Ho do Routine Tasks and Offshorability Influence Unemployment Duration and Subsequent Job Quality

> Bernhard Schmidpeter <sup>1</sup> Rudolf Winter-Ebmer <sup>2</sup>

<sup>1</sup>ESRC Research Centre on Micro-Social Change, Essex

<sup>2</sup>JKU, Linz and IHS, Vienna, CEPR and IZA

Vienna

- Increasing public concern about job instability, especially among those with 'ordinary' skills.
- Workers in middle-skill occupations are hardest hit during economic downturns (Jaimovich and Siu, 2014).
- Loss of routine jobs has been documented for numerous countries (e.g. Acemoglu and Autor, 2011; Dustmann et al., 2009; Goos et al., 2009).
- Task requirements in previous employment might affect job search.
- Active labor market policy can be used to ameliorate problems of routine workers.

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- Investigates the effect of previous job content on the individual transition rates from unemployment to employment.
- Studies, if previous task inputs have an effect on future match quality of unemployed workers.
- Takes explicitly labor market policies and unobserved heterogeneity into account.
- Assesses if unemployment training can mitigate the effect of a changing working environment.

- Routine job content reduces the transition rate into employment.
- Routine job content reduces significantly the probability of being employed in better or equal paying jobs.
- Routine job content is positively related with receiving unemployment training.
- Training has positive effect on hazard into jobs and can also ameliorate some of the disadvantages

- (ASSD data): Administrative data from Social Security and Employment Office, covering the universe of Austrian workers and containing daily labor market status.
- Unemployment duration observed up to 2 years and information about training measures.
- All unemployment entries during 2000-2004 from male and female workers between 20 and 60 years:
  - Excluding spells from tourism, construction and public services.
  - ► Excluding individuals with highly irregular U-E patterns (no. of unemployment spells ≥ 15).
- Random draw of 70,000 individuals from this pool.

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- We calculate routine task index following Autor and Dorn (2013)
- Offshorability according to Blinder and Krueger (2013)
- Can be linked via ISCO code to Austrian unemployment sample.

• Define three task groups:

routine cognitive/manual, non-routine manual, abstract.

- Definition of groups follows closely Spitz-Oener (2006).
- Calculate the index for occupation *o* as:

$$\textit{RTI}_\textit{o} = \textit{In}\left(rac{\textit{TI}^{\textit{Routine}}}{\textit{TI}^{\textit{Abstract}} + \textit{TI}^{\textit{NR Manual}}}
ight)$$

- Index is increasing in the relative importance of routine tasks.
- Analysis is based on 240 occupations (ISCO-88, 4-digit level) and index is based on 25 tasks.

### Tasks

### Non-Routine Cognitive & Interactive

Analyzing, Planning, Programming, Buying, Advertising, Teaching, Using and Interpreting Law/ Prescriptions, Instructing & Supervising, Care-Taking, Entertaining, Organizing

#### Non-Routine Manual

Gardening& Breeding, Repairing, Building & Installing, Restoring, Driving, Guarding, Cleaning & Disposing, Accommodating

#### **Routine Cognitive**

Paper Work, Calculating, Book Keeping

#### **Routine Manual**

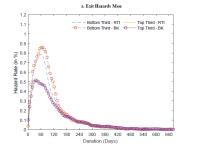
Equipping Machines, Handling Machines, Producing

