residents. To examine the mutual influences between residential relocation, travel-related 198 intervention and travel behaviour, the state of the art research paradigm is to experimentally test the 199 moderation effect of residential relocation on the effect of an intervention on travel behaviour change, 200 at best by applying a controlled pre-post design to a randomized sample (Graham-Rowe et al. 2011, 201 Bamberg et al. 2015). However, only few studies follow this paradigm, and meta-analyses are not yet 202 applicable (Graham-Rowe et al. 2011, Richter et al. 2011, Müggenburg et al. 2015, Chatterjee and 203 Scheiner 2015). There is evidence that a residential relocation facilitates the effect of behaviour change interventions (Loose 2004, Bamberg 2006, 2007, Verplanken and Roy 2016, Richter et al. 2011, 204 205 Thøgersen 2012), but effect sizes of the moderation effect of relocation on the effect of an intervention 206 are mostly small. Moreover, variables are operationalized in many different ways, often by combining 207 residential relocations (predictor) and travel behaviour (outcome) with other features, e.g. a change 208 in residence or workplace (Thøgersen 2012), or a combination of several pro-environmental 209 behaviours (Verplanken and Roy 2016). Additionally, travel behaviour is measured in various ways, e.g.

in terms of mode choice, car ownership, or miles travelled, which in turn allows for different explanations of the effects found.

Despite these methodological challenges, diverse studies focus on the interplay between interventions, habit and life events. They found that interventions are more effective in case of strong habits (Eriksson et al. 2008, Garvill et al. 2003) or within stable life situations (Schäfer et al. 2012), that habit has no effect at all (Bamberg 2006, Walker et al. 2015, Langweg 2007), and that reflection on travel behaviour appears at all points during the process of relocation (Stanbridge and Lyons 2006). This last finding suggests to understand travel behaviour change related to residential relocation and travel-related intervention as a stepwise sequence of different phases.

219 Stage-based models including motivation, contemplation and preparation prior to behavioural change

220 Any motivation to (not) change travel behaviour in any certain direction results from the complexity

and meaning of eventual changes in a person's life. Referring to what has been said about the

relation of residential relocation and travel behaviour, the chance to influence travel behaviour of

- 223 house movers through information and incentive-based intervention vitally relies on a pre-existing
- disposition towards sustainable travel or a general interest in reconsidering one's travel behaviour.
- That chance is apparently small, as illustrated by studies showing that respondents do not tend to
- 226 opt for travel-related measures when they can choose between interventions targeted to various
- domains of behavioural change (e.g. Lally et al. 2010, Verplanken and Roy 2016). People favour
- 228 behavioural changes regarding for example diet, snacking, consumption, waste, water use, or energy
- use over changes in travel behaviour. The difficulty in changing travel behaviour as compared to
- 230 other behavioural domains stems from its high path dependency, its strong interconnectedness with
- 231 spatial structure, and its interweaving with the activities of other household members.

Further evidence is provided by work finding no or only marginal effects on travel behaviour when controlling for change motivation, i.e. for holding motivation constant (Eriksson et al. 2008, Bamberg 2013a, Bamberg et al. 2015). Bamberg (2006, 2007) also statistically tested the impact of motivation and found that high motivation enhanced the intervention's effectiveness.

236 To understand the role of pre-existing motivation in more detail, an increasing number of travel 237 behaviour studies conceptualizes behavioural change as a stepwise cognitive process. Most of these studies refer to the so-called Transtheoretical Model (TTM), originally developed by Prochaska and 238 239 Velicer (1997) for analysing health behaviour. The authors identified five consecutive stages of 240 behavioural change, i.e. precontemplation, contemplation, preparation, action and maintenance. The 241 rising consideration and intention, described by the stages of contemplation and preparation, has 242 empirically been captured in various ways in travel-related research. Biehl et al. (2018) asked directly 243 if respondents have contemplated making a routine trip using a specific mode and if they consider using this mode in the near future as realistic. Thigpen et al. (2015) identified consideration and 244 likelihood of increased cycling by asking "Have you thought about bicycling to campus?" and "How 245 likely are you to bike to campus in the next six months?". Bamberg (2013a, 2015) developed a more 246 integrative framework, called stage model of self-regulated behaviour change (SSBC), combining 247 248 elements from the model of action phases (MAP, Gollwitzer 1990), the theory of planned behaviour 249 (TPB, Ajzen 1991) and the norm activation model (NAM, Schwartz and Howard, 1981). He asks for 250 respondents' current travel behaviour and car-use goal for the next four weeks (decrease, increase, 251 unchanged) to assess four stages of behavioural change, i.e. predecision, preaction, action and postaction. Interestingly, this stage model suggests that interventions should be tailored to the specific needs of people in certain stages to be more successful. For people in the preactional stage Bamberg (2013a: 158) recommends "interventions that support them in selecting a specific action. Interventions that provide credible information about the availability of different behavioural alternatives as well as their pros and cons may be effective in this stage." Bamberg (2009) understands stated interest in information about the availability of an effective in the stage.

