

# Persistence of Income Reporting Errors

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EUROMOD Annual Meeting 2023, JRC, European Commission

- Income sources (earnings and social security benefits) are poorly reported in surveys (Hokayem et al. 2015; Meyer et al. 2015; Bollinger et al. 2019; Meyer and Mittag 2019; Celhay et al. 2021; Jenkins and Rios-Avila 2021; Bollinger and David 1997)
- Significant income misreporting in the Austrian SILC, but estimates of *total* income are less biased than any one individual income source (Angel et al. 2018, 2019)

- Evidence that survey respondents confuse the unemployment benefit they are on, and report benefits as earnings in the Austrian SILC (Bollinger and Tasseva 2023)
- Very few studies examine the dynamics of this when respondents are participating in a panel (Fisher 2019; Lynn et al. 2012; Bollinger and David 2005)

→ We examine the dynamics of unemployment benefits participation and earnings reports in the Statistics on Income and Living Conditions (SILC) survey in Austria.

# Key Research Questions

- 1 What is the dynamic structure:
  - Persistence in misreports?
  - Learning? Do respondents learn to avoid or report better?
  - No strong evidence of learning
  - Longer periods on unemployment benefits lead to over-reporting of earnings
- 2 Impact on estimates of unemployment benefits and earnings transitions
  - Benefits: transitions off receipt are over-reported, transitions on receipt are under-reported
  - Earnings: slight over-reporting of transitions off and on receipt
- 3 Impact on estimates of poverty dynamics
  - Persistence is underestimated
  - Entries are underestimated, exits overestimated

# Unemployment Benefits in Austria

- Three main unemployment benefits in Austria:
  - ① Unemployment Insurance (**UI**) benefit (“Arbeitslosengeld”)
  - ② Unemployment Assistance (**UA**) (“Notstandshilfe”)
  - ③ Assistance for covering living costs (**ACLCL**) (“Beihilfe zur Deckung des Lebensunterhaltes”)
- All three allow for limited labour market participation
- **UI** is an insurance-based benefit:
  - Limited duration
  - Job training may be required
- **UA** covers *low-income* groups and kicks in when UI exhausted:
  - Unlimited duration
  - Job training may be required
- **ACLCL** provides support for job training *for low-income* groups and can be received with UI/UA

# Data: Austrian SILC for 2008–2011

- Widely used by social scientists, main source for EUROMOD as well as official statistics on income, poverty and inequality
- Cross-sectional and panel data linkable
- Reflects annual data, 2007–2010
- Sample based on private households registered in the central population register (“[Zentrales Melderegister](#)”)
- 4-years rotating panel, i.e. each year 25% of the sample is renewed
- We make use of the “additional data” files (“[Zusatzdaten](#)”)
  - Detailed survey data on earnings and state unemployment benefits
  - Include also linked administrative records
  - Link based on initial sample frame
  - Over 95% of records linked each period

# Survey Receipt Proportion by Administrative Receipt Spell

Admin receipt spells	Obs.	True + all spells	False -	
			all spells	some spells
UI				
1	1,555	54.28	45.72	
2	527	40.23	25.05	34.72
3-4	215	33.02	9.30	57.67
Combined benefits (UI+UA+ACLC)				
1	1,714	57.23	42.77	
2	653	46.55	22.82	30.63
3-4	293	39.25	6.83	53.92
Earnings				
1	5,655	85.78	14.22	
2	3,680	85.87	4.32	9.81
3-4	3,491	87.74	1.75	10.51

# Survey Receipt Proportion by Administrative Receipt Spell

- For UI and combined benefits, longer spell length associated with better reporting of spell overall
- But more misreporting of at least one year
- May in part be mechanical
- Not denial of entire spell (unlike [Bollinger and David 2000](#))
- Earnings has high reporting of all spells
- But slight increase in misreporting at least one year
- (Results in paper: some respondents learn to avoid, others to report better but no single pattern dominates)



# Cross-Reporting of Benefits to Earnings

Admin receipt spells	Obs.	Benefit true + all spells percent earnings overreport	Benefit false – at least one spell percent earnings overreport
UI			
1	1,555	29.00	29.52
2	527	26.57	45.92
3-4	215	26.05	55.81
Combined benefits (UI+UA+ACLC)			
1	1,714	26.95	27.42
2	653	26.49	40.58
3-4	293	26.28	49.83

# Cross-Reporting of Benefits to Earnings

- Longer admin receipt and false negatives increase earnings over-report probabilities
- Since longer receipt also increases some false negatives, longer receipt highly associated with over-reporting of earnings

# Misclassification Probabilities

	Prior Survey status			
	$N_{t-1}$		$R_{t-1}$	
	Current Admin status			
	$N_t$	$R_t$	$N_t$	$R_t$
UI				
Current Survey status				
$N_t$	99.6	43.5	87.3	30.6
$R_t$	.4	56.5	12.7	69.4
Observations	20,068	955	402	628
Combined benefits (UI+UA+ACLC)				
Current Survey status				
$N_t$	99.7	43.2	94.5	24.2
$R_t$	.3	56.8	5.5	75.8
Observations	19,773	1,013	380	852
Earnings				
Current Survey status				
$N_t$	96.9	41.4	69.2	3.5
$R_t$	3.1	58.6	30.8	96.5
Observations	8,706	1,316	809	10,776

$N$ =non-receipt.  $R$ =receipt.