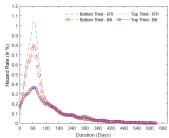
|                                | Men    | Women  |
|--------------------------------|--------|--------|
| Individuals & Spells           |        |        |
| Individuals                    | 35,000 | 35,000 |
| No. of Spells                  | 1.95   | 2.08   |
| Outflow & Training             |        |        |
| Outflow                        | 86.80% | 85.71% |
| to New Job                     | 61.37% | 53.82% |
| to Out of Labor Force          | 27.27% | 33.57% |
| Training Received              | 14.83% | 20.22% |
| Pers. Characteristics          |        |        |
| Age                            | 43.18  | 42.83  |
| Non-Austrian                   | 18.37% | 17.04% |
| at most Com. Schooling         | 17.74% | 29.41% |
| Apprenticeship/ High-School    | 62.77% | 51.84% |
| Matura/ University             | 19.49% | 18.75% |
| Children                       | 44.85% | 63.34% |
| Married                        | 40.79% | 45.26% |
| Divorce                        | 10.97% | 15.76% |
| Others                         | 48.24% | 38.98% |
| Last Employment                |        |        |
| Tenure in Last Job (Days)      | 375.64 | 394.11 |
| Daily Wage in Last Job (Euros) | 76.74  | 49.83  |
| Access to Extended Benefits    | 50.40% | 41.79% |
| Inflow Year                    |        |        |
| Year 2012                      | 55.79  | 52.03  |
| Year 2013                      | 44.21  | 47.97  |

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### **Empirical Transition Rates– Exit**

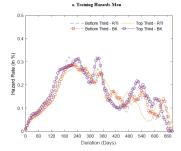


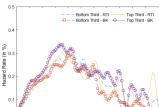


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b. Exit Hazards Women

### **Empirical Transition Rates- Training**





120 180 240 300 360 420

Duration (Davs)

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b. Training Hazards Women

BS-RWE (MiSoC)

Job Content and Unemployment

0 60

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660

480 540 600

- Training may compensate for problems of routine workers, but is not strictly exogenous.
- We jointly model selection into training and unemployment duration using the 'Timing-of-Events' Approach (Abbring and van den Berg, 2003)
- Identification: no-anticipation condition
  - Exact beginning of training cannot be anticipated by job-searchers
- Approach is popular in the policy evaluation literature (van den Berg et al, 2004; Abbring et al., 2005; Richardson and van den Berg, 2013).

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- We assume that the exit and treatment transition rates have a multivariate-proportional hazard form.
- The exit rates are modeled as

 $\theta_{E_s}(T|x,\nu_{E_s},D) = \lambda_{E_s}(T)exp(x'\beta_{E_s} + \gamma_{E_s}RTI + \delta_s(x)\mathbb{1}(T > D) + \nu_{E_s})$ 

- The transition into training is modeled as  $\theta_P(D|x, \nu_P) = \lambda_P(D)exp(x'\beta_P + \gamma_PRTI + \nu_P)$
- We allow δ<sub>s</sub>(x) to depend on covariates (Richardson and van den Berg, 2013): heterogeneity in training effect.
- We assume distribution of {ν<sub>Es</sub>, ν<sub>P</sub>} to be unknown and approximate it by means of a discrete distribution.

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## Likelihood Function

- We imposes that an individual has the same heterogeneity term across unemployment spells.
- The likelihood function is defined as

$$L = \sum_{i=1}^{N} \log \left\{ \sum_{m=1}^{M} p_m \prod_{j=1}^{J_i} \prod_{s=1}^{S} \theta_{E_s} (T_{ij} | x_{ij}, \nu_{E_s}^m, D_{ij})^{\Delta_{ij,E_s}} \exp\left(-\int_0^{T_{ij}} \theta_{E_s} (T_{ij} | x_i, \nu_{E}^m, D_{ij})\right) \\ \theta_P (D_{ij} | x_{ij}, \nu_P^m)^{\Delta_{ij,P}} \exp\left(-\int_0^{D_{ij}} \theta_P (D_{ij} | x_{ij}, \nu_P^m)\right) \right\}$$

- Maximization procedure follows suggestions of Gaure et al. (2007).
- Model with the lowest Akaike-Information Criterion is chosen.