- information about alternative modes as an indicator for subjects' orientation towards alternative
- travel modes that, facilitated by the perception of attractive travel options and perceived behaviouralcontrol, mark the entrance into the preactional stage.
- 260 These findings are relevant for our own study in a twofold way. First, we argue that interest in an 261 intervention as described by Bamberg (2013a) can be understood as indicator for entering or being in 262 a preactional stage. In a review of travel-related marketing campaigns for new residents he found that 263 this interest is often already apparent long before the actual move and that its intensity is dependent 264 on the perceived context change (Bamberg 2009: 9, 127). This is in line with Scheiner's (2006: 289) 265 concept of "spatial mobility as process", which considers the spatial and social structures prior to the 266 move as crucial for the subsequent behavioural change. Second, to the best of our knowledge, there 267 is no study yet, that systematically assesses predictors of these preparation and preactional stages 268 preceding the actual behavioural change. Thus, we aim to explore what factors are at play for people 269 reconsidering their travel behaviour and being interested in behavioural alternatives.
- 270 Hypotheses
- 271 Hypotheses have been derived from literature review. The habit discontinuity approach and respective
- empirical findings suggest that movers are more open to changing travel behaviour than non-movers.
- 273 Additionally, the mobility biography approach and empirical findings suggest that the occurrence of
- 274 changes in life also impose a greater openness towards alternative behaviour options. Thus, we
- 275 hypothesize: residential relocation and the occurrence of life changes independently enhance interest
- in a proposed intervention promoting more sustainable travel options, while there might also be an
- 277 additional positive interaction effect (Hypothesis 1).
- 278 Furthermore, we wanted to simultaneously explore the predictive power of individual and structural 279 variables in predicting the interest in alternative travel options. Individual variables were represented 280 in this study by the consideration to reduce car use and by mobility habit strength; structural variables 281 were represented by perceived accessibility. Due to empirical evidence showing the relevance of some 282 consideration to behave differently for the success of a soft-policy intervention, we expected 283 participants to be more open to change their travel behaviour the more they considered a reduction 284 in car usage. Following the habit discontinuity approach, despite the ambiguity of relevant empirical 285 findings, we expected the interest of participants in the intervention to increase with weaker mobility 286 habit strength. We furthermore expected participants to be more interested in the intervention the better they perceive the structural conditions, i.e. perceived destination accessibility, to be. Thus, we 287 288 hypothesize: low mobility habit strength, high consideration to reduce car use, and high perceived 289 accessibility independently enhance openness to change one's travel behaviour, while the effect of 290 perceived accessibility might additionally be qualified by low mobility habit strength and a high 291 consideration to reduce car use (Hypothesis 2).
- The approach chosen here is explorative in two ways. First, to the best of our knowledge it is the first study defining interest in an intervention, assumed to represent a preactional stage of behavioural

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change, as a dependent variable. Second, the research question on predictors of interest into a travel-295 related intervention is part of a broader project that at its core focusses on the process of habit change 296 during relocation and its implication for travel behaviour (Thronicker 2015).

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#### 3. Methods 298

299 A survey entitled "Housing and mobility - enhancing quality of living in the city" was conducted among 300 residents and movers in Leipzig, a city of about 500,000 inhabitants in Germany. The survey was part 301 of a quasi-experimental pre-post field experiment focussing on habit change and its implications on 302 travel behaviour during residential relocation (Thronicker, 2015). While the analysis of the 303 experimental design used the data of 357 subjects who also participated in the post-measurement, 304 the present analysis used the data of the total of 758 subjects who participated in the pre-305 measurement. Theoretical reasoning and empirical evidence stress the sensitive phase prior to an 306 anticipated event as being particularly important in terms of preparatory activities and decisions 307 determining behaviour after the event. Based on their comprehensive interview data on life events as 308 windows of opportunity for (travel) behaviour change, Schäfer et al. (2012) conclude that "the period 309 before the life event seems to be very crucial" (p.81). The qualitative work by Stanbridge and Lyons (2006) yielded the impressive number of about 70% of movers who had "travel most on their mind" 310 311 before they accept an offer for a property (p.10). Likewise, Scheiner (2005, 2006) argues that relocation 312 is a process that starts long before the actual change of residence. Thus, we proceed on the assumption 313 that those who prepare residential relocation can be considered movers already before they actually 314 move. Although pre-move data is vital to the study of a relocation-induced window of opportunity, to 315 our knowledge, only Bamberg (2006) contacted movers prior to their move.

316 In this study, movers were contacted via housing agencies when they showed up at the agency to sign 317 the rental contract for their new apartment. Movers filled in the questionnaire about three months 318 prior to their move (mean = 43 days, s = 30 days, min = 1, max = 116). The housing agencies also 319 contacted residents who had been living in their apartment for at least three years and did not plan to 320 move.

321 Table 1 compares the overall sample with two assumingly representative samples of the city. Movers 322 of the present sample were younger than residents, which is an expected finding. About 75% of 323 residential relocations in the present sample were inner-city moves. Gender, age, marital status, 324 education, income, and car use (modal split) have been included as control variables into the binary 325 regression models (Tables 3 and 6).