# Transition Probabilities

	Prior <b>Non-Receipt</b>		Prior <b>Receipt</b>		Observations	
	$(N_t N_{t-1})$	$(R_t N_{t-1})$	$(N_t R_{t-1})$	$(R_t R_{t-1})$	$N_{t-1}$	$R_{t-1}$
<b>UI</b>						
Survey	97.1	2.9	51.0	49.0	8,390	445
Admin	96.8	3.2	38.4	61.6	8,210	625
<b>Combined benefits (UI+UA+ACLC)</b>						
Survey	97.0	3.0	45.6	54.4	8,302	515
Admin	96.8	3.2	31.6	68.4	8,106	711
<b>Earnings</b>						
Survey	91.4	8.6	7.2	92.8	3,978	4,655
Admin	94.1	5.9	5.2	94.8	3,796	4,837

$N$ =non-receipt.  $R$ =receipt.

- UI, UA and ACLC are important poverty reduction programmes
- Results suggest misreporting might impact transitions and poverty by source/status
- Very little work to date on how response error impacts transitions
- We only replace earnings and UI/UA/ACLC with admin for admin measures

# Poverty Transitions

	Conditional on <b>Not in Poverty</b> in t-1		Conditional on <b>In Poverty</b> in t-1		Observations	
	$(N_t N_{t-1})$	$(P_t N_{t-1})$	$(N_t P_{t-1})$	$(P_t P_{t-1})$	$N_{t-1}$	$P_{t-1}$
Survey	94.8	5.2	42.4	57.6	8,206	981
Admin	94.2	5.8	38.0	62.0	8,025	1,162

$N$ =not poor.  $P$ =poor.

# Conclusions

- Longer periods on UI and other unemployment benefits is associated with higher overall reporting of participation, but also leads to higher misreporting of some spells.
- Longer periods on benefits is associated with misreporting benefits as earnings.
- Past reporting and participation are predictive of current period survey reports.
- Transitions off of benefits are significantly over-reported. Transition onto benefits are under-reported.
- Transitions off of and onto earnings are slightly over-reported
- This impacts estimates of transitions in and out of poverty. And leads to under-estimation of longer poverty spells.

- If reports of total income are accurate, but benefits misclassified as earnings
  - accurate poverty estimates based on total income
  - but bias in estimates/simulations of benefits receipt and poverty reduction due to benefits such as UI or UA
- Common strategies to correct reporting errors in survey data are problematic
  - E.g. replacing only one income component by an accurate admin measure (e.g. benefits) or taking the max between survey and admin measures
- A better strategy is to correct the sum of income components rather than each individual one
  - Hinges on distinguishing cross-reporting benefits as earnings from missing earnings in the administrative data



# Thank You



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# Sample characteristics: SILC 2008-2011

	All	Men	Women
Age	47.4	46.6	48.1
Education:			
Low	23.4	17.3	29.0
Middle	59.7	61.9	57.7
High	16.9	20.8	13.4
With partner	62.5	66.1	59.2
Full-time, full-year employed	30.8	41.8	21.0
Observations:			
1 wave only	8,903	4,231	4,672
2 waves	12,559	5,951	6,608
3 waves	15,461	7,302	8,159
4 waves	8,047	3,790	4,257
All observations	44,970	21,274	23,696

# Participation Characteristics

	All	Men	Women
With survey earnings	54.3	59.4	49.8
UI in the survey:			
Missing/imputed	.1	.2	.1
No receipt	94.8	93.8	95.6
With receipt:	5.1	6.0	4.2
<i>1 year only</i>	74.2	71.9	77.0
<i>Multiple years</i>	25.8	28.1	23.0
UA in the survey:			
No receipt	98.3	98.2	98.5
With receipt:	1.7	1.8	1.5
<i>1 year only</i>	73.5	70.1	76.6
<i>Multiple years</i>	26.5	29.9	23.4
ACLC in the survey:			
Missing/imputed	.1	.	.
No receipt	99.2	.	.
With receipt:	.7	.	.
<i>1 year only</i>	88.6	.	.
<i>Multiple years</i>	11.4	.	.