





SONJA SPITZER | International Institute for Applied Systems Analysis DANIELA WEBER | Vienna University of Economics and Business MUJAHEED SHAIKH | Hertie School of Governance

#### **Belief and confidence**

affect behaviour in different life domains









#### SAVINGS & INVESTMENT

Based on LinkedIn data, Andersen et al. (2015) find that savers and financial planners are those who believe they are financially literate, not necessarily those who are informed. Mistaken beliefs about financial literacy are as important as actual financial literacy itself in explaining savings and investment.

#### EDUCATION & LABOUR MARKET

Reuben et al. (2015) show that individuals who are overconfident and overly competitive earn significantly more. In addition, gender differences in overconfidence and competitiveness explain 18% of the gender gap in earnings expectations.

#### INJURIES & ACCIDENTS

Overrating health is associated with riskier health behaviour (Arni et al. 2019). Older individuals that overestimate their physical ability are more prone to suffer fall-induced injuries (Sakurai et al. 2013). Confidence further influences the risk of car accidents (Preston & Harris 1965).

#### POLITICAL DECISIONS

Ortoleva & Snowberg (2015) show that overconfidence is a substantively and statistically important predictor of ideological extremeness, voter turnout, and partisan identification. Also, overconfident persons are more likely to emerge as leaders (Moore 2017).

#### Donald Trump And The Irresistibility Of Overconfidence



Forbes Leadership Forum Contributor ()

Leadership

News, Commentary, and Advice About Leadership

This article is by Don A. Moore, a professor of management at the University of California, Berkeley's Haas School of Business.



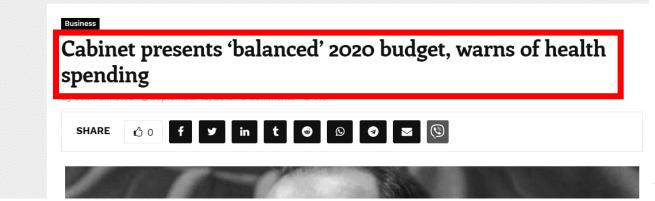
U.S. President Donald Trump speaks during a news conference. Photographer: Andrew Harrer/Bloomberg

## "Confidence is an unreliable signal of competence"

Prof. Don Moore in Forbes (2017)

## How does health perception affect healthcare utilisation?







Men much less willing than women to consult health professionals, according to National Pharmacy Association



Education Media Society Law Scotland Wales Northern Ireland

Offer cancer screenings during lunch breaks, report urges

NHS could tailor appointments so people don't have to take time off work under proposals

The New York Times

Growth of Health Care Spending Slowed Last Year



#### Effect of health perception on healthcare utilisation

is a priori ambigious

Individuals that **underestimate**their health might buy more medication or visit the doctor more often for medical attention and screenings in the short term...

...but as a result might end up healthier and thus visit the doctor less often

Individuals that **overestimate**their health might exercise more, which is shown to decrease healthcare utilisation (Rocca et al. 2015)...

...but they are also prone to suffer fallinduced injuries (Sakurai et al. 2013)

#### **Data**

SHARE

waves 2, 4, 5 and 6

**62,696**observations

**15** European countries

## Data & DEPENDENT VARIABLES

#### SHARE

waves 2, 4, 5 and 6

**62,696**observations

**15**European countries



**Mean:** 7.6 **Median:** 5.0

#### **DOCTOR VISITS**

"Now please think about the last 12 months. About how many times in total have you seen or talked to a medical doctor or qualified/registered nurse about your health? Please exclude dentist visits and hospital stays, but include emergency room or outpatient clinic visits."



Mean: €74 Median: 0

#### **OUT-OF-POCKET PAYMENTS**

"Did you pay anything yourself for your doctor visits (in the last twelve months)? Please also include expenses for diagnostic exams, such as imaging or laboratory diagnostics."

"Overall, how much did you pay yourself for your doctor visits (in the last twelve months), that is how much did you pay without getting reimbursed by (a health insurance/your national health system/ a third party payer)?"

## Data & EXPLANATORY VARIABLES

SHARE waves 2, 4, 5 and 6

**62,696** observations

**15**European countries

#### Self-reported vs. tested health

"Because of a health problem, do you have difficulty ...

