Benefit Duration, Unemployment Duration and Employment Stability: A Regression Discontinuity Approach

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Econometrics and Descriptives

Results and Conclusions

Introduction I

- The generosity of the UI system plays a central role for the job search behavior of unemployed individuals
- A comparison of benefit schemes in different countries shows a correlation between unemployment and potential duration of unemployment benefits (Nickell and Layard, 1999)
- The disincentive effect of UI is conventional wisdom in modern labor economics
- Fails to take into account the potential benefical effects of UI on post-employment outcomes
- By allowing more time and more resources for search, UI may improve job matching

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Introduction II

- Also within countries we observe differences in the generosity of UI for different groups
- In this paper we make use of sharp discontinuities in the maximum duration of benefits in Germany at different ages to evaluate the effect of UI on:
 - unemployment duration
 - subsequent employment duration as a measure of employment stability

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Results and Conclusions

Theoretical Arguments and Evidence I

- Standard search theory predicts that an increase in UI benefit generosity has a negative impact on job search activities and leads to increased unemployment duration
 - unemployed exert lower search effort as the utility of being unemployed is higher and they choose higher reservation wages
 - closer to the time of benefit exhaustion the value of unemployment drops:
 - marginal benefit of search increases and reservation wage falls
 - higher exit rate out of unemployment (Mortensen, 1977; Burdett, 1979; van den Berg, 1990)
- Many empirical studies show positive relationship between benefit duration and unemployment duration
 - Meyer 1990; Katz and Meyer 1990; Hunt 1995; Lalive 2008; Lalive and Zweimueller 2004; Lalive, van Ours and Zweimueller 2006; van Ours and Vodopivec 2006

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Theoretical Arguments and Evidence II

- Despite the disincentive effect, UI benefit generosity may allow individuals - by providing more time and more resources - to wait for job offers which are better either in terms of re-employment wages or employment stability
 - the overall effect on unemployment is ambiguous
- The Macro literature has pointed to the positive effects of UI:
 - Burdett (1979): "search subsidy"
 - Marimon and Zilibotti (1999); Acemoglou and Shimer (1999): "job matching"
 - Hansen and Imrohoroglou (1992); Gruber (1997): "consumption smoothing"

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Theoretical Arguments and Evidence III

The empirical literature has considered two outcomes:

- Wages
 - Ehrenberg and Oaxaca (1976), Classen (1977); Addison and Blackburn (2000)
- Employment duration
 - Belzil (1992, 1995, 2001) using Canadian data
 - Centeno (2004) using US data
 - van Ours and Vodopivec (2008) using Slovenian data
 - Tatsiramos (2008) focusing on eight European countries

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Main Contribution

- We use sharp discontinuities in the maximum duration of benefit entitlement with respect to age to study both the search behavior during unemployment and the effect on job match quality
- First study based on an age-based RD design that looks at the job match quality question

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Institutional Background I

- The amount of unemployment benefits depends on family status and previous average wages: 67% with and 60% without children
- Maximum duration of unemployment benefits depends on previous employment duration and age
- After entitlement period has expired: principally unlimited and means-tested unemployment assistance
- We make use of the variation between age groups in our observation period (inflow sample of 2001–2003)

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Institutional Background II

Table: Benefit Entitlement

| Length of Benefit | Age | Months worked |
|-------------------|------------|-----------------|
| Entitlement | (in years) | in last 7 years |
| (in months) | | |
| 6 | - | 12 |
| 8 | - | 16 |
| 10 | - | 20 |
| 12 | - | 24 |
| 14 | 45 | 28 |
| 16 | 45 | 32 |
| 18 | 45 | 36 |
| 20 | 47 | 40 |
| 22 | 47 | 44 |
| 24 | 52 | 48 |
| 26 | 52 | 52 |
| 28 | 57 | 56 |
| 30 | 57 | 60 |
| 32 | 57 | 64 |

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| 18 | 45 | 36 |
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| 22 | 47 | 44 |
| 24 | 52 | 48 |
| 26 | 52 | 52 |
| 28 | 57 | 56 |
| 30 | 57 | 60 |
| 32 | 57 | 64 |

