

The Value of Unemployment Insurance

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Motivation: Value of Insurance

- Key for social insurance design:
 - Large literature on labour supply responses = **cost** of social insurance
 - Much less work on corresponding **value** of social insurance
- Conceptually easy; value of transferring dollar from good to bad state
- *Challenge*: how to evaluate in practice - especially when social insurance is mandated?

Unemployment and Consumption Drops

- Large literature studies consumption response to income shock and tests for presence of (partial) insurance
- “Consumption-Based Implementation” (Baily-Chetty, Gruber '97)
 - Consumption response to U sufficient for value of UI
 - Overcomes challenge to observe means used to smooth consumption
 - But **conditional on knowing preferences**
- How well do consumption responses capture value of insurance?
 - Can we simply translate Δ consumption in Δ marginal utility?
 - Lack of smoothing: low value? or price high?
 - Huge debate \Rightarrow **Unresolved**

This Paper:

We have a unique setting in Sweden:

- ➊ **rich admin data** on income, wealth, unemployment, etc
- ➋ **voluntary** UI coverage

We implement three alternative approaches in same setting/sample:

- ➊ Revisit **CB approach** using admin data
 - Study different margins and heterogeneity in consumption responses
- ➋ Propose novel **MPC approach**
 - State-specific MPCs reveal price of smoothing consumption
- ➌ Implement **RP approach** based on UI choices
 - Study heterogeneity in valuations (conditional on unemployment risk)

This Paper: **Findings**

We have a unique setting in Sweden:

- ① **rich admin data** on income, wealth, unemployment, etc
- ② **voluntary** UI coverage

We implement three alternative approaches in same setting/sample:

- ① Revisit **CB approach** using admin data
 - CB indicates low value of UI ($<$ MH costs)
- ② Propose novel **MPC approach**
 - MPCs indicate high value of UI (\gtrsim MH costs)
- ③ Implement **RP approach** based on UI choices
 - RP confirms high value of UI and reveals large dispersion

- Recent literature on value of UI:
 - CB approach using admin data (*Ganong and Noel '16, Gerard and Naritomi '18*) rather than surveyed consumption (*Browning and Crossley '01, Stephens '01*)
 - 'optimization methods' (*Chetty '08, Landaís '15, Hendren '17*)
 - other social insurance settings (*Finkelstein et al. '15, '17, Low and Pistaferri '15, Cabral '16, Autor et al. '17, Fadlon and Nielsen '17*)
- Our new approaches relate to:
 - heterogeneity in MPCs (e.g., *Kreiner et al '16, Kekre '17, ...*)
 - RP vs. choice frictions (e.g., *Abaluck and Gruber '11, Handel '13, Handel and Kolstad '15, ...*)
- Building on own previous work:
 - use CB approach to study optimal dynamics of UI (*Kolsrud et al. '18*)
 - use UI choices to study adverse selection in UI (*Landaís et al. '18*)

Outline

- 1 Introduction
- 2 Conceptual Framework
- 3 Context & Data
- 4 Consumption-Based Approach
- 5 MPC Approach
- 6 Revealed Preference Approach

Stylized Model of Unemployment

- Worker maximizes:

$$\pi(z) u_u(c_u, x_u) + (1 - \pi(z)) u_e(c_e, x_e) - z$$

subject to

$$c_s = y_s + \frac{1}{p_s} x_s \text{ for } s = e, u$$

- Consumption smoothing behavior:

$$u'_s(c_s) = p_s v'_s(x_s)$$

- Model can capture different types of resources used to smooth consumption:

- household labor supply: $p_s v'_s(x_s) = \frac{1}{w_s} c'(x_s)$
- savings/credit: $p_s v'_s(x_s) = R_s \beta V'_s(a_s - x_s)$
- insurance/securities: $p_s v'_s(x_s) = p_s V'_0(a_0) / \pi_s$

Stylized Model (cont'd)

- UI value depends on MRS btw employment and unemployment consumption:

$$MRS = \frac{u'_u(c_u)}{u'_e(c_e)}$$

- MRS “sufficient” to evaluate value of (marginal) changes to UI design
 - Baily-Chetty formula:

$$W'(b) \propto MRS - [1 + \varepsilon_{\frac{\pi}{1-\pi}, b}]$$

- Envelope conditions are key
 - consumption smoothing responses to change in UI have only SO impact on welfare

- Data from tax registers on all earnings/income, transfers/taxes, debt & assets (balance & transactions), some durables

- Consumption as a residual expenditure measure (Kolsrud et al. '17)

$$consumption_t = income_t - \Delta assets_t$$

► Consistency with survey data

► Details

- Sources of income variation (UI benefits, transfers, asset price shocks)
- Data on UI coverage choices [2002-2008]

► Institutional details

 - workers can opt for comprehensive coverage ($\sim 80\%$ replacement rate)
 - alternative is a flat minimum benefit level
 - uniform price (subsidized): 4 out of 5 take comprehensive coverage
- Data on unemployment outcomes:
 - On unemployment spells & benefit receipt
 - On determinants of U risk

► Predicted Risk Model
 - On elicited unemployment risk (surveys)

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Approach I: Consumption-Based Approach

CB Approach

MRS is determined by consumption drop and risk aversion:

$$\frac{u'_u(c_u)}{u'_e(c_e)} \cong 1 + \gamma \times \frac{c_e - c_u}{c_e}$$

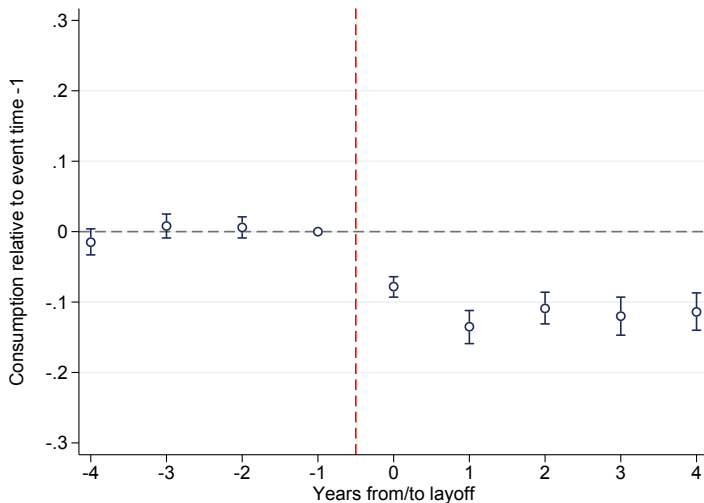
where $\gamma = c_e \cdot u''(c_e) / u'(c_e)$

- Approximation ignores state-dependent preferences and relies on Taylor expansion

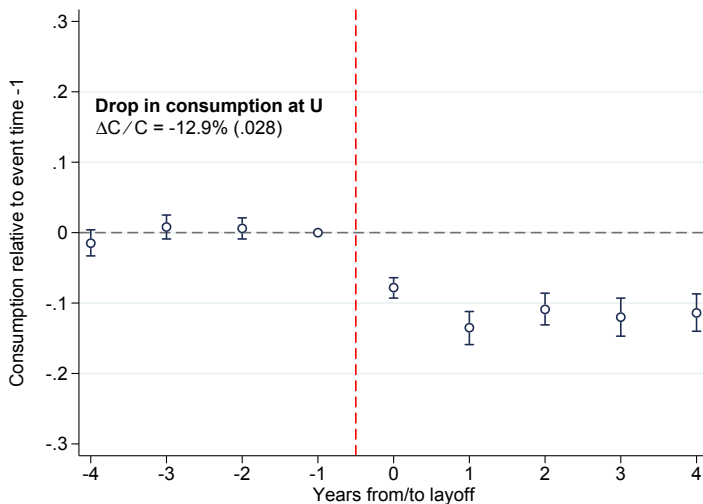
$$u'(c_u) \cong u'(c_e) + u''(c_e) [c_e - c_u]$$

- Remarkably easy to implement if preferences are known...