... getting up from a chair after sitting for long periods?"



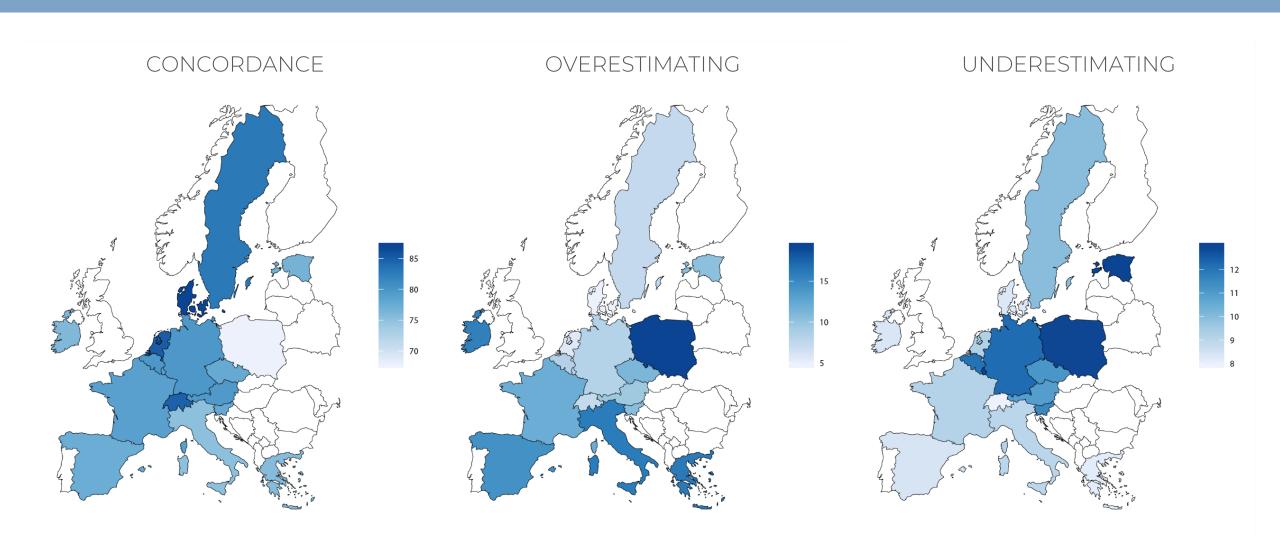
"The next test measures the strength and endurance in your legs. I would like you to fold your arms across your chest and sit so that your feet are on the floor; then stand up keeping your arms folded across your chest. Like this..."

#### Three possible outcomes

Self-reported measure = tested measure: Self-reported measure > tested measure: Self-reported measure < tested measure: concordance overestimating underestimating

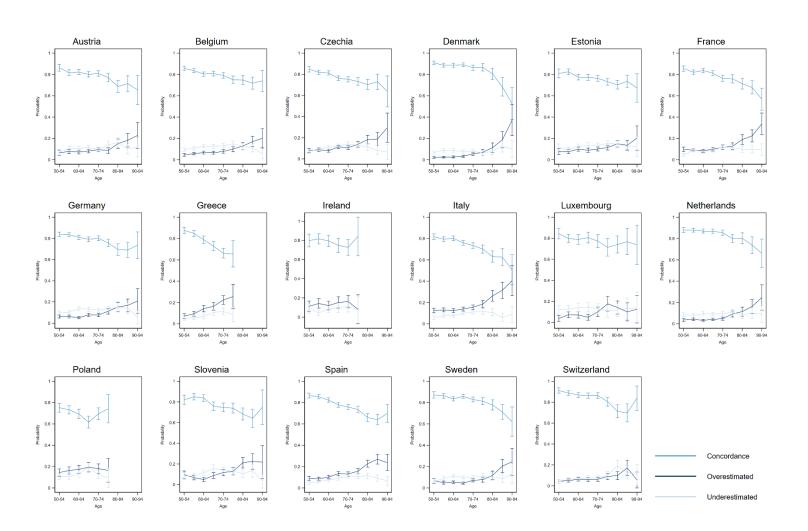
#### Health perception varies substantially in Europe