Subsamples		amples	es Sample of		Sample city of	
	Mover (N=186)	Non-Movers (N=572)	study N = 758	2008	2008	
Age & Gender (%)						
18-20	12	0,2	3	25	01	
21-30	40	21	25	25	21	
31-40	16	9	11	35	33	
41-50	9	11	11	55		
50 -65	16	20	19	<b>41</b>	46	
>65	8	39	31	71	40	
Women	59	58	58	53	52	
Marital Status (%)						
single	68	59	61	1 0*	1 7*	
partnership	32	41	39	1.7	1.7	
Education (highes	t exam) (%)					
school exam	37	26	29	n/a	n/a	
occupation/	40	70	70			
study exam	02	73	70			
Income (%)						
< 600 Euro	23	14	16	n/a	n/a	
600-1000 Euro	25	30	29			
1001-1500 Euro	22	25	25			
1501-2000 Euro	14	17	16			
2001-3000 Euro	13	11	11			
> 3000 Euro	2	3	3			
Permanent availa	bility of (%)					
car	59	61	60	40	36	
season ticket	54	33	38	n/a	n/a	
bike	80	72	74	75	n/a	
Modal Split (%)						
	31	30	30	39	45	
car	(s=.33)	(s=.33)	(s=.33)			
	24	22	22	19	23	
public transport	(s=.25)	(s=.26)	(s=.26)			
	14	12	13	14	32	
bike	(s=.23)	(s=.21)	(s=.22)			
	00	2/		27		
foot	32	30 (c= 27)	35 (c= 26)	27		
	(5=.24)	(5=.27)	(5=.20)			

| \* mean household size

Table 1 Description of sample (age, gender, marital status, education, income, mobility tools, modal
 split), compared to samples of representative surveys (SrV= Mobility in Cities - System of

Representative Travel Surveys (Ahrens 2009) and statistical data provided by the city of Leipzig (Stadt Leipzig 2012))

330

The intervention consisted of a mobility package called "Your mobility package 'On the way in Leipzig.'" 331 332 It contained information to use public transport, car sharing, and cycling in Leipzig as well as the 333 possibility to order a free one month ticket for public transportation, a free three months membership 334 at car sharing and limited free usage, and a free bike check-up and bike city map. Participants could 335 order all of these options. The package was constructed for the purpose of this study and offered in 336 cooperation between the municipality and the research institute. Together with the survey, 337 participants received a separate sheet of paper that informed them about the content of the mobility 338 package. On the sheet, participants could indicate, whether or not they would like to receive a package. 339 If they were interested, they were asked to provide their current and their new address as well as the 340 date of their move. The package was sent to the current address. Only in case the move was within the next two weeks, the package was sent two weeks after the move to the new address. 341

342 The following variables were assessed:

343 Predictor variable 1: Residential relocation. Via housing agencies we contacted both residents who had

344 been living in their current home for at least three years and who had indicated that they were not

345 considering relocation, and movers when signing the rental contract for their new apartment, i.e.

346 about three months prior to their actual move. Places of residence and relocation destinations were

347 located in the inner districts of the city (Fig. 1).



348

Fig. 1 Districts of the city of Leipzig (Stadt Leipzig 2012), coloured districts indicate study area, i.e.
 place of residence (residents) and destination of relocation (movers)

351

352 Predictor variable 2: Current life changes. Within the explorative approach applied here, we aimed to 353 record any current change in different life domains suggested as being relevant by previous research 354 (for a review Scheiner and Holz-Rau 2013b, Müggenburg et al. 2015). Also, while stressing proximity 355 of the event in question, we explicitly allowed for any sequence of events. Residents responded to the 356 question "From time to time things change in life. Have there been any changes in your life recently, 357 or are there any approaching?" There was a choice of potential family-, work/education-, and mobility-358 related changes (Table 2). Movers responded to the question "How did your residential relocation 359 come about?" and were offered the same list of circumstances, and in addition housing- and

- 360 neighbourhood-related circumstances that might also provoke a residential relocation (Table 2). A pre-
- test and the evaluation of answers to the open "other"-category did not reveal further events.