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- Inflow sample into unemployment 2001-2003, Integrated Labor Market Biographies (IEB)
- Information on employment history, unemployment, participation in ALMP, occupational information, socio-demographic variables (age, marital status, number of children, education etc.)
- Two states: Unemployment and Employment
- Single spells
- Unemployment includes participation in ALMP like training and wage subsidies
- Employment: regular employment (subject to social security contributions), no self-employment
- Men from West Germany aged between 44-46

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Sample II

Table: Number of Observations - Below and Above the Thresholds

| | Versi | on A | Vers | ion B |
|---------------|-------|-------|-------|-------|
| | Below | Above | Below | Above |
| Age Threshold | | | | |
| 45 years | 1763 | 1639 | 1622 | 1475 |
| 47 years | 1428 | 1409 | 1311 | 1267 |
| 52 years | 1198 | 1139 | 1108 | 1026 |
| 57 years | 816 | 1153 | 761 | 1030 |

Note: These are the observations conditional on having been employed for 36/44/52/64 months in the last seven years. In version A groups are defined directly around the threshold, in version B around the threshold minus 0.1 years.

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Sample III

Table: Number of Transitions

From UE to Employment

| | Exits | Censored |
|---|-------|----------|
| N | 2,546 | 856 |
| % | 74.8 | 25.2 |

From E to Unemployment

| | Exits | Censored |
|---|-------|----------|
| N | 1,011 | 1,535 |
| % | 39.7 | 60.3 |

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Econometric Approach I

- Assignment to treatment (extended benefit duration) is completely determined by age: sharp regression discontinuity design.
- Identification Assumption: no selection into treatment / smoothness of conditional regression function around threshold
- Any discontinuity of the conditional distribution of the outcome variable as a function of age at the threshold is interpreted as the causal effect of the treatment.
- Average causal effect of the treatment at the discontinuity point:

$$ATT = E[Y_i(D = 1) - Y_i(D = 0)|Age = c]$$

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Econometric Approach II

(1) Linear regression:

 $Y_i = \alpha_0 + \alpha_1 X_i + \mu_1 D_i + \beta_0 (1 - D_i) (Age_i - Age_0) + \beta_1 D_i (Age_i - Age_0) + \varepsilon_i$

 Y_i : Number of months in unemployment

Caveats of this approach:

- Many right censored observations
- Dynamic selection not taking into account

(2) Bivariate duration model:

$$\lambda_{ue}(t) = \lambda_{u0}(t) \exp(\alpha_{u0} + \alpha_{u1}X_i + \mu_u D_i + \beta_{u0}(1 - D_i)(Age_i - Age_0) + ... + \gamma_{iu})$$
(1)
$$\lambda_{eu}(t) = \lambda_{e0}(t) \exp(\alpha_{e0} + \alpha_{e1}X_i + \mu_e D_i + \beta_{e0}(1 - D_i)(Age_i - Age_0) + ... + \gamma_{ie})$$
(2)

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Identification Issues

- Firms and workers may alter the timing of layoffs leading to non-random selection around the threshold
- We compare the inflow at different age groups around the threshold
- We examine the characteristics of job losers below and above the threshold

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Inflow into Unemployment around Threshold

Figure: Density of Forcing Variable



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Descriptives Around Threshold

Table: Selected Descriptives and *t*-Test of Mean Equality

| Age Group | 45 years | | | |
|--------------------------|----------|-------|-----------------|--|
| | Below | Above | <i>p</i> -value | |
| N | 1763 | 1639 | | |
| Age (in years) | 44.49 | 45.50 | 0.00 | |
| Married | 0.63 | 0.65 | 0.23 | |
| Non-German | 0.10 | 0.09 | 0.80 | |
| Migration background | 0.04 | 0.03 | 0.15 | |
| Children \leq 10 years | 0.17 | 0.15 | 0.10 | |
| School Degree | | | | |
| No degree | 0.08 | 0.09 | 0.51 | |
| Low | 0.60 | 0.60 | 0.96 | |
| Medium | 0.15 | 0.14 | 0.25 | |
| High | 0.16 | 0.17 | 0.59 | |
| Apprenticeship (yes) | 0.81 | 0.79 | 0.22 | |
| University Degree (yes) | 0.12 | 0.13 | 0.70 | |

Note: p-value for t-test of mean equality between above/below age groups.