Predicted share of the population 50+ that reports health correctly, overestimates and underestimates health, after controlling for age, gender and education



#### Health misperception increases with age

Predicted shares of individuals that report health correctly, overestimate and underestimate health, after controlling for gender and education



#### **Method I**

#### **Reverse causation**

Regress health perception at wave w on healthcare use at wave w+1

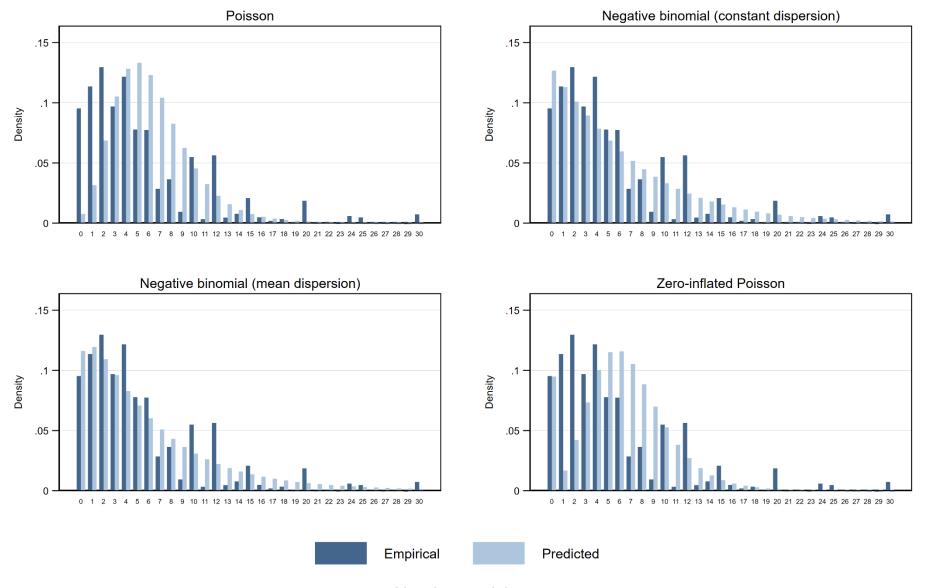
#### Right-skewed data with point mass at zero

- → Doctor visits (count data): Negative binomial model
- → Out-of-pocket expenditure: Log-Gamma model

$$DOCTOR_{i,w+1} \sim Poisson(\mu_{i,w+1}),$$

$$\mu_{i,w+1} = \exp(\beta \times \text{HEALTH PERCEPTION}_{i,w} + \gamma \times \text{HEALTH}_{i,w} + \delta \times X_{i,w} + \nu_i),$$
  
 $\exp(\nu_i) \sim \text{Gamma}(1/\alpha, \alpha)$ 

#### Count model comparison for the annual number of doctor visits in the unimpaired sample, i.e. able to stand up from the chair



No. doctor visits

#### **Method II**

Split sample into impaired and unimpaired according to chair stand test

#### **Control variables:**

- → **Health:** number of IADLs, number of chronic diseases
- → X: age, age squared, gender, educational attainment, household income, risk aversion, control dummies for survey wave and country of residence

$$DOCTOR_{i,w+1} \sim Poisson(\mu_{i,w+1}),$$

$$\mu_{i,w+1} = \exp(\beta \times \text{HEALTH PERCEPTION}_{i,w} + \gamma \times \text{HEALTH}_{i,w} + \delta \times X_{i,w} + \nu_i),$$
  
 $\exp(\nu_i) \sim \text{Gamma}(1/\alpha, \alpha)$ 

Table 3: Annual number of doctor visits and OOP expenditure for doctor visits at w+1