Desent or environshing changes in life (referring	Additional circumstances not ontially provolving				
Recent or approaching changes in life (referring	Additional circumstances potentially provoking				
to residents), or circumstances potentially	a residential relocation (referring to movers).				
provoking a residential relocation (referring to					
movers), respectively.					
<ul> <li>movers), respectively.</li> <li>Family-related changes/circumstances: <ul> <li>Move-in with partner</li> <li>Move-out/separation from partner</li> <li>Birth or move-in of child</li> <li>Move-out of child or other person</li> <li>Illness/accident</li> </ul> </li> <li>Work/Education-related</li> <li>changes/circumstances: <ul> <li>New workplace/place of education</li> <li>More/less working hours</li> <li>Termination of work/education (retirement, job termination, graduation)</li> <li>Higher/lower income</li> </ul> </li> <li>Mobility-related changes/circumstances: <ul> <li>Availability of a car</li> <li>Non-availability of a car</li> <li>Driving licence</li> </ul> </li> </ul>	<ul> <li>Mobility-related circumstances:         <ul> <li>Poor provision with shops and facilities in the neighbourhood, e.g. groceries, authorities, local surgeries, schools, kindergarten.</li> <li>Poor provision with options for cultural and leisure activities</li> <li>High travel costs</li> <li>Poor access to public transport</li> <li>High distance to important places/persons (place of work/education, local surgeries)</li> </ul> </li> <li>Housing- and neighbourhood-related circumstances:         <ul> <li>Size of residential unit</li> <li>Barrier-freedom</li> <li>Poor housing conditions</li> <li>High rent</li> <li>High vacancy rates</li> <li>Trouble with landlord</li> </ul> </li> </ul>				
New season ticket	Poor environmental quality				
Disposal of season ticket	Poor environmental quality				
Other, namely: [open answer]	High criminality				
	Poor neighbourhood				
	Poor image of city district				

Predictor variable 3: Mobility habit strength was assessed by four items of the Self-Report Habit Index 364 365 (SRHI; Verplanken and Orbell 2003). Participants were asked for the most frequently used travel mode 366 for the most frequent trip of the last month, and then reported on 7-point scales ("strongly agree" to 367 "strongly disagree") to the items: "The travel mode just mentioned ... I use automatically for that trip.", 368 "... I use for that trip without having to plan beforehand.", "... I use for that trip without thinking whether I could use another travel mode.", "... is typical for me." (Cronbach's alpha = .75). The 369 370 distribution of individual scores was expectedly positively skewed. The scores were logarithmized and 371 reversed, then ranged from 0 to 2 with high numbers representing a strong habit. Given the line of 372 argumentation of the habit concept, any mobility habit, i.e. regardless of the transport mode it refers 373 to, should be weakened during relocation. In theory, the habit concept as such is unspecific in terms 374 of current mode choice. However, since the intervention is mode-specific, a dichotomous variable 375 coded whether a person expressed a car related habit (1) or a non-car related habit (0), i.e. a habit 376 referring to cycling or public transport use.

Predictor variable 4: *Consideration to reduce car use* was assessed by a 5-point scale ("strongly agree")
to "strongly disagree") in response to the item "I wonder whether I maybe should reduce my car usage
[for movers: at the new living place]". The item was chosen according to Stanbridge & Lyons (2006)
and Bamberg (2013a). High numbers represent strong consideration.

381 Predictor variable 5: *Perceived accessibility by eco-modes*. We focused on the accessibility of 382 individually relevant destinations (Ewing and Cervero 2010, Curl et al. 2015) by public transport,

<sup>362</sup> Table 2 Current life changes and circumstances potentially provoking a residential relocation as363 requested in the survey.

383 cycling, and walking. Objective measurements of destination accessibility differ considerably from 384 subjective perceptions (Curl et al. 2015). But since the latter is central to understanding individual 385 behaviour, subjectively perceived accessibility related to respondents' current place of residence was 386 measured. The choice of pre-move accessibility patterns is in line with our understanding of 387 behavioural change as stage-based process. Since we focus on the pre-actional phase of behavioural 388 change, indicated by an interest in the mobility package, the impact of current circumstances for 389 anticipating the residential move and post-move travel behaviour (Scheiner 2006: 289, figure 1), is 390 crucial to our analysis. This is particularly true, when interpreting the concept of 'state dependence' 391 (Beige and Axhausen 2012) in a way that people aim to act in the future similar how the act currently. Participants responded using 5-point scales ("very unsatisfied" to "very satisfied") to six items: 392 393 "Opportunities to get things done by ... walking.", "... cycling.", "... using public transport.", 394 "Accessibility of place of work/education by public transport.", "Accessibility of downtown by public 395 transport.", "Provision of shops and facilities in the neighbourhood, e.g. groceries, authorities, local 396 surgeries, schools, kindergarten". Since the distribution of average scores was, as expected, positively 397 skewed, the scores were reversed, logarithmized, and back-reversed, then ranged from 0 to 2 with 398 high numbers representing high perceived accessibility.

399 Outcome variable: *Interest in a mobility package promoting the use of eco-modes*. Separately attached 400 to the survey, participants were asked to indicate whether or not they would like to receive the 401 mobility package. Stated interest into the package implies that the person is aware of alternative travel 402 options, generally perceives behavioural control to use them, and has a basic orientation towards their 403 usage. Hence, we perceive stated interest in receiving the mobility package as a behaviour-based proxy 404 for a basic openness to use more sustainable modes of transportation, i.e. to enter the preactional 405 stage of behaviour change.