Yearly Consumption Relative to Year of Displacement

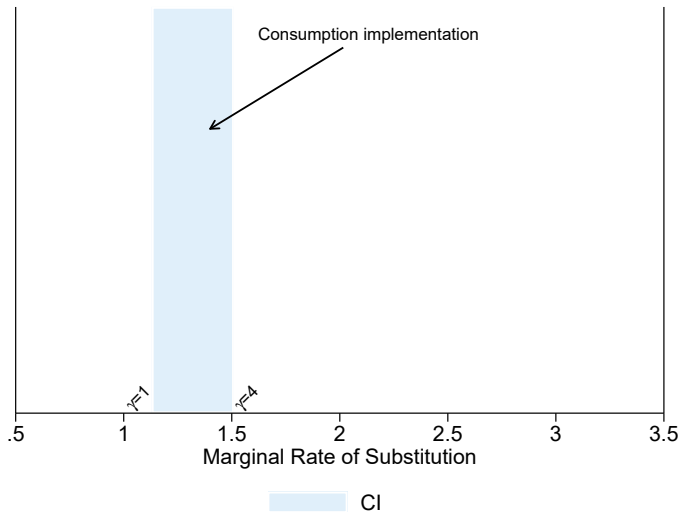


Yearly Consumption Relative to Year of Displacement



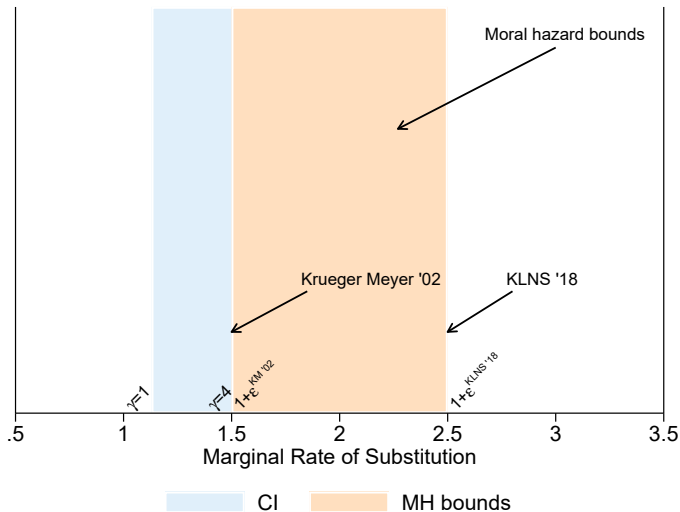
Comparing Value vs. Cost of UI

Baily-Chetty

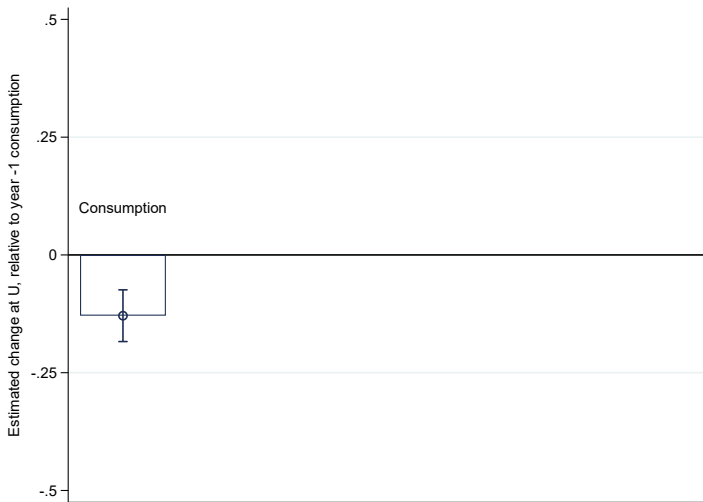


Comparing Value vs. Cost of UI

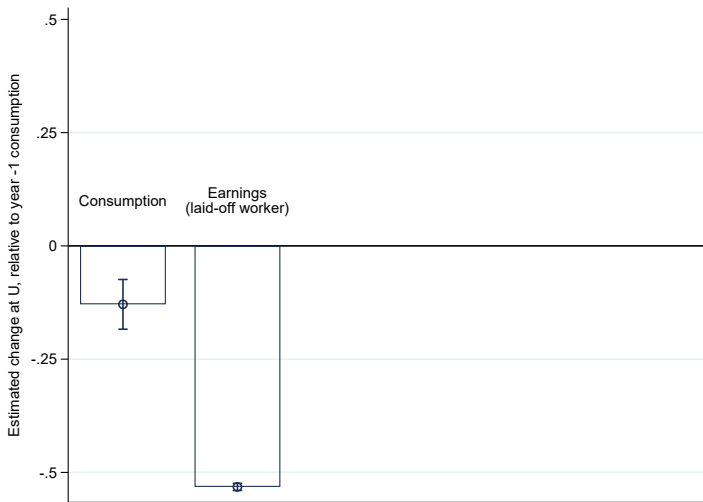
Baily-Chetty



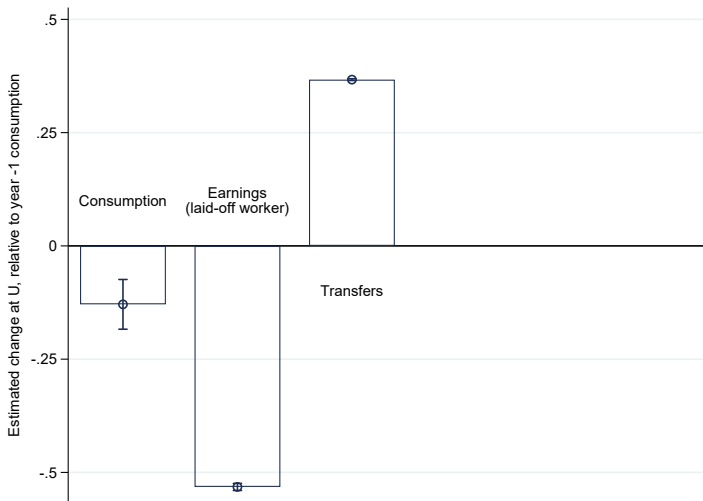
Decomposition of Cons. Responses: HH Consumption



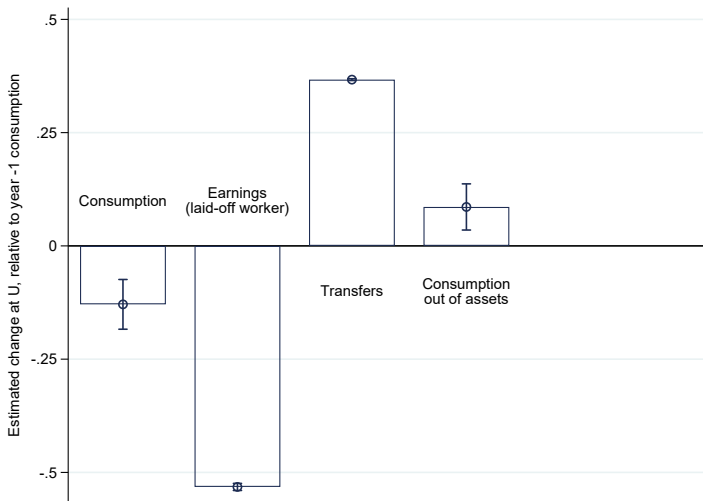
Decomposition of Cons. Responses: Labor Income



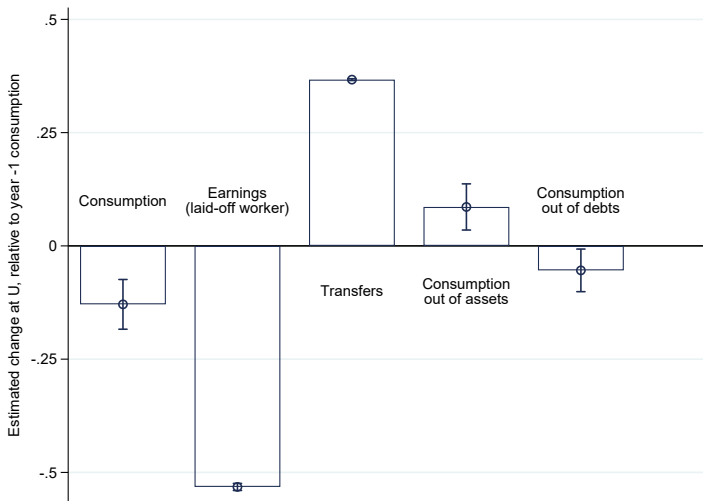
Decomposition of Cons. Responses: Transfers



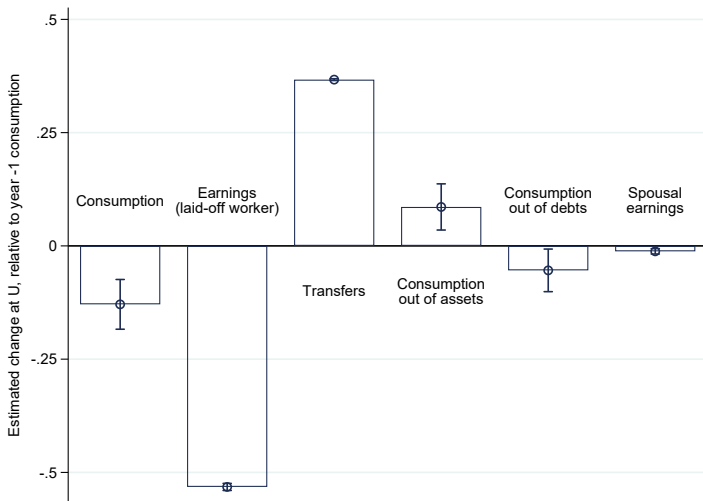
Decomposition of Cons. Responses: $-\Delta$ Assets



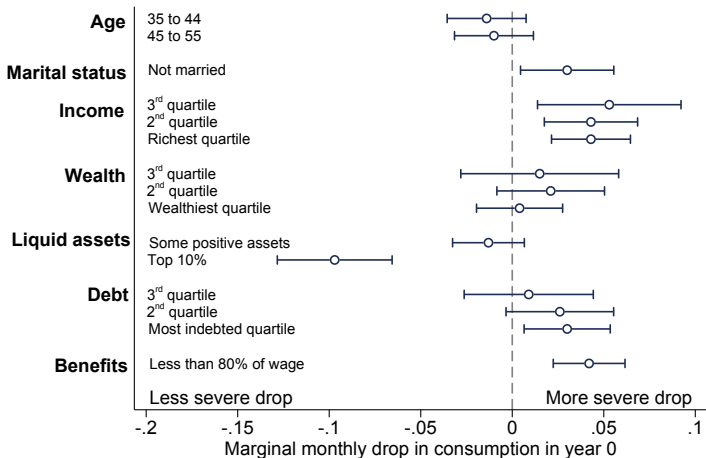
Decomposition of Cons. Responses: Δ Debt



Decomposition of Cons. Responses: Spousal Earnings



Heterogeneity in Consumption Responses



CB Approach: Discussion and Challenges

Can we translate Δ consumption in Δ marginal utility?