Table 3: Annual number of doctor visits and OOP expenditure for doctor visits at w+1					
	(1) Unimpaired Doctor visits	(2) Unimpaired OOP	(3) Impaired Doctor visits	(4) Impaired OOP	
	Doctor visits	001	Boctor Vibros		
Health perception (ref.: concordance)					
Underestimating	0.250***	$0.193^{*}$			
	(0.018)	(0.077)			
Overestimating			-0.156***	$-0.299^*$	
			(0.027)	(0.144)	
Chronic diseases	0.180***	$0.127^{***}$	0.133***	0.174***	
	(0.005)	(0.031)	(0.009)	(0.051)	
Activity limitations	0.090***	0.064	0.032***	0.019	
	(0.008)	(0.035)	(0.005)	(0.027)	
Age	-0.002	0.058	0.023	0.196*	
	(0.010)	(0.059)	(0.017)	(0.085)	
Age squared	0.000	-0.000	-0.000	-0.002**	
	(0.000)	(0.000)	(0.000)	(0.001)	
Woman	0.036**	0.165**	0.003	0.413***	
	(0.012)	(0.058)	(0.027)	(0.104)	
Educ. group (ref.: medium)	(01012)	(0.000)	(0.02.)	(0.202)	
Low	-0.007	-0.409***	0.024	-0.107	
20.1	(0.016)	(0.071)	(0.032)	(0.120)	
High	-0.008	0.479***	-0.078	0.448**	
111811	(0.016)	(0.092)	(0.042)	(0.156)	
Retired	0.031	-0.045	0.015	0.150	
recirca	(0.017)	(0.103)	(0.031)	(0.239)	
Married	-0.025	0.020	0.014	0.084	
Married	(0.015)	(0.020)	(0.028)		
Environ lab income (only and )	,	0.011***	( /	(0.148)	
Equiv. hh income (cube root)	-0.001		-0.001	0.011	
D'1 ( - ( 1 )	(0.001)	(0.003)	(0.001)	(0.007)	
Risk aversion (ref.: no risk)	0.00	0.104	0.004	0.101	
Substantial	0.067	-0.164	-0.064	-0.164	
	(0.063)	(0.134)	(0.130)	(0.277)	
Above average	-0.134***	0.414*	-0.106	1.319	
	(0.033)	(0.196)	(0.108)	(0.771)	
Average	-0.009	0.172	-0.061	0.176	
	(0.015)	(0.089)	(0.040)	(0.147)	
Wave 5	-0.091***		-0.042		
	(0.015)		(0.037)		
Constant	1.525***	1.595	1.331*	-2.832	
	(0.349)	(2.001)	(0.592)	(2.906)	
Control variables country	Yes	Yes	Yes	Yes	
N	47,377	33,575	8,780	6,413	
Pseudo R2	0.024	55,515	0.019	0,110	
AIC	269,248	305,417	57,293	57,996	
BIC	269,520	305,644	57,512	58,178	
SE	cluster	cluster	cluster	cluster	
DE .	cruster	Cluster	Cluster	Clustel	

Note: "Unimpaired" refers to the sample that is objectively unimpaired, i.e. able to stand up from the chair and "Impaired" refers to the sample that is objectively impaired, i.e. unable to stand up from the chair. The dependent variable "doctor visits" is based on the annual number of doctor visits, visits to emergency rooms and outpatient clinic visits at wave w+1, i.e. Wave 4 or Wave 6. All explanatory variables are taken from wave w, i.e. Wave 2 or Wave 5 respectively. The estimated coefficients are based on a negative binomial regression model with mean dispersion. The dependent variable "OOP" is based on annual out-of-pocket payments for doctor visits at wave w+1, i.e. Wave 6. All explanatory variables are taken from wave w, i.e. Wave 5. The coefficients are estimated based on a generalised linear model model with log link and a Gamma family. Standard errors are clustered at the household level and presented in parentheses. \* p<0.05, \*\* p<0.01, \*\*\* p<0.001



+1.6

doctor visits when underestimating health (+28%)

-1.4

doctor visits when overestimating health (-14.4%)