406

#### 407 **4. Results**

408 This section presents the results of the analyses for both hypotheses.

409 Predictors of interest: life changes versus residential relocation

410 Hypothesis 1 assumed that residential relocation and the occurrence of life changes independently 411 enhanced interest in receiving a mobility package, and that there might be an additional positive 412 interaction effect. 93 movers (50%) and 254 residents (44%) were interested in receiving the Mobility 413 Package (MP). Residential relocation (yes/no) and the occurrence of life changes (yes/no) were 414 significantly related to each other, sharing about 6% of variance (N=758, r=.244, 95% BCa CI [.176, 415 .314], p<.01). A first logistic regression model on interest (yes/no) indicates that neither relocation nor 416 life changes predicted interest (Table 3). However, the interaction term suggests that life changes in 417 combination with a residential relocation significantly and clearly reduced the odds in terms of 418 interest. The model fit, however, was small.

419

					95% BCa CI f	95% BCa Cl for Odds		
			Odds Ratio		Ratio/EXP(B)			
	В	SE(B)	Sig.	Exp(B)	Lower	Upper		
Gender	.126	.162	.437	1.135	.825	1.559		
Age	078	.055	.157	.925	.831	1.030		
Marital Status	071	.190	.711	.932	.641	1.354		
Education	.182	.189	.334	1.200	.829	1.738		
Income	.092	.076	.227	1.096	.944	1.272		
Modal Split Car use	460	.258	.074	.631	.381	1.046		
Relocation (yes/no)	.132	.211	.530	1.141	.755	1.724		
Life changes (yes/no)	042	.201	.835	.959	.646	1.422		
Life changes by relocation	943	.401	.019	.389	.177	.855		
Constant	.076	.288	.793	1.079				

R<sup>2</sup><sub>CS</sub>=.02 (Cox & Snell) R<sup>2</sup><sub>N</sub>=.03 (Nagelkerke) R<sup>2</sup><sub>L</sub> = .87 (Hosmer-Lemeshow), Model X<sup>2</sup>(9)=15.65. p=.075

#### 420

421 Table 3 Coefficients of the models predicting whether a participant was interested in receiving a

422 mobility package, N=734 [95% BCa bootstrap confidence intervals based on 1000 samples]. The

423 availability of a public transport pass did not affect the model.

424 To better understand the results, we explored the relation and impact of different life changes and 425 circumstances provoking residential relocation. 253 residents (44%) reported current life changes, and 426 177 movers (95%) reported circumstances provoking their move (Fig. 2). Movers mentioned family, 427 work, or mobility related changes almost twice as often as residents did, but just as often as housing 428 or accessibility related reasons to move. Maybe, as soon as the family, work, or mobility related 429 changes result into the decision to move - and thus possibly solve the associated challenges - an 430 additional adjustment of travel behaviour is no longer necessary, resulting in not being interested into 431 a mobility package. However for residents, the challenges might not yet be resolved. And as far as they 432 entail mobility relevance there may be still a basic openness to change behaviour, which is reflected 433 by an interest into the mobility package.



434

435 Fig. 2 Percentage of residents and movers with and without interest into the intervention who

436 reported different types of life changes or reasons to move. Multiple answers were possible.

437 Family-, work-, and mobility-related life changes (N=572 residents) were significantly positively related 438  $(r_{family-work}=.332, 95\% \text{ BCa CI} [.246, .418], p<.001, r_{family-mobility}=.210, 95\% \text{ BCa CI} [.125, .298], p<.001, r_{work-1}=.210, r_{wo$ mobility=.244, 95% BCa CI [.151, .333], p<.001). In contrast, concerning reasons to move (N=177 movers), 439 440 only work- and mobility-related circumstances appeared to be associated (Table 4). The correlation 441 results motivated analysis of the regression of interest on the domains of life changes. Controlling for 442 age, gender, and car use, the different domains of changes did not predict interest (for movers: p-443 values were above .18, for residents, p-values were above .12). Interestingly, car use decreased the 444 odds in terms of interest for movers (Exp(B)=.368, p=.041, b= -.999, BCa CI [-2.152, -.059]), but was of 445 no effect on interest for residents (Exp(B)=.743, p=.280, b= -.297, BCa CI [-.858, 257]). 446

	Work related	Mobility related	Housing related
Family related	<b>097</b> [247, .072]	046 [271, .101]	.122 [024, .261]
Work related		.254** [.111, .398]	<b>169</b> * [.001, .074]
Mobility related			.140 [.000, .286]
Note. * p < .05 ** p < .01			

- 447 **Table 4** Correlation of domains of reasons to move (N=177, 95% BCa CI based on 1000 samples)
- 448

#### 449 Predictors of interest: personal variables versus structural variables

450 Hypothesis 2 assumed that low mobility habit strength, high consideration to reduce car use, and high

451 perceived accessibility independently enhanced interest in a mobility package, and that the effect of

452 perceived accessibility might be intensified by low mobility habit strength and high consideration to

453 reduce car use. Correlation of the predictor variables are displayed in Table 5.