- Consumption drops are endogenous:
 - Large ΔC relative to ΔY at displacement \Rightarrow low $\gamma?$ or high $p_u/p_e?$
 - Large ΔC for liquidity or debt-constrained \Rightarrow high $p_u/p_e?$
- Other challenges:
 - 1 State-dependent Expenditures
 - 2 State dependent utility
 - 3 Anticipation (e.g. Hendren [2017, 2018])
 - 4 Heterogeneity (e.g. Andrews & Miller [2013])

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- Other challenges:

① State-dependent Expenditures

Using consumption surveys, we find: Expenditure Categories

- committed expenditures (e.g., rent) drop very little
- durable good consumption (e.g., furniture) drops early on in the spell
- employment-related, but also leisure expenditures drop substantially
- increase in home production

② State dependent utility

③ Anticipation (e.g. Hendren [2017, 2018])

④ Heterogeneity (e.g. Andrews & Miller [2013])

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① State-dependent Expenditures

② State dependent utility

- Complementarities btw C & L, reference-dependence, etc.

$$\frac{u'_u(c_u)}{u'_e(c_e)} \cong 1 + \gamma_e \times \frac{c_e - c_u}{c_e} + \theta$$

- $\theta = \frac{u'_u(c_u) - u'_e(c_u)}{u'_e(c_e)}$

③ Anticipation (e.g. Hendren [2017, 2018])

④ Heterogeneity (e.g. Andrews & Miller [2013])

CB Approach: Discussion and Challenges

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- Other challenges:
 - 1 State-dependent Expenditures
 - 2 State dependent utility
 - 3 **Anticipation** (e.g. Hendren [2017, 2018])
 - Drop at U = drop conditional on U risk already revealed at U
 - Individuals who end up unemployed were also more risky
 - Anticipation reduces drop in C at U
 - **Solution:** Rescale changes in C at job loss by risk revealed
Or rescale change in C before U by amount of risk revealed before U

Implementation

CB Approach: Discussion and Challenges

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- Other challenges:
 - 1 State-dependent Expenditures
 - 2 State dependent utility
 - 3 Anticipation (e.g. Hendren [2017, 2018])
 - 4 Heterogeneity (e.g. Andrews & Miller [2013])
 - Heterogeneity in MRS important for policy design
 - Mapping btw heterogeneity in Δc & in MRS is tricky!
 - Need to account for $Cov(\gamma, \Delta c)$

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Approach II: State-Specific MPC's

MPC approach

Under 'regularity conditions', MRS is bounded by:

$$\frac{u'_u(c_u)}{u'_e(c_e)} \geq \frac{MPC_u / (1 - MPC_u)}{MPC_e / (1 - MPC_e)}$$

with $MPC_s \equiv dc_s / dy_s$.

- **Idea:** smoothing behavior depends on state-specific price of increasing consumption, p_s :

$$\frac{u'_u(c_u)}{u'_e(c_e)} = \frac{p_u}{p_e} \times \frac{v'_u(x_u)}{v'_e(x_e)}$$

- In 'standard' models: $\frac{v'_u(x_u)}{v'_e(x_e)} \geq 1 \Rightarrow \frac{u'_u(c_u)}{u'_e(c_e)} \geq \frac{p_u}{p_e}$
- **Challenge:** what is p_u / p_e ? what is binding margin of adjustment?

Approach II: State-specific MPC's (cont'd)

- **Solution:** state-specific MPC_s reveals state-specific price p_s
 - MPC is higher when price of increasing consumption is higher

$$\frac{dc_s}{dy_s} = \frac{p_s \times \frac{\sigma_s^x}{\sigma_s^c}}{1 + p_s \times \frac{\sigma_s^x}{\sigma_s^c}}$$

- Mitigated by curvature over consumption c vs. used resource x
- **'Trick':** rescaling of MPC_u vs. MPC_e
 - Takes out impact of relative curvature (e.g., CARA prefs)
 - Overcomes challenges to CB approach (e.g., work exps, home prodn)
- Builds on 'optimization approaches':
 - See Chetty 2008, Landais 2015, Hendren 2017
 - Choices (e.g., spousal labor, precautionary savings) reveal value of UI...
 - ... but requires the studied margin of adjustment to be binding

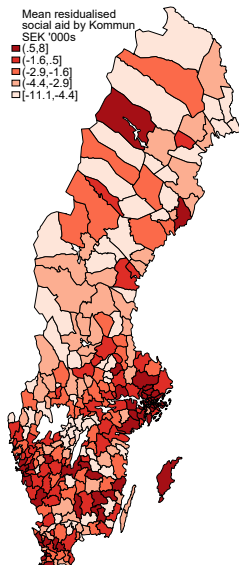
MPC: Variation in Local Transfers

- **Challenge:** need comparable exogenous variation in income when employed vs. unemployed
- Use variation in local transfers
 - Local transfers = large fraction of HH transfers
 - Means-tested/categorical transfers, housing benefits, ...
 - Regulated at national level, large discretion at municipality level
 - Large variation across municipalities / over time / across HH types [Examples](#)
 - Use interaction of sources of transfer variation in FD approach

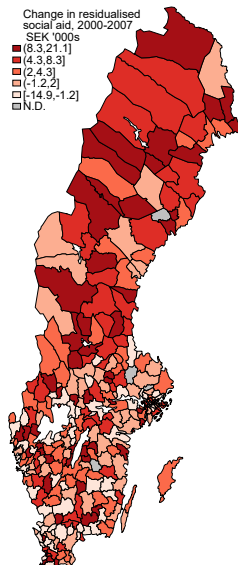
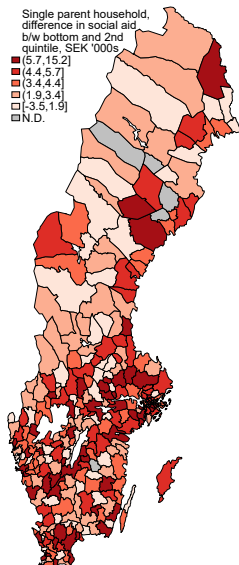
$$C_{ijt} = \alpha_i + \eta_j + \delta_t + \gamma h_{ijt} + X'_{it}\beta$$

- X : rich vector of characteristics determining transfers [Details](#)
- Estimate on sample of individuals who become unemployed
 - Compare them when employed vs unemployed

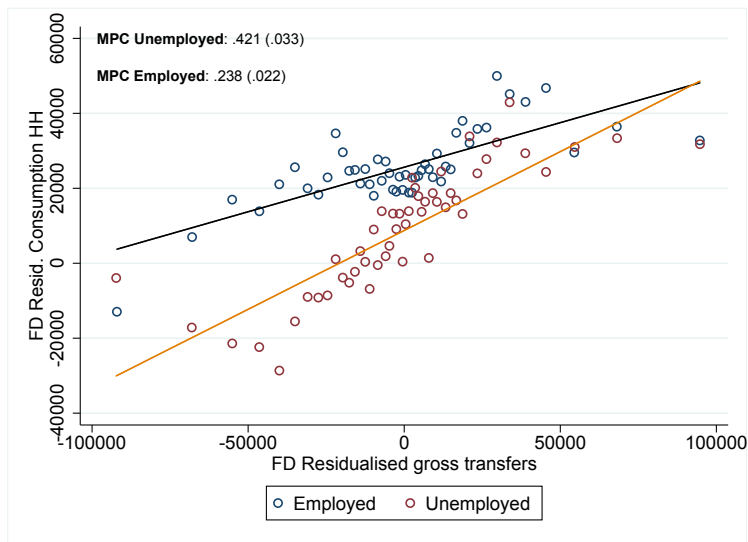
Variation in Local Transfers:



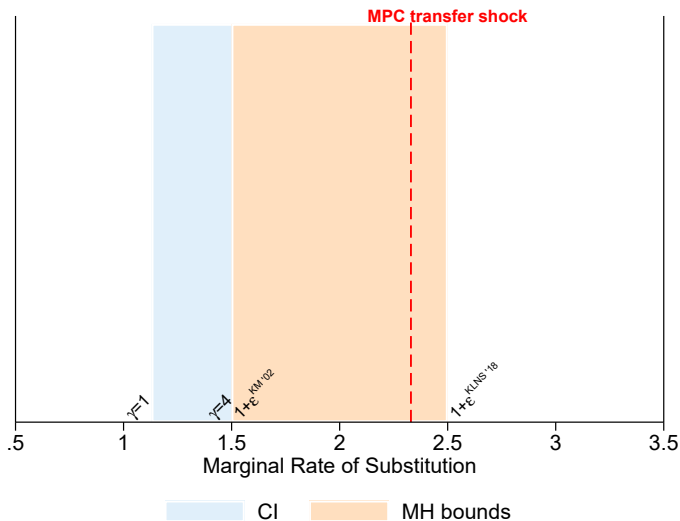
Variation in Local Transfers:



MPC: Transfer



Estimates of MRS: CB vs. MPCs



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Approach III: Revealed Preference Approach

RP approach

When offered insurance, choice reveals MRS given *expected* price per unit of coverage:

$$\frac{u'_u(c_u)}{u'_e(c_e)} \geq \frac{p_u}{p_e} \times \frac{[1 - \pi]}{\pi}$$