+19.3%

Out-of-pocket payments when underestimating health

-30%

Out-of-pocket payments when overestimating health

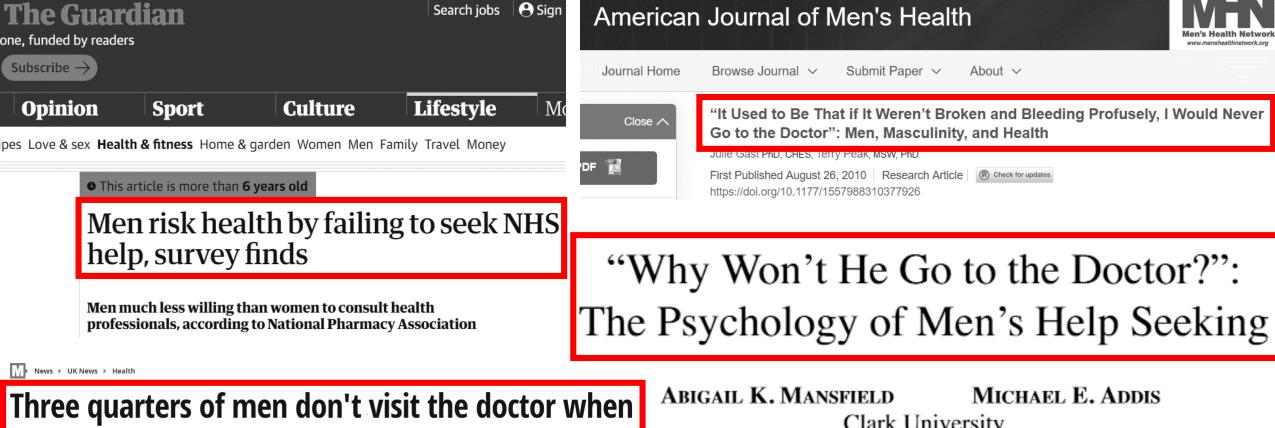
Table 3: Annual number of doctor visits and OOP expenditure for doctor visits at w+1

Table 3: Annual number of doctor visits and OOP expenditure for doctor visits at $w+1$					
	(1) Unimpaired Doctor visits	(2) Unimpaired OOP	(3) Impaired Doctor visits	(4) Impaired OOP	
Health perception (ref.: concordance)					
Underestimating	0.250***	$0.193^{*}$			
Underestimating	(0.018)	(0.077)			
Overestimating	(0.016)	(0.077)	0.156***	-0.299*	
Overestimating			-0.156***	(0.144)	
Chronic diseases	0.180***	0.127***	$(0.027)$ $0.133^{***}$	0.174***	
Chronic diseases					
A -+ii+ 1ii+-+i	$(0.005) \\ 0.090***$	(0.031)	(0.009)	(0.051)	
Activity limitations		0.064	0.032***	0.019	
A	(0.008)	(0.035)	(0.005)	(0.027)	
Age	-0.002	0.058	0.023	0.196*	
A	(0.010)	(0.059)	(0.017)	(0.085)	
Age squared	0.000	-0.000	-0.000	-0.002**	
***	(0.000)	(0.000)	(0.000)	(0.001)	
Woman	0.036**	0.165**	0.003	0.413***	
	(0.012)	(0.058)	(0.027)	(0.104)	
Educ. group (ref.: medium)	0.007	0.400***	0.004	0.107	
Low	-0.007	-0.409***	0.024	-0.107	
TT: 1	(0.016)	(0.071)	(0.032)	(0.120)	
High	-0.008	0.479***	-0.078	0.448**	
B 1	(0.016)	(0.092)	(0.042)	(0.156)	
Retired	0.031	-0.045	0.015	0.152	
	(0.017)	(0.103)	(0.031)	(0.239)	
Married	-0.025	0.020	0.014	0.084	
	(0.015)	(0.071)	(0.028)	(0.148)	
Equiv. hh income (cube root)	-0.001	0.011***	-0.001	0.011	
	(0.001)	(0.003)	(0.001)	(0.007)	
Risk aversion (ref.: no risk)					
Substantial	0.067	-0.164	-0.064	-0.164	
	(0.063)	(0.134)	(0.130)	(0.277)	
Above average	-0.134***	$0.414^{*}$	-0.106	1.319	
	(0.033)	(0.196)	(0.108)	(0.771)	
Average	-0.009	0.172	-0.061	0.176	
	(0.015)	(0.089)	(0.040)	(0.147)	
Wave 5	-0.091***		-0.042		
	(0.015)		(0.037)		
Constant	1.525***	1.595	1.331*	-2.832	
	(0.349)	(2.001)	(0.592)	(2.906)	
Control variables country	Yes	Yes	Yes	Yes	
N	47,377	33,575	8,780	6,413	
Pseudo R2	0.024	55,575	0.019	0,410	
AIC	269,248	305,417	57,293	57,996	
BIC	269,520	305,417 $305,644$	57,512	58,178	
SE SE	,	,	,	,	
DE.	cluster	cluster	cluster	cluster	