	2	3	4	5
1 Perceived accessibility by eco-modes	.122*	009	185**	.095*
	[.051, .199]	[089, .074]	[256,113]	[.018, .168]
2 Mobility habit strength		096*	149**	075
		[165,031]	[225,073]	[152, .008]
3 Consideration to reduce car use			.186**	.101*
4 Relocation (yes/no)			[.104, .261]	[.024, .175] .225**
5 Life changes (yes/no)				[.152, .293]
Note. * p < .05 ** p < .01				

- 454
- Table 5 Correlation of perceived accessibility, mobility habit strength, consideration to reduce car
   use, relocation, and life changes (N=647, 95% BCa CI based on 1000 samples)
- 457

458 A second logistic regression model on interest (yes/no) including the additional predictors perceived 459 accessibility by eco-modes, mobility habit strength, and consideration to reduce car use was 460 conducted. Since the habit concept is *un*specific in terms of the current travel mode and suggests that 461 any mobility habit weakens during relocation, we applied the predictor habit strength no matter the 462 mode it referred to. The analysis indicates that perceived accessibility enhanced the odds regarding 463 interest in a mobility package (Table 6). Habit strength and consideration unexpectedly yielded no 464 effect, neither directly nor indirectly as a moderator to perceived accessibility. The data suggest that 465 participants who perceived accessibility by eco-modes to be satisfactory had a higher chance of being 466 interested in a mobility package on eco-modes, regardless of their habit strength, their level of 467 consideration to reduce car use, whether they relocated or experienced life changes, and even 468 regardless of their current amount of car use. The model fit was small.

469 While the habit concept is unspecific in terms of the current travel mode, the mobility package 470 specifically promotes the use of non-car travel modes. Therefore, we conducted the regression analysis 471 again only with participants who indicated a car habit (N=223). Results show that no predictor yielded 472 a significant influence on interest ( $R^2_{CS}$ =.03 (Cox & Snell)  $R^2_N$ =.04 (Nagelkerke)  $R^2_L$  = .210 (Hosmer-473 Lemeshow), Model  $X^2(13)=6.67$ . p=.918). We then conducted the same regression model with only 474 participants who indicated a non-car habit (N=380). It yielded a significant influence of age (Exp(B)=.85, 475 95% CI [.73, .99], p=.034) and of perceived accessibility ((Exp(B)=1.99, 95% CI [1.01, 3.90], p=.046) 476 (Model fit  $R^2_{CS}$ =.06 (Cox & Snell)  $R^2_{N}$ =.07 (Nagelkerke)  $R^2_{L}$  = .63 (Hosmer-Lemeshow), Model 477 X<sup>2</sup>(13)=21.52, p=.063).

				Odds Ratio	95% CI f	or EXP(B)
	В	SE(B)	Sig.	Exp(B)	Lower	Upper
Gender	.016	.174	.926	1.016	.722	1.430
Age	089	.059	.132	.915	.814	1.027
Marital Status	079	.203	.699	.924	.620	1.377
Education	.191	.204	.349	1.211	.811	1.808
Income	.099	.082	.229	1.104	.940	1.297
Modal Split Car use	435	.293	.137	.648	.365	1.149
Relocation (yes/no)	032	.221	.884	.968	.628	1.493
Life changes (yes/no)	.172	.179	.338	1.187	.836	1.686
Perceived accessibility	.485	.260	.062	1.625	.976	2.705
Habit strength	.141	.144	.330	1.151	.867	1.527
Consideration	.000	.066	.998	1.000	.878	1.139
Perc. accessibility by habit strength	171	.391	.663	.843	.391	1.816
Perc. accessibility by consideration	263	.181	.146	.769	.539	1.096
Constant	.033	.307	.914	1.034		

 $R^{2}_{CS}$ =.03 (Cox & Snell)  $R^{2}_{N}$ =.04 (Nagelkerke)  $R^{2}_{L}$  = .89 (Hosmer-Lemeshow), Model X<sup>2</sup>(13)= 18.44, p=.142

478 **Table 6** Coefficients of the model predicting whether a participant was interested in receiving a

479 mobility package, N=636 [95% BCa bootstrap confidence intervals based on 1000 samples]. The

- 480 availability of a public transport pass did not affect the model.
- 481

#### 482 **5. Discussion**

This section summarizes the findings and discusses them regarding the role of residential relocation for travel behaviour change against the conceptual assumptions illustrated in the literature review. It results in a suggestion to consider the mobility relevance of a residential relocation and other life events as a criterion indicating a window of opportunity for behaviour change interventions.