- Most direct approach?
 - When prices are known, could infer value from insurance choice
 - But ex-ante choice: need to account for unemployment risk π !
- Challenges:
 - 1 Requires data on choices and unemployment risk
 - 2 Need variation in 'expected' price to tighten bounds
 - 3 Tackle potential choice frictions: e.g., risk misperception, inertia

RP Approach: Implementation

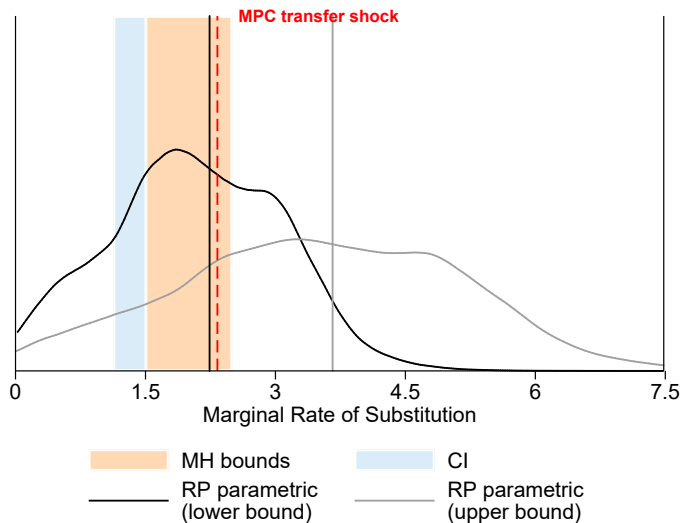
- Swedish Context:
 - Basic plan (b_0, τ_0) vs comprehensive plan (b_1, τ_1)
 - Expected price $E[P] = \frac{[1-\pi_i] \times [\tau_1 - \tau_0]}{\pi_i \times [b_1 - b_0]}$
- Use non-parametric approach to put bounds on MRS Example
- Use parametric approach to estimate MRS distribution:
 - Estimate random effect logit model:
 - 'insured' if $\underbrace{\text{MRS}}_{\alpha_i + X'\beta} - E[P]_{it} + \varepsilon_{it} \geq 0$
 - X : vector of observables affecting MRS (age, education, income, etc.)
 - Predict unemployment risk π_i based on $X + Z$:
 - Z : risk shifters ($\perp X$) (relative tenure rank, layoff notifications)
 - account for MH: estimate separately on 'insured' and 'uninsured'
 - account for frictions: (i) salient risk shifters, (ii) elicited beliefs

► Predicted Risk Model

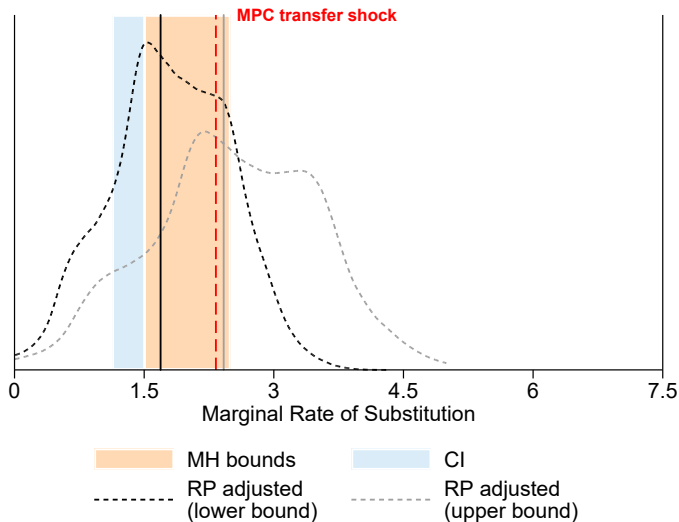
► Moral Hazard

► Frictions

RP Parametric: MRS distributions



Adjusted RP Parametric: MRS distributions



- Revisited consumption-implementation using registry-based measure
 - find 'small' consumption drops which translate in low value of UI for standard preferences
 - limited consumption smoothing beyond (generous) social transfers
- Alternative approaches suggest high mean and variance in the value of UI
 - high mean: generous UI is desirable
 - high variance: allow for choice or differentiate UI policy
 - need caution when using CB approach to guide policy
- State-specific MPCs seem robust alternative to CB approach & extendible to other social insurance settings when no choice is available

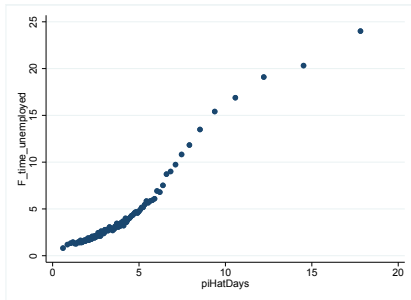
DETAILS

Predicted risk model: Specification

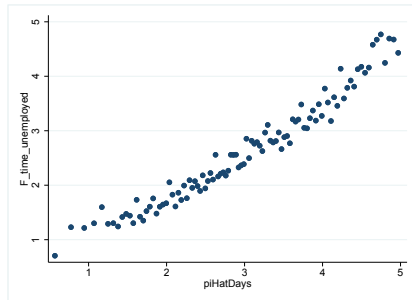
- Using a **Zero-Inflated Poisson** model to predict the number of days unemployed in $t + 1$.
 - **Logit** part of the model predicts excess zeroes using layoff history (layoff dummies in $t - 1$ and $t - 2$), notifications (in t , $t - 1$ and $t - 2$), average firm layoff probability by year, union membership, individual's tenure in firm, tenure \times notification, firm layoff probability \times tenure, year \times industry fixed effects and firm size.
 - **Poisson count** part of the model predicts length of unemployment spell based on income history ($\ln(\text{income})$ in t , $t - 1$ and $t - 2$), family type, age bins, gender, education level, region of residence and industry of activity in t

► Back

Predicted risk model: Fit



Less than 20 days



Less than 5 days

► Back

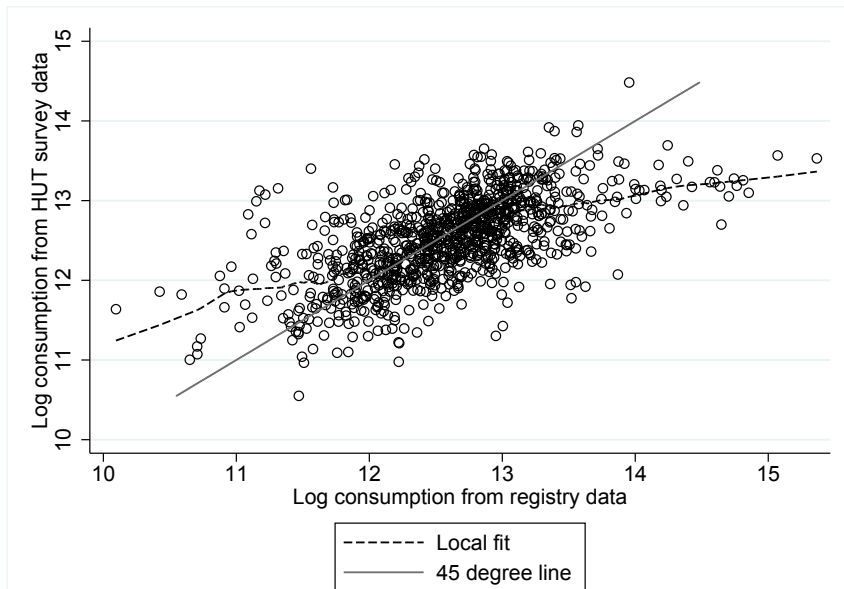
Registry-based Measure of Consumption

- Simple idea: consumption as a residual expenditure measure,

$$consumption_t = income_t - \Delta assets_t$$

- We use admin data (from tax registers) on earnings y , transfers T , bank savings b , outstanding debt d , other financial assets v and real assets h .
 - Account for returns from assets and changes in stock value [▶ Details](#)
 - Majority starts unemployment with **no financial nor real assets** [▶ Table](#)
- We construct annual household consumption C for panel of Swedish workers and analyze how it evolves around job loss using event-study [▶ Details](#)
- Note that we check consistency with consumption survey data

Consistency with survey data



Consumption Equation

$$c_t = y_t + T_t + \tilde{c}_t^b + \tilde{c}_t^d + \tilde{c}_t^v + \tilde{c}_t^h$$

- Bank savings: $\tilde{c}_t^b = y_t^b - \Delta b_t$
 - y_t^b : earned interests ; Δb_t : change in bank savings
- Debt: $\tilde{c}_t^d = -y_t^d + \Delta d_t$
 - y_t^d : paid interests ; Δd_t : change in debt
- Other financial assets: $\tilde{c}_t^v = y_t^v - \Delta v_t$
 - y_t^v : interests, dividends, price change $\Delta p_t^v \times q_{t-1}^v$
 - Δv_t : change in stock value $p_t^v q_t^v - p_{t-1}^v q_{t-1}^v$
- Real assets: $\tilde{c}_t^h = y_t^h - \Delta h_t$
 - y_t^h : rent, imputed rent, price change
 - Δh_t : change in stock value

Identifying Dynamic Consumption Responses to U

- Event Study Methodology:

$$Y_{it} = \alpha_i + \nu_t + \sum_{j=-N_0}^{N_1} \beta_j \cdot \mathbb{1}[J_{it} = j] + \varepsilon_{it} \quad (1)$$