Note: "Unimpaired" refers to the sample that is objectively unimpaired, i.e. able to stand up from the chair and "Impaired" refers to the sample that is objectively impaired, i.e. unable to stand up from the chair. The dependent variable "doctor visits" is based on the annual number of doctor visits, visits to emergency rooms and outpatient clinic visits at wave w+1, i.e. Wave 4 or Wave 6. All explanatory variables are taken from wave w, i.e. Wave 2 or Wave 5 respectively. The estimated coefficients are based on a negative binomial regression model with mean dispersion. The dependent variable "OOP" is based on annual out-of-pocket payments for doctor visits at wave w+1, i.e. Wave 6. All explanatory variables are taken from wave w, i.e. Wave 5. The coefficients are estimated based on a generalised linear model model with log link and a Gamma family. Standard errors are clustered at the household level and presented in parentheses. \* p < 0.05, \*\*\* p < 0.01, \*\*\* p < 0.001

#### ROBUSTNESS CHECKS

- Different health perception measures: Walking ability, cognition, different specification of ability to stand up from a chair
- Different model specifications: different imputation method for income, different normalisation method for income
- Heterogeneity analysis: separate by wave, country, number of chronic diseases, gender
- Different estimation methods: Poisson, negative binomial with constant dispersion, zero-inflated Poisson



showing signs of illness, says study

#### THE WALL STREET JOURNAL.

We use cookies for analytics, advertising and to improve our site. You agree to our use of cookies by closing this message box or continuing to us including how to change your settings, see our Cookie Policy HEALTH | JOURNAL REPORTS: HEALTH CARE

Why Men Won't Go to the Doctor, and How to Change That

Many men view health complaints as a sign of weakness. So health-care providers are looking for ways around

Clark University

JAMES R. MAHALIK Boston College

Here's Why Men Don't Like Going To The **Doctor** 

HUFFPOST

Of course, the Patriarchy is at least partially to blame.

Table 7: Annual number of doctor visits at w+1 by gender

	(-)	(=)	(=)	
	(1)	(2)	(3)	(4)
	Unimpaired	Impaired	Unimpaired	Impaired
	Men Doctor vicita	Men Doctor vicita	Women Doctor visita	Women Doctor visits
	Doctor visits	Doctor visits	Doctor visits	Doctor visits
Health perception (ref.: concordance)				
Underestimating	0.276***		0.232***	
	(0.035)		(0.020)	
Overestimating	, ,	-0.161***	, ,	-0.142***
		(0.044)		(0.033)
Chronic diseases	0.190***	0.162***	0.175***	0.118***
	(0.008)	(0.013)	(0.007)	(0.011)
Activity limitations	0.082***	0.027**	0.095***	0.035***
v	(0.015)	(0.009)	(0.010)	(0.006)
Age	$0.027^{'}$	$0.034^{'}$	-0.019	0.024
6-	(0.017)	(0.028)	(0.013)	(0.020)
Age squared	-0.000	-0.000	0.000	-0.000
2280 5444224	(0.000)	(0.000)	(0.000)	(0.000)
Educ. group (ref.: medium)	(0.000)	(0.000)	(0.000)	(0.000)
Low	-0.038	0.078	0.023	-0.013
2011	(0.025)	(0.049)	(0.020)	(0.039)
High	-0.028	-0.079	0.006	-0.094
IIIgii	(0.024)	(0.056)	(0.022)	(0.060)
Retired	0.035	0.041	0.028	-0.022
Retired	(0.031)	(0.066)	(0.023)	(0.037)
Married	-0.036	0.030	-0.037*	-0.012
Married	(0.025)	(0.050)	(0.018)	(0.033)
Fauir hh income (oute next)	-0.000	-0.002	-0.001	0.000
Equiv. hh income (cube root)				
D:-1	(0.001)	(0.002)	(0.001)	(0.002)
Risk aversion (ref.: no risk)	0.001	0.000	0.100	0.500**
Substantial	0.061	0.203	0.106	-0.500**
4.1	(0.088)	(0.161)	(0.090)	(0.164)
Above average	-0.119**	0.025	-0.152**	-0.162
	(0.041)	(0.146)	(0.053)	(0.159)
Average	0.008	0.011	-0.022	-0.110*
	(0.022)	(0.059)	(0.020)	(0.049)
Wave 5	-0.113***	0.062	-0.072***	-0.104*
_	(0.022)	(0.055)	(0.019)	(0.046)
Constant	0.414	0.681	2.288***	$1.501^*$
	(0.562)	(0.986)	(0.435)	(0.719)
Control variables country	Yes	Yes	Yes	Yes
N	21,557	3,355	25,820	5,425
Pseudo R2	0.023	0.021	0.025	0.020
AIC	121,792	21,782	147,255	35,458
BIC	122,032	21,965	147,500	35,656
SE	cluster	cluster	cluster	cluster
	Clubici	Clubici	CIUSTCI	Cruster