- In answer to the hypotheses, life changes in combination with a residential relocation clearly reduced
  the odds regarding interest in a mobility package. Personal variables, i.e. mobility habit strength and
- 489 consideration to reduce car use, were of no predictive power in terms of interest, while an increase of
- 490 the structure-related variable perceived accessibility seemed to enhance the odds regarding interest.
- 491 Before interpreting the findings, two limitations have to be mentioned. First, the model fit of the binary
- 492 regression models applied to predict interest in a mobility package were small. Therefore, in our
- 493 interpretation of the results we focused on the confidence intervals of specific predictors. Second, the
- 494 spatial and infrastructural variation accompanying the inner-city relocations considered was limited.
- 495 Notwithstanding the similarity of the situation before and after relocation we found that half of our
- 496 sample of movers ordered a mobility package. This suggests even more promising findings for moves
- 497 between more contrasting spatial and social arrangements.
- 498 Relocation, life events and behavioural change
- 499 To interpret the unexpected finding that half of the sample of movers did *not* order a mobility package,
- 500 and thus did not indicate to be in a preactional stage of travel behaviour change, as well as the finding
- 501 that perceived accessibility was the only predictor of enhanced interest, we reflect our results against
- 502 the assumptions on the role of relocation for travel behaviour.
- 503 A) In the view of relocation being the consequence of other, mobility relevant changes, moving house 504 can be understood as part of the solution towards the challenges that are caused by family-, work-, or 505 mobility related changes in one's life. If these challenges are expected to be resolved by moving house, 506 maybe including anticipated adjusted travel behaviour, a rejection of further information or additional 507 behaviour change seems reasonably (Schäfer et al. 2012). This interpretation is supported by our 508 finding that, at the time when the new rental contract already had been signed, relocation was 509 associated with lower habit strength and higher consideration to reduce car use, but under the 510 condition of accompanying life changes with a clearly reduced interest into the mobility package. 511 Interventions to steer mobility behaviour of movers who relocate in order to solve a personal mobility 512 relevant issue have to be implemented much earlier in the process of considering relocation and follow 513 an individual consulting approach. Certainly, we apply an analytical view at the "pure" causal chains. 514 In reality, a mobility problem might be solved only partly or only for some trips by relocating.
- 515 B) In the view of relocation being *mediator* of other changes, moving house is induced by 516 circumstances that entail no mobility relevance themselves, e.g. enlarging the size of the apartment, 517 but via self-selection or adaption processes in terms of the new living place still affect travel behaviour 518 (Kley 2011, Klinger 2017). The finding that relocation, habit strength, and consideration yielded no 519 effect on interest seems coherent given that self-selection and anticipated adaption should have been 520 settled at the time of the survey, while post-move adaption could not yet have taken effect. In addition, 521 the majority of movers relocated within the inner city and, thus, encountered virtually constant public social norms and infrastructural conditions. Therefore, significant behavioural self-selection or 522 523 adaption processes are not to be expected (Scheiner and Holz-Rau 2013b). Given that residential 524 relocation might well be experienced as emotional or cognitive stress (Schäfer et al. 2012), mobility 525 habits could also be expected to strengthen in order to compensate for the mental load, and thus 526 impede a behaviour change (Busch-Geertsema 2018, Neyer and Lehnart 2015, Thøgersen 2012, 527 Verplanken et al. 1994). Although our data do not confirm this assumption and rather indicate a weakening of habit strength due to relocation, we found that car users among movers were 528 529 significantly less interested into the mobility package. Car use among residents had no effect on

530 interest. That finding might indicate that house-moving car users were not in a preparational 531 (Prochaska and Velicer 1997) or preactional (Bamberg et al. 2013a) stage of behavioural change, 532 whereas these people are supposed to be the target group of the intervention. Also, the impact of 533 perceived accessibility on interest possibly indicates an affirmation of existing travel orientations (see 534 interpretation of intervention as last-push by Bamberg 2006). This is in line with the finding of state 535 dependence, i.e. previous travel behaviour is a strong predictor of current travel behaviour, even in 536 the course of key events (Beige and Axhausen 2012). In sum, it might be argued that the point of time 537 the mobility package was offered was either too late or too early: Too late, because the new place of 538 residence has already been chosen. Too early, since various relocation studies show that some time 539 after a move a period of re-considering and adjusting behavioural patterns is likely to occur (Axisa et 540 al. 2012).

541 C) In the view of relocation being a *correlate* to changes in travel behaviour, both are triggered by a 542 third variable, e.g. the birth of a child. Our results support the interpretation that changes in life that 543 involve the necessity to move house, but also entail mobility relevance may well lead to weakened 544 habits and higher consideration of travel-related issues. When looking for a solution for the mobility-545 related issue high perceived accessibility by eco-modes may encourage individuals to take the use of 546 eco-modes into consideration and order a mobility package. Here, individual attention is given to the 547 original change in life, while relocation appears to be a by-effect.

548 Overall, the interpretation of the results against the assumptions concerning the role of relocation for 549 travel behaviour emphasizes that relocation as such does not reveal much about its subjective mobility 550 relevance. The importance and variety of the underlying changes in life are too critical to be neglected 551 when aiming to efficiently place soft-policy interventions to change travel behaviour. Eventually, the 552 high amount of interested people among movers and residents and the difficulties to predict that 553 interest point at the challenge to transfer individual mobility relevance into systematic behaviour 554 change interventions.