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Descriptives Around Threshold

Table: Selected Descriptives and t-Test of Mean Equality (contd.)

| Age Group | 45 years | | |
|---------------------------------------|----------|-------|-----------------|
| | Below | Above | <i>p</i> -value |
| N | 1763 | 1639 | |
| Occupational Group | | | |
| Agriculture, Other | 0.03 | 0.03 | 0.38 |
| Manufacturing | 0.48 | 0.49 | 0.57 |
| Technical Occupations | 0.06 | 0.06 | 0.75 |
| Services | 0.43 | 0.41 | 0.47 |
| Labor Market History | | | |
| Last daily income (in Euro) | 76.24 | 76.79 | 0.67 |
| Employment last 3 years (in months) | 30.64 | 30.75 | 0.67 |
| Employment last 4-7 years (in months) | 38.92 | 39.29 | 0.36 |
| Unemployed last 7 years (in months) | 5.35 | 5.32 | 0.92 |
| Year cohort | | | |
| 2001 | 0.28 | 0.28 | 0.69 |
| 2002 | 0.35 | 0.34 | 0.39 |
| 2003 | 0.37 | 0.38 | 0.63 |

Note: p-value for t-test of mean equality between above/below age groups.

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Unemployment Duration by Age

Figure: Duration of First UE Spell (in months)



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Survival Functions

Figure: Survival Functions - Below/Above 45 years Threshold



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Linear Regression Results I

Table: Linear Regression Results - Unemployment

| | Coef. | s.e. | Coef. | s.e. |
|-------------------------|-------|----------|--------|-----------|
| Treatment Effect | 2.497 | 1.150 ** | 2.099 | 1.129 * |
| Education | | | | |
| Lower Secondary School | | | -2.343 | 0.924 ** |
| Middle Secondary School | | | 0.669 | 1.102 |
| Upper Secondary School | | | 0.480 | 1.343 |
| Apprenticeship | | | -2.229 | 0.744 *** |
| University | | | -0.679 | 1.150 |
| Demographics | | | | |
| Married | | | -2.576 | 0.534 *** |
| Children under 10 years | | | -0.053 | 0.697 |
| Non National | | | 1.475 | 0.862 * |
| Migrant | | | -1.568 | 1.346 |
| Labor Market History | | | | |
| Last daily income | | | -0.025 | 0.008 *** |
| etc | | | | |

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Linear Regression Results II

Table: Linear Regression Results - Employment

| | Coef. | s.e. | Coef. | s.e. |
|---|-------|-------|---|---|
| Treated Treated * (PUD 4-6) Treated * (PUD 7-9) Treated * (PUD 10-12) Treated * (PUD 13-15) Treated * (PUD 16-18) Treated * (PUD 19-21) | 0.427 | 1.123 | 0.028 0.718 0.411 6.563 0.714 2.161 0.579 | 1.194 1.245 1.519 1.953 *** 1.970 2.129 2.827 |
| etc | | | 0.579 | 2.827 |
| etc | | | | |
| (PUD 4-6) | | | -3.286 | 0.846 *** |
| (PUD 7-9) | | | -4.481 | 1.061 *** |
| (PUD 10-12) | | | -7.048 | 1.268 *** |
| (PUD 13-15) | | | -4.480 | 1.255 *** |
| (PUD 16-18) | | | -8.603 | 1.537 *** |
| (PUD 19-21) | | | -8.872 | 2.174 *** |
| (PUD 22-24) | | | -11.693 | 1.836 *** |
| etc | | | | |