Note: "Unimpaired" refers to the sample that is objectively unimpaired, i.e. able to stand up from the chair and "Impaired" refers to the sample that is objectively impaired, i.e. unable to stand up from the chair. The dependent variable "doctor visits" is based on the annual number of doctor visits, visits to emergency rooms and outpatient clinic visits at wave w+1, i.e. Wave 4 or Wave 6. All explanatory variables are taken from wave w, i.e. Wave 2 or Wave 5 respectively. The estimated coefficients are based on a negative binomial regression model with mean dispersion. Standard errors are clustered at the household level and presented in parentheses. \* p < 0.05, \*\* p < 0.01, \*\* p < 0.001

+1.8

doctor visits when underestimating health

-1.5

doctor visits when overestimating health

4

+1.5

doctor visits when underestimating health

-1.3

doctor visits when overestimating health

#### **Policy implications**

- Reaching out to individuals that overestimate their health to encourage them to take up screenings and preventive care
- Equipping individuals with tools and information to accurately assess own health

#### Main limitation

 Panel attrition: individuals that suffer from diseases are less likely to participate in consecutive survey waves and thus less likely to be included in the sample





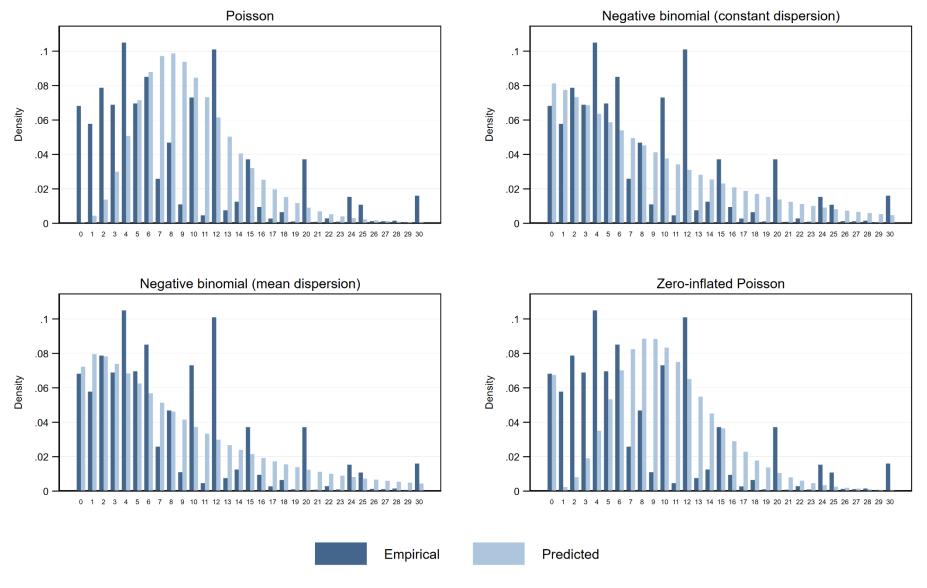




# Questions? Suggestions? sonja.spitzer@iiasa.ac.at

mage: Freepik.com

#### Count model comparison for the annual number of doctor visits in the impaired sample, i.e. unable to stand up from the chair



No. doctor visits