#### 555 Subjective mobility relevance

556 Subjective mobility relevance provides an alternative angle to the question of what predicts openness 557 to change one's travel behaviour, i.e. what opens the window of opportunity for soft-policy 558 interventions. Mobility relevance means the presence of a perceived mobility-related issue that 559 subjectively requires attention. It translates a change in life, i.e. any event, long-term decision, or 560 process into a mobility key event (Klöckner 2005, Müggenburg et al. 2015), regardless of its causal 561 relation with travel behaviour. According to the presented data and our interpretation, not all 562 residential moves entail mobility relevance. For example, a residential relocation from countryside to 563 city might be mobility relevant for movers due to considerable changes in infrastructure and 564 accessibility patterns (Bamberg 2007 (Munich), Schäfer et al. 2012 (Berlin), Bamberg 2006 (Stuttgart), 565 Scheiner and Holz-Rau 2013b). At the same time, other events enter the limelight. Changes in 566 infrastructure as such can yield mobility relevance, too (Walker et al. 2015, Graham-Rowe et al. 2011, 567 Möser and Bamberg 2008, Fujii et al. 2001, Prillwitz et al. 2007, Marsden and Docherty 2013, Clark et 568 al. 2014), but also changes beyond structural conditions. A new job can turn out to be mobility relevant, 569 for example due to the employer's strong vision or employees' social norm of using eco-modes 570 (Schuppan ongoing work). Importantly, also changes in social roles or identities might be mobility 571 relevant due to changed values, e.g. being a caring parent or employee/retiree of a specific company 572 (Schuppan ongoing work, Jaeger-Erben 2010, Klinger 2017). Finally, processes of personal 573 development might also become mobility relevant, e.g. due to changed priorities, values, attitudes, 574 goals, or lifestyle. The idea that mobility relevance instead of relocation as such may indicate a more 575 specific window of opportunity to change travel behaviour has already been theoretically elaborated 576 by other scholars (e.g. Müggenburg et al. 2015), but finds empirical support in the data presented here. 577 Thus, we suggest mobility relevance should be regarded as a criterion which helps to bridge the 578 individual and structural factors influencing travel behaviour after a residential relocation by activating 579 a cognitive process that leads to a change or reinforcement of the previous behaviour. In line with 580 these considerations, our study found evidence for both personal influences (life events) and structural 581 ones (perceived accessibility). Because of the study's explorative character, an assessment of the 582 relative importance of personal and structural factors with regard to their mobility relevance is not 583 possible and open for further research.

584 585

#### 6. Conclusion and future research

586 In sum, half of the participants in our sample were interested in the mobility package, which we 587 understand to indicate a preactional stage of behavioural change. Interest was reduced for movers 588 who reported changes in their personal life or who mainly used the car, and enhanced with stronger 589 perceived accessibility by environmentally friendly travel modes.

590 The findings of our exploratory study might encourage further research in at least two directions. First, 591 as an indicator of a window of opportunity to implement information and incentive based 592 interventions to change travel behaviour, we suggest looking for life changes with high mobility 593 relevance evolving from their individual and structural circumstances (such as attitudes, social norms, 594 accessibility patterns, and infrastructure provision). Relocation can, but does not necessarily entail 595 mobility relevance. To deliver an intervention to movers without controlling for the mobility relevance 596 of the move is similar to giving cough medicine to everyone going to see a doctor. Second, the 597 behaviour suggested by the intervention needs to be perceived as an attractive way to tackle the 598 mobility issue the receiver presumably faces. Future research on travel behaviour change during 599 residential relocation should adopt interventions that are tailored to the specific individual and (new) 600 structural context of movers.

601 Practitioners are well-advised to (a) look for indicators of mobility relevance to define a target group 602 for the intervention, e.g. people that are affected by severe changes in infrastructure (e.g. due to 603 relocation from the countryside to the city or between different mobility cultures (Klinger & 604 Lanzendorf 2016), varying socioeconomic circumstances, or transport disruption), social roles, 605 identities and norms (e.g. due to belonging to another social group), or their system of values and 606 priorities (e.g. due to illness or new responsibilities). Furthermore, we suggest (b) to make sure the 607 intervention promotes a truly attractive behavioural option. The research community is advised to 608 develop a measure of mobility relevance to identify changes in life that are likely to be relevant for 609 one's travel behaviour, and to test its effect on openness to change travel behaviour. In doing so, empirical work needs to develop adequate scales to capture the mobility relevance arising from the 610 611 individual and structural factors and processes linked to life changes. Since there is variation among 612 different geographical and cultural frameworks with regard to what is adequate and crucial for defining 613 mobility relevance, we would like to encourage more studies on social and spatial factors influencing 614 travel behaviour change within non-western contexts (Plyushteva & Schwanen 2018).

- 615 The empirical results in this study are rather weak. While the theoretical argumentation is the main
- 616 part of this study, the empirical part has been a first attempt to test the theoretical concept. In contrast
- to the current study, future research should also address movers after their move when they actually
- 618 experienced the conditions of the new place of residence. A comparison of movers who were offered
- a mobility package before their move with movers who were offered the package after the move would
- 620 be very helpful. Going beyond stated interest, research about the interrelation of being interested in 621 a package and actually changing travel behaviour remains most wanted. In general, we recommend a
- 622 more in-depth investigation of the mutual interdependence of between residential choice, travel
- 623 behaviour and interest in alternative travel modes.
- 624 Overall, we would like to encourage further research on ways to induce or enlarge mobility relevance 625 and thus to widen and deepen the window of opportunity for behavioural change.
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