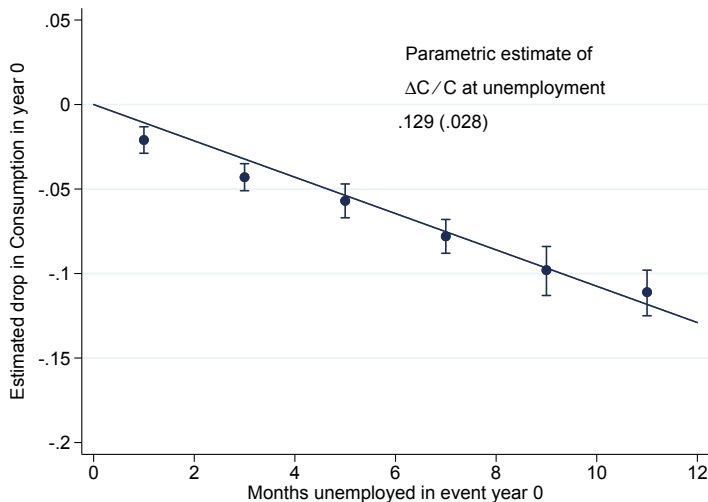
- $[-N_0; N_1]$: window of dynamics effects
 - $J_{it} = t - E_{it}$: event time
- Potential concern: only identifies β_j up to a trend (cf. Borusyak & Jaravel [2017])
- Solution: control group to fully identify ν_t
 - NN matching based on pre-characteristics

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From Annual to Flow Drops in Consumption

- How to re-cover consumption wedge from yearly aggregates mixing employment and unemployment consumption, c_e and c_u ?
- Focus on spells ongoing in December, and compute drop by time spent unemployed during the year

From Annual to Flow Drops in Consumption



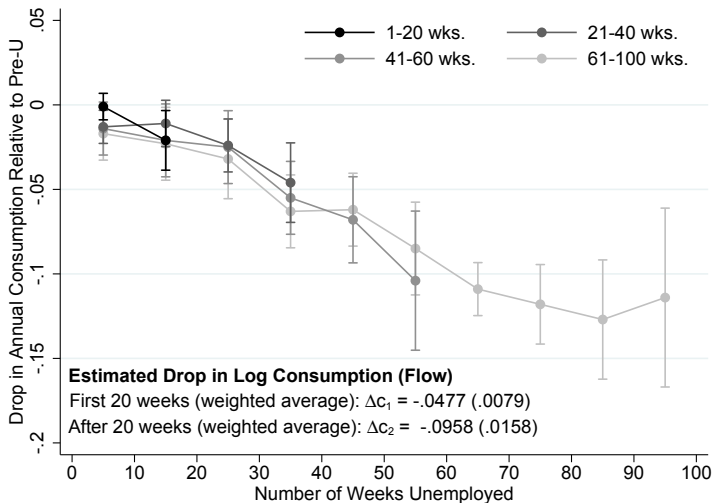
From Annual to Flow Drops in Consumption

- How to re-cover consumption wedge from yearly aggregates mixing employment and unemployment consumption, c_e and c_u ?
- Focus on spells ongoing in December, and compute drop by time spent unemployed during the year
- Parametric approach nicely fits the non-parametric estimates

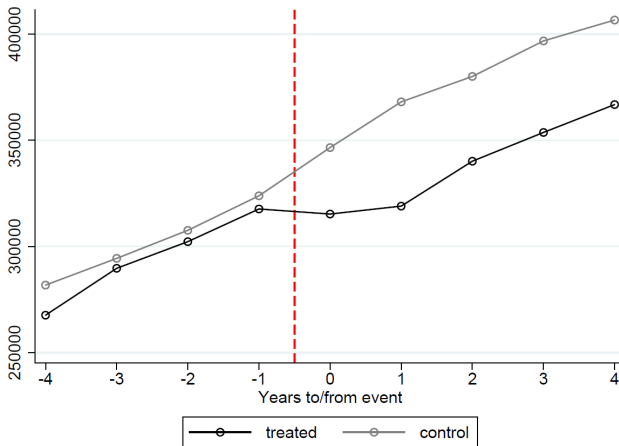
$$\frac{c_e - c_u}{c_e} = \frac{12}{N} \cdot \frac{\Delta C}{C} = .129(.028)$$

- Fully non-parametric approach gives similar results (KLNS [2018])
- Similar estimates (but 10 times less precise!) using consumption surveys (KLNS [2018])

From Annual to Flow Drops in Consumption: Selection



Event Study: Treated vs. NN



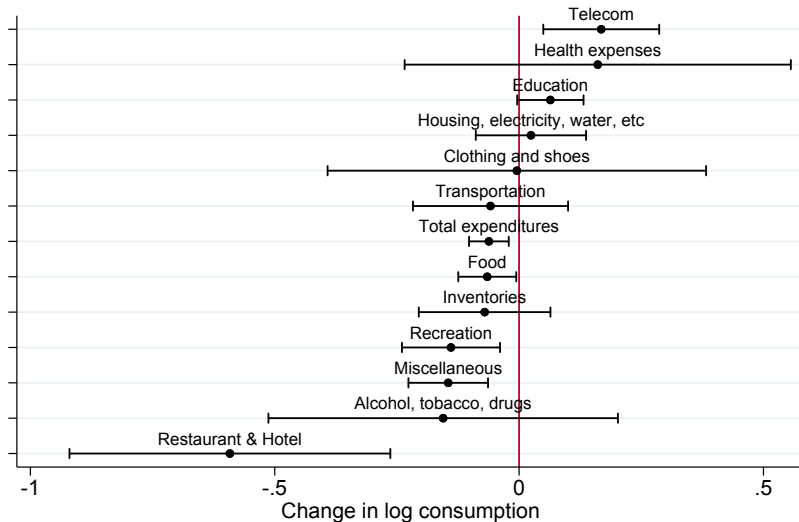
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Table: SUMMARY STATISTICS PRE-UNEMPLOYMENT - 2003KSEK

	Mean	P25	P50	P75	P90
Gross earnings	151	43	134	229	296
Capital Income	0	0	0	.2	2.5
Disposable Income	148	91	140	186	236
Net worth (A+B-C)	162	-52	0	124	617
<i>% of disp. income</i>	110	-39	0	123	420
Financial assets (A)	75	0	4	48	170
<i>% of disp. income</i>	65	0	4	47	162
Bank holdings	27	0	0	12	63
<i>% of disp. income</i>	20	0	0	8	49
Mutual funds	25	0	0	10	55
<i>% of disp. income</i>	27	0	0	9	65
Stocks	14	0	0	0	8
<i>% of disp. income</i>	9	0	0	0	6
Real Estate (B)	267	0	0	267	888
<i>% of disp. income</i>	178	0	0	159	511
Debt (C)	181	0	50	236	519
<i>% of disp. income</i>	132	0	37	161	326

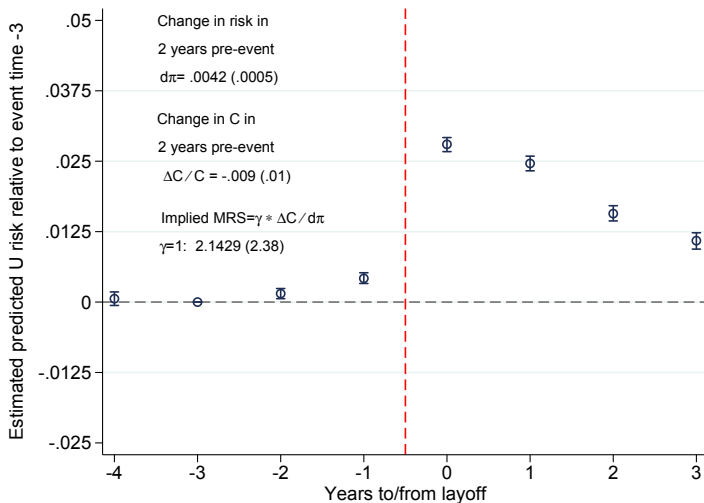
Notes: From Kolsrud et al. (2016): sample of individuals observed in December of year t starting unemployment spell in first 6

Consumption surveys: estimated expenditure drops



Note: The graph shows estimates and CIs of DiD coefficients, in regressions with HH-level controls. Log expenditure is averaged pre [-3, -2, -1] and post-event [0, 1, 2, 3]
Control households are created via p-score matching

Anticipation: Predicted Risk Over Event Time



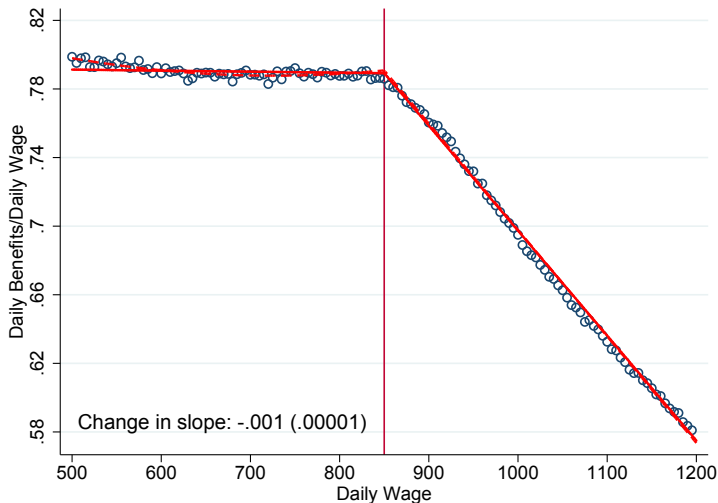
MPC: Transfer

- Residualise transfers wrt rich vector X :
 - Age, Year, Gender, Education, Family type, # HH members dummies
 - HH level: decile dummies of: net wealth + lag, labour income (Forvlnk), lag of disposable income, FKURTA (debt), real estate wealth + lag, capital income
 - Dummies for municipality of residence j
 - Dummy for no of earners in HH (1 earner or more than 1 earner)
- First-difference model:

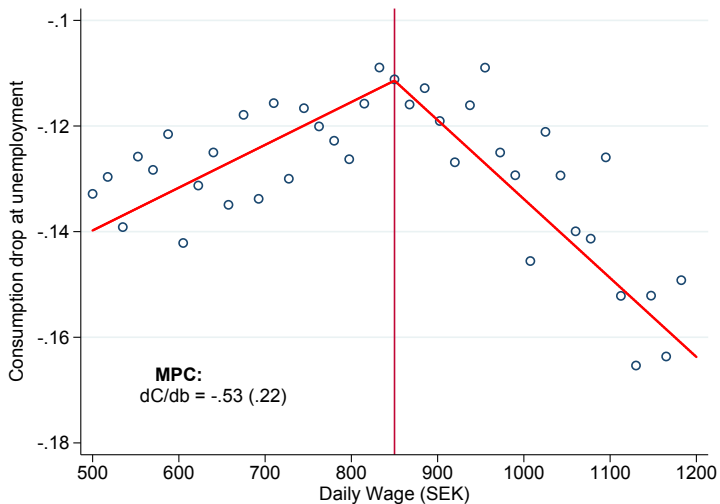
$$\Delta C_{ijt} = \gamma_E \Delta h_{ijt} \cdot \mathbf{1}[E = 1] + \gamma_U \Delta h_{ijt} \cdot \mathbf{1}[U = 1] + \Delta X'_{ijt} \beta$$

- Exploit both variation across municipalities over time, and within municipality across individuals over time
- IV:
 - Instrument FD T_{ijt} by FD residualized h_{ijt}
 - Ideally: grouping instrument (FD of average local transfers h_{ijt} in bin of X s)

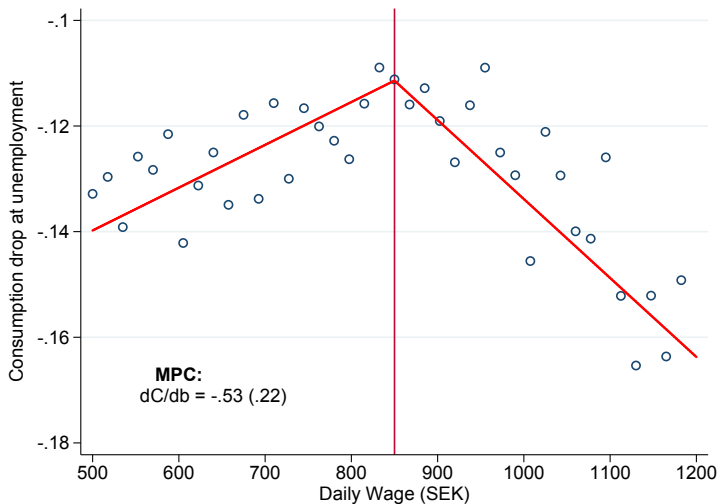
RKD: UI Benefits As Function of Daily Wage



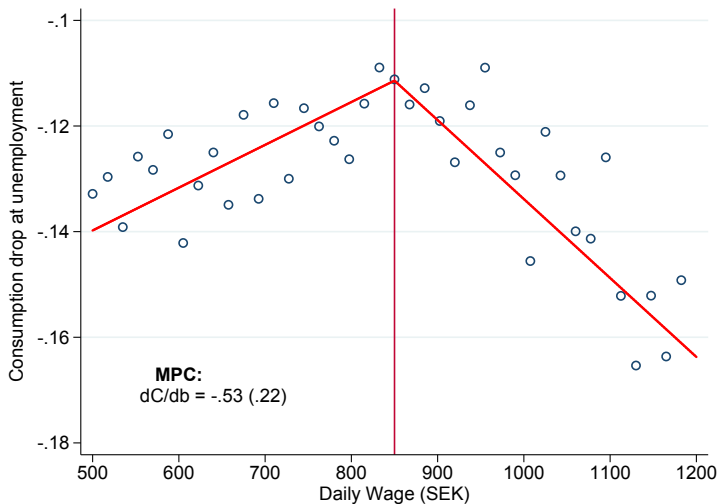
RKD: Drop in Consumption vs Daily Wage



RKD: Drop in Consumption vs Daily Wage



RKD: Drop in Consumption vs Daily Wage



- Validity of RKD setting: see KLNS [2018]
- RKD specification:

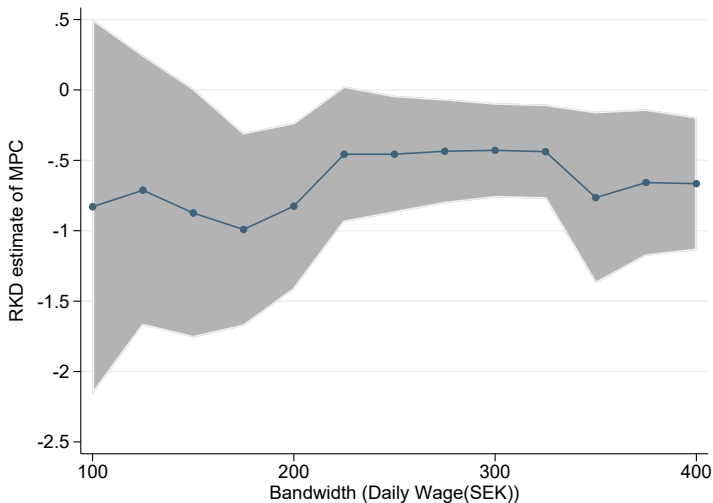
$$\Delta C_i = \beta_0 \cdot (w - k) + \beta_1 \cdot (w - k) \cdot \mathbf{1}[w > k] + \sum_j \mathbf{1}[D = j] + X' \beta$$

- ΔC : drop in yearly consumption at U (btw event years -1 and 0)
- UI schedule kinked function of daily wage at $w = k$
- **Control function approach**
 - D : duration of U spell in months
- MPC:

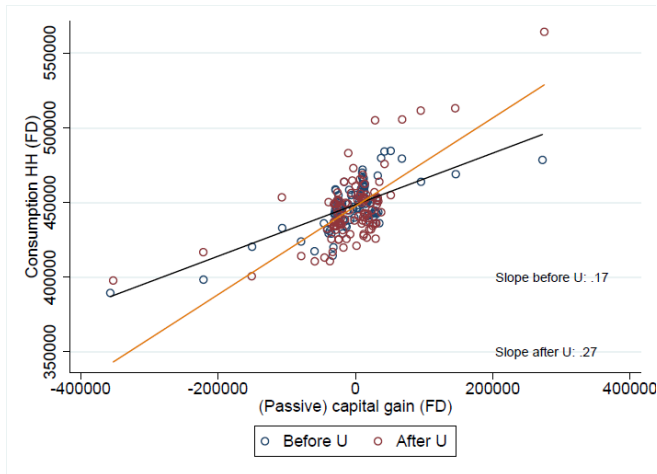
$$\frac{dC}{db} = \frac{\Delta_{w^-, w^+}(\partial \Delta C / \partial w)}{\Delta_{w^-, w^+}(\partial b / \partial w)} = \frac{\hat{\beta}_1}{.8 \cdot 30 \cdot \bar{D}}$$

- Multiply .8 by $30 \cdot \bar{D}$ to translate into yearly benefit variation

RKD Robustness: Bandwidth



MPC: K gain shocks



Back

MPC out of capital income shocks

Table: Response of Annual Consumption to Capital Income Shocks

	Pre U shock IV	After U shock IV	Implied MRS
Stock returns	0.165*** (.00414)	0.276*** (.00491)	1.87
Dividends	0.123*** (.0268)	0.216*** (0.0165)	1.95
N	884,736	164,707	

MPC approach: Details

- Combining and implicitly differentiating FOC's:

$$\frac{u'_u(c_u)}{u'_e(c_e)} = \frac{p_u}{p_e} \times \frac{v'_u(x_u)}{v'_e(x_e)} \quad \& \quad \frac{dc_s}{dy_s} = \frac{p_s \frac{v''_s/v'_s}{u''_s/u'_s}}{1 + p_s \frac{v''_s/v'_s}{u''_e/u'_e}}$$

- 'Regularity' conditions:

$$\textcircled{1} \quad \frac{v'_u(x_u)}{v'_e(x_e)} > 1$$

$$\textcircled{2} \quad \frac{v''_u / v'_u}{u''_u / u'_u} = \frac{v''_e / v'_e}{u''_e / u'_e}$$