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| Treated * (PUD 13-15) | | | 0.714 | 1.970 |
| Treated * (PUD 16-18) | | | 2.161 | 2.129 |
| Treated * (PUD 19-21) | | | 0.579 | 2.827 |
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Results and Conclusions

Discrete-Time Logistic Hazard Estimates I

Table: Discrete-Time Logistic Hazard Estimates - Unemployment Transition

| | Without UH | | | | With UH | |
|---------------------|------------|-----------|--------|-----------|---------|-----------|
| | Coef. | s.e. | Coef. | s.e. | Coef. | s.e. |
| Treated | -0.178 | 0.10* | | | | |
| Treated $* t(1-3)$ | | | -0.165 | 0.117 | -0.223 | 0.152 |
| Treated * t(4-6) | | | -0.184 | 0.138 | -0.277 | 0.170 |
| Treated * t(7-9) | | | -0.060 | 0.161 | -0.151 | 0.192 |
| Treated * t(10-12) | | | -0.378 | 0.198 * | -0.481 | 0.227 ** |
| Treated * t(13-15) | | | -0.503 | 0.202 ** | -0.656 | 0.233 *** |
| Treated * t(16-18) | | | -0.036 | 0.217 | -0.198 | 0.249 |
| etc | | | | | | |
| Duration Dependence | | | | | | |
| t(4-6) | -0.414 | 0.062 *** | -0.406 | 0.085 ** | -0.207 | 0.099 ** |
| t(7-9) | -0.769 | 0.075 *** | -0.819 | 0.104 *** | -0.489 | 0.135 *** |
| t(10-12) | -1.224 | 0.093 *** | -1.129 | 0.123 *** | -0.698 | 0.167 *** |
| t(13-15) | -1.135 | 0.095 *** | -0.986 | 0.123 *** | -0.431 | 0.188 ** |
| t(16-18) | -1.238 | 0.105 *** | -1.304 | 0.150 *** | -0.629 | 0.222 *** |
| etc | | | | | | ۲۲۸ ک |

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Discrete-Time Logistic Hazard Estimates I

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Discrete-Time Logistic Hazard Estimates II

Table: Discrete-Time Logistic Hazard Estimates - Employment Transition

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|--------------------------|--------|-----------|--------|-----------|--------|-----------|
| | 6 6 | vvitno | | | ~ vv | |
| | Coef. | s.e. | Coef. | s.e. | Coef. | s.e. |
| Treated | -0.122 | 0.151 | -0.094 | 0.168 | -0.132 | 0.185 |
| Treated * (PUD 4-6) | | | -0.001 | 0.166 | 0.003 | 0.181 |
| Treated * (PUD 7-9) | | | 0.040 | 0.218 | -0.010 | 0.236 |
| Treated * (PUD 10-12) | | | -0.809 | 0.315 *** | -0.931 | 0.343 *** |
| Treated * (PUD 13-15) | | | -0.123 | 0.325 | -0.212 | 0.345 |
| etc | | | | | | |
| Previous Unemp. Duration | on | | | | | |
| (PUD 4-6) | 0.258 | 0.083 *** | 0.257 | 0.111 ** | 0.354 | 0.133 *** |
| (PUD 7-9) | 0.237 | 0.110 ** | 0.215 | 0.157 | 0.378 | 0.190 ** |
| etc | | | | | | |
| Duration Dependence | | | | | | |
| t(4-6) | 0.461 | 0.113 *** | 0.464 | 0.113 *** | 0.486 | 0.115*** |
| t(7-9) | 0.948 | 0.109 *** | 0.953 | 0.109 *** | 1.007 | 0.114 *** |
| etc | | | | | | \frown |
| | | | | | | |

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| etc | | | | | | \frown |
| | | | | | | |

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- We find evidence of a significant positive effect of extended benefit duration on employment stability
- The effect is highest for those who have spent less than 1 year in unemployment
- Job accepted within 10-12 months since unemployment last longer for those unemployed who have still 6 remaining insured months
- Next steps:
 - Consider job duration / Distinguish between job-to-job vs. job-to-unemployment
 - Consider effects on wages