- ③ preferences separable in c and x

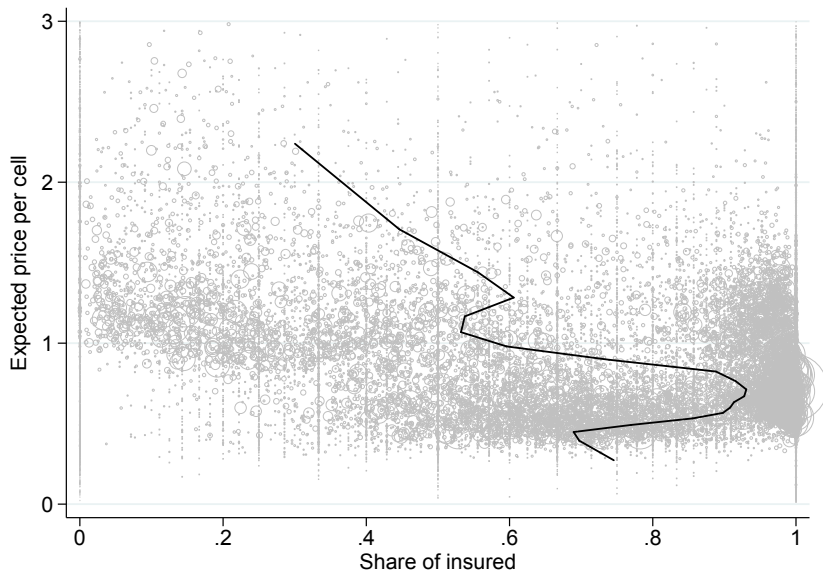
- ④ interior optimum

- Note that bound may be uninformative

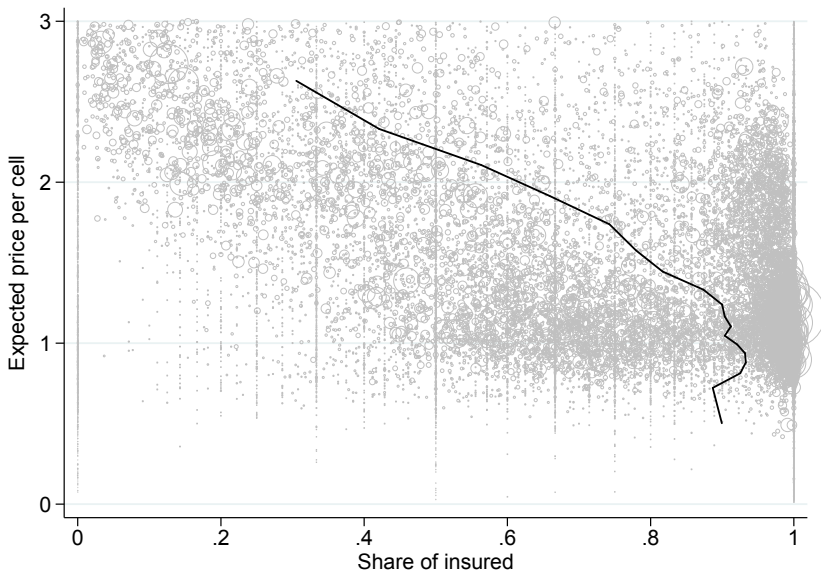
- e.g., insurance setting: $\frac{v'_u(x_u)}{v'_e(x_e)} = \frac{\pi_e}{\pi_u} \gg 1$
- in fact, insurance lowers p_u/p_e below 1 \Rightarrow simple test for insurance!

- Well-known idea: individuals' choices reveal their value for insurance
 - Most obvious/direct case: UI choices
 - Other margins of adjustment: labour supply, search effort, savings, reservation wage, etc.
 - Extend CB approach to wedges in other behavior (Fadlon and Nielsen 2017, Hendren 2017, Finkelstein et al. 2017)
 - Extend CB approach to changes in anticipation of unemployment (Hendren 2017)
 - Study response in unemployment to unemployment benefits vs. other sources of income (Chetty [2008], Landaís [2015])
- Optimization approaches require the studied margin of adjustment to be binding or even unique
 - Consumption is encompassing all potential margins of self-insurance
 - MPC reflects the price of the binding margin of self-insurance

RP non-param: Expected price vs UI Coverage



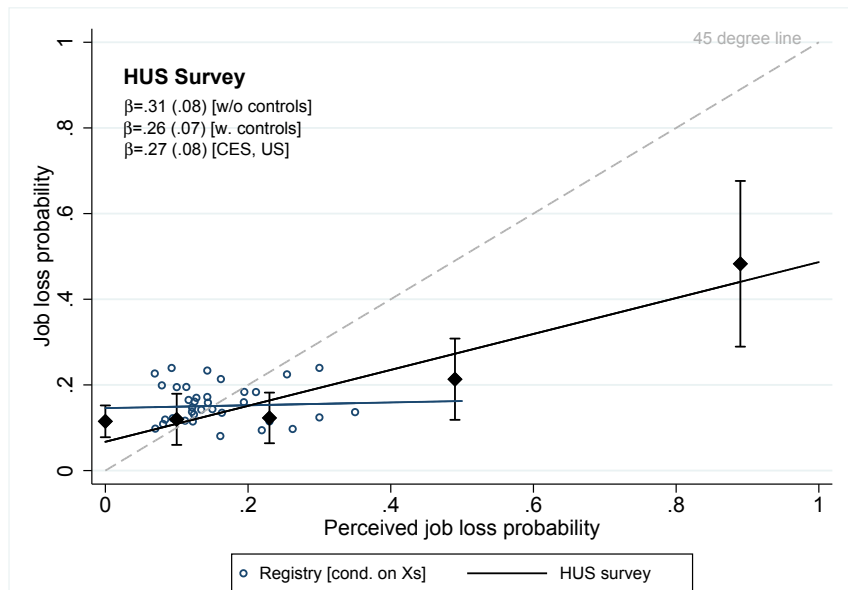
RP non-param: Expected price vs UI Coverage



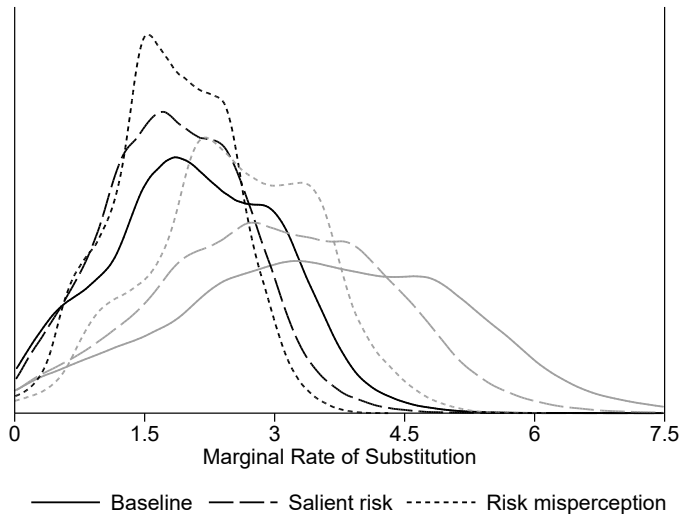
RP Approach: Role of Frictions?

- RP approach relies on EU optimization
 - Assume absence of choice and information frictions
 - e.g., Abaluck and Gruber '11, Barseghyan et al. '13, Handel and Kolstad '15, ...
- Predicted risk π_i = perceived risk $\tilde{\pi}_i$?
 - Private info vs. imperfect info, biased beliefs, salience, etc.
 - Study elicited risk belief in survey matched with our data
 - Little bias on average, but $\text{Corr}(\pi_i, \tilde{\pi}_i) \ll 1$
- Account in structural estimation for wedge $\pi_i \neq \tilde{\pi}_i$:
 - 1 Correct for misperception $\hat{\beta}[\pi_i - \tilde{\pi}_i]$ in calculation of expected price
 - 2 Use salient risk 'shifters' (firm layoff rate and worker's unemployment) to predict risk

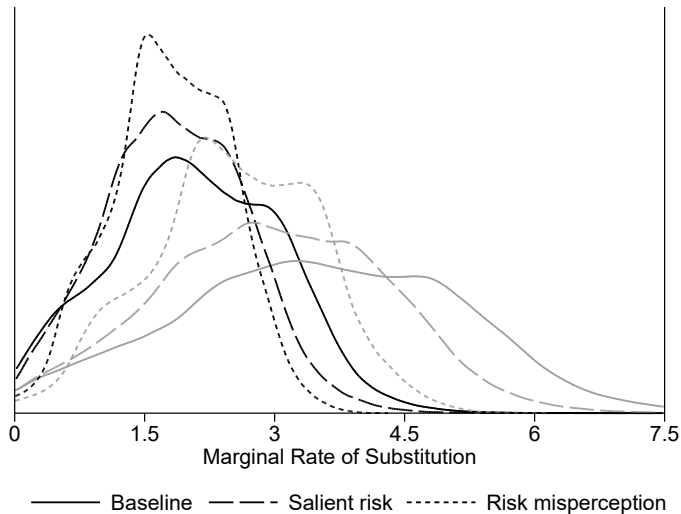
Evidence from Elicited Risk Perceptions



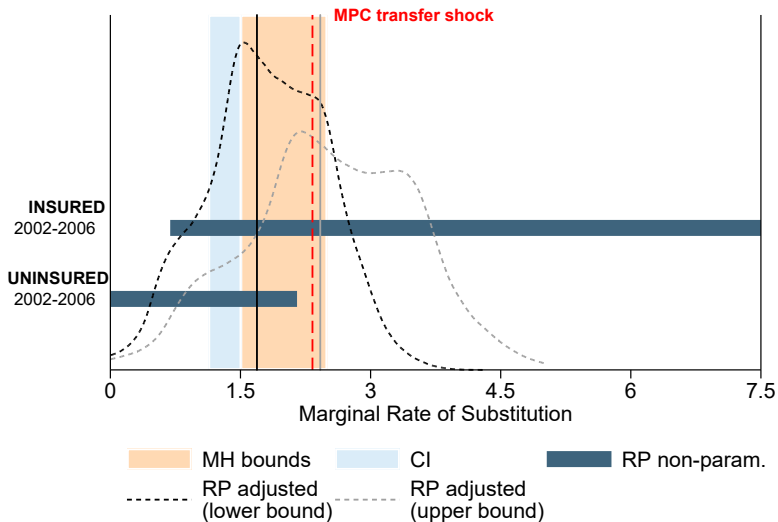
Adjusted RP Parametric: MRS distributions



Adjusted RP Parametric: MRS distributions



Adjusted RP Parametric: MRS distributions



RP approach: Robustness - Details

- Self-insurance / Savings:
 - presence of alternative means to smooth consumption reduces value of UI
 - social insurance may crowd-out private insurance
 - conditional on consumption, private insurance responses have only SO impact
- Liquidity constraints:
 - liquidity or borrowing constraints tend to increase value of UI
 - however, value is still entirely captured by $u'_u(c_u)$
 - only when consumption cannot respond (e.g., committed expenditures), $u'_u(c_u)$ will under-estimate value of UI
- Moral hazard:
 - envelope conditions again apply; individual unaffected by fiscal externality
 - using $\pi(z_1) > \pi(\bar{z})$ for approximation, we overestimate insurance value and thus RHS provides a (weaker) lower bound
 - using $\pi(z_0) < \pi(\bar{z})$ for approximation, we underestimate insurance value and thus RHS provides a (weaker) upper bound

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Combining CI and RP: Details

- How do approximations for two methods interact?
 - CI approach provides estimate of $MRS|_{z_1}$ and $MRS|_{z_0}$ for insured and uninsured respectively
 - RP approach provides estimates of $MRS|_{\bar{z}}$ for both groups
 - Under risk-aversion, $MRS|_{z_1} \leq MRS|_{\bar{z}} \leq MRS|_{z_0}$
 - Hence, for the insured:
 - RP approach provides a (weaker) lower bound for $MRS|_{z_0}$ ($> MRS|_{\bar{z}}$), but not necessarily for $MRS|_{z_1}$
 - BUT CI approach indicates that $MRS|_{z_0} \leq MRS|_{z_1} + \gamma \frac{\Delta b}{c} \leq 1 + \gamma \left[\frac{\Delta c + \Delta b}{c} \right]$
 - Using Δb as the upper bound on the additional consumption drop when unemployed under z_0 rather than z_1 , we find conservative lowerbound on $\gamma : \left[\frac{1-\pi}{\pi} \frac{\tau_1 - \tau_0}{b_1 - b_0} - 1 \right] / \left[\frac{\Delta c + \Delta b}{c} \right]$
 - Differences in consumption under the two contracts seem small though. So assuming $MRS|_{z_1} \cong MRS|_{\bar{z}} \cong MRS|_{z_0}$ We will investigate this further.
- Selection into unemployment:
 - We estimate the revealed value of insurance for all workers, but the consumption drops only for displaced workers.
 - If expected consumption drops for non-displaced workers would be lower (higher), we are underestimating (over-estimating) γ

Combining CI and RP (cont'd): Details

- Within-group heterogeneity:

- CI approach over-estimates MRS if $\text{corr}\left(\gamma, \frac{\Delta c}{c}\right)$ is negative. Evidence that the uninsured (with lower γ) have smaller consumption drops goes in the other direction
- RP approach would be robust to heterogeneity if we had info on individual risk types π_i . Instead, we are using risk-realizations to get average group risks.
- That is, by using $\frac{E(1-\pi)}{E(\pi)}$ we are overestimating $E\left(\frac{1-\pi}{\pi}\right)$ and more so if heterogeneity within-group is important

- Eligibility and ex-post risk realizations:

- individuals can switch in and out of UI, but need to be contributing for 12 months to be eligible
- we consider unemployment risk in $t+1$ for individuals making UI choice in t
- we restrict sample to individuals who would be eligible when becoming unemployed in $t+1$ (i.e., sufficient earnings and no unemployment in t)
- this sample restriction + choice of outcome variable reduces estimated unemployment risk relative to average unemployment risk
- e.g., unemployment risk for our sample is higher in $t+2$, so when they factor in inertia when deciding at t , we would be underestimating the decision-relevant unemployment risk and thus overestimate the MRS

The Swedish UI System: Details (I)

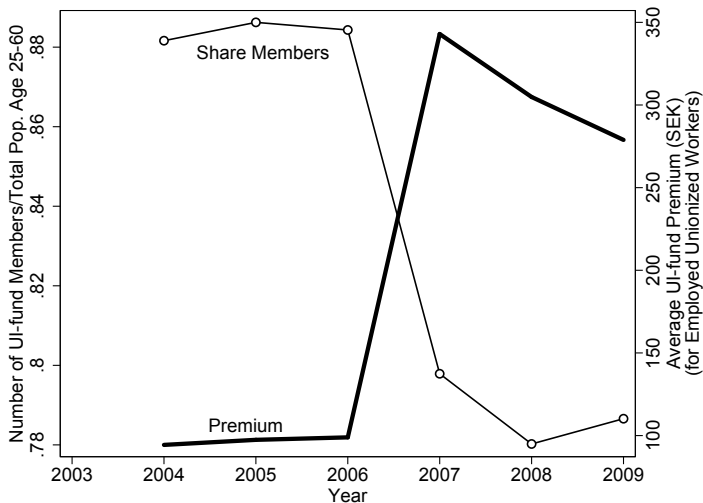
- Eligibility rules for displaced workers:
 - Work requirement to be eligible to any UI coverage (minimum or supplemental):
 - Within the past 12 months have worked more than 6 calendar months at least 80h per month
 - To be eligible to supplemental UI coverage:
 - Fulfill work requirement + have been contributing to a UI-fund for 12 mths prior to layoff
- Quits
 - Cannot receive UI benefits for first 10 weeks of U spell
 - In our data, we can identify quits to control for potential extra moral hazard from quits vs layoffs
- Basic coverage:
 - Fixed daily amount of 320 SEK ($\approx 20\%$ of median daily wage)
- Supplemental coverage:
 - Identical for all UI funds
 - 80% of daily wage up to cap
 - Daily benefit = $\text{Max}(320, \min(.8 * \text{daily wage}, 680))$

The Swedish UI System: Details (II)

- Premia determination:
 - Government controls formula for premia of supplemental coverage
 - No price discrimination (by gender, age, etc.)
 - No price differentiation across UI funds (until 2007, limited differentiation after 2007)
- Link between Kassar and Unions:
 - UI funds were historically linked to Unions
 - But not necessary to be member of Union to be member of Kassa
 - Being member of Kassa does not buy Union membership
 - We observe and always control for Union membership in regressions

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Price Variation: the 2007 Reform



Source: Landais et al. ('16) [▶ Back](#)

Table: SUMMARY STATISTICS

	Mean	P10	P50	P90
I. Unemployment				
Layoff probability	2.41%	-	-	-
Unemployment probability	2.41%	-	-	-
Unemployment spell (days)	1.88	0	0	0
Duration of spell (days)	223.7	28	126	529
II. Union and UI Fund Membership				
Union membership	0.76	-	-	-
UI fund membership	0.88	-	-	-
III. Demographics				
Age	40.99	29	41	53
Fraction men	0.52	-	-	-
Fraction married	0.46	-	-	-
IV. Income and Wealth, SEK 2003(K)				
Gross earnings	261	118.4	240.5	399.5
Net wealth	354	-181.2	100	1065.8
Bank holdings	47	0	0	114.9

Note: Sample consists of 23,535,839 distinct person-year observations, ages 25-55, years 2002-2006. [▶ Back](#)

Table: SUMMARY STATISTICS: INDIVIDUALS WITH SUPPLEMENTAL UI

	Mean	P10	P50	P90
I. Unemployment				
Layoff probability	2.57%	-	-	-
Unemployment probability	2.57%	-	-	-
Unemployment spell (days)	2	0	0	0
Duration of spell (days)	224.84	27	126	533
II. Union and UI Fund Membership				
Union membership	0.85	-	-	-
UI fund membership	1	-	-	-
III. Demographics				
Age	41.25	30	41	53
Fraction men	0.5	-	-	-
Fraction married	0.47	-	-	-
IV. Income and Wealth, SEK 2003(K)				
Gross earnings	259.1	126.7	241.2	392.4
Net wealth	315.4	-171.6	102.8	1003.2
Bank holdings	42.5	0	0	110.6

Note: Sample consists of 23,535,839 distinct person-year observations, ages 25-55, years 2002-2006. [▶ Back](#)

Table: SUMMARY STATISTICS: INDIVIDUALS WITHOUT SUPPLEMENTAL UI

	Mean	P10	P50	P90
I. Unemployment				
Layoff probability	1.31%	-	-	-
Unemployment probability	1.31%	-	-	-
Unemployment spell (days)	1.02	0	0	0
Duration of spell (days)	207.98	35	137	455
II. Union and UI Fund Membership				
Union membership	0.14	-	-	-
UI fund membership	0	-	-	-
III. Demographics				
Age	39.17	27	39	52
Fraction men	0.67	-	-	-
Fraction married	0.4	-	-	-
IV. Income and Wealth, SEK 2003(K)				
Gross earnings	275.6	79.7	232.9	463.3
Net wealth	645.1	-249.6	69.4	1723.5
Bank holdings	80.5	0	0	159.5

Note: Sample consists of 23,535,839 distinct person-year observations, ages 25-55, years 2002-2006. [▶ Back](#)