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|   |                            | Male                  |                                      | Female                     |                       |                                      |  |  |
|---|----------------------------|-----------------------|--------------------------------------|----------------------------|-----------------------|--------------------------------------|--|--|
|   | Treatment<br>hazard        | Employment<br>hazard  | Out-of-Labor Force<br>hazard         | Treatment<br>hazard        | Employment<br>hazard  | Out-of-Labor Force<br>hazard         |  |  |
|   | $\theta_{\text{Training}}$ | $\theta_{Employment}$ | $\theta_{\text{Out-of-Labor Force}}$ | $\theta_{\text{Training}}$ | $\theta_{Employment}$ | $\theta_{\text{Out-of-Labor Force}}$ |  |  |
| Panel A: Occ. Require                                       | nents                      |                       |                                      |                            |                       |                                      |  |  |
| $\gamma^{RTI}$  | 0.041<br>(0.017,)          | -0.067<br>(0.009,)    | -0.017<br>(0.012,)                   | 0.191<br>(0.017,)          | -0.362<br>(0.014,)    | 0.00<br>(0.012,)                     |  |  |
| $\gamma^{OFF}$  | 0.101<br>(0.019,)          | -0.245<br>(0.012,)    | 0.039<br>(0.014,)                    | 0.084<br>(0.017,)          | -0.265<br>(0.015,)    | 0.047<br>(0.012,)                    |  |  |
| $\gamma^{\text{RTIxOFF}}$                                   | -0.065<br>(0.014,)         | 0.133<br>(0.008,)     | -0.020<br>(0.009,)                   | -0.088<br>(0.011,)         | 0.223<br>(0.010,)     | -0.018<br>(0.008,)                   |  |  |
| Panel B: Training   |                            |                       |                                      |                            |                       |                                      |  |  |
| δ   |                            | 0.415<br>(0.038,)     | 0.321<br>(0.040,)                    |                            | 0.888<br>(0.040,)     | 0.281<br>(0.034,)                    |  |  |
| Unobs. Heterogeneity<br>Control Variables<br>Log-Likelihood | Yes<br>Yes<br>-35,386.29   |                       |                                      | Yes<br>Yes<br>-44,080.61   |                       |                                      |  |  |

Standard errors are reported in parentheses. Model contains control variables and unobserved heterogeneity with seven mass points. In total, 98 parameters were estimated

## Can ALMP Reduce Disadvantage of Routine and Offshoring Workers?

- Estimated treatment effect not necessarily homogeneous.
- Employment officer may take previous job content into account when assigning training.
- Gains from training might be related to previous job content.
- · We model the training effect as

 $\delta(\mathbf{x}) = \delta + \psi_{\delta} RTI + \rho_{\delta} OFF.$ 

## Model (II) Results for Heterogeneous Treatment Effects

|   |                            | Male                  |                              | Female                     |                       |                             |  |
|---|----------------------------|-----------------------|------------------------------|----------------------------|-----------------------|-----------------------------|--|
|   | Treatment<br>hazard        | rd hazard             | Out-of-Labor Force<br>hazard | Treatment<br>hazard        | Employment<br>hazard  | Out-of-Labor Ford<br>hazard |  |
|   | $\theta_{\text{Training}}$ | $\theta_{Employment}$ | hetaOut-of-Labor Force       | $\theta_{\text{Training}}$ | $\theta_{Employment}$ | $\theta$ Out-of-Labor Force |  |
| Paenl A: Occ. Requirer                    | ments                      |                       |                              |                            |                       |                             |  |
| $\gamma^{RTI}$                            | 0.045<br>(0.017,)          | -0.066<br>(0.009,)    | -0.017<br>(0.012,)           | 0.192<br>(0.018,)          | -0.375<br>(0.015,)    | 0.000<br>(0.012,9)          |  |
| $\gamma^{OFF}$                            | 0.100<br>(0.019,)          | -0.251<br>(0.012,)    | 0.041<br>(0.014,)            | 0.083<br>(0.017,)          | -0.273<br>(0.015,)    | 0.043<br>(0.013,)           |  |
| $\gamma^{\text{RTIxOFF}}$                 | -0.065<br>(0.014,)         | 0.135<br>(0.008,)     | -0.021<br>(0.009,)           | -0.089<br>(0.012,)         | 0.219<br>(0.001,)     | -0.0162<br>(0.008,)         |  |
| Panel B: Training                         |                            |                       |                              |                            |                       |                             |  |
| δ   |                            | 0.425<br>(0.038,)     | 0.312<br>(0.040,)            |                            | 0.871<br>(0.040,)     | 0.282<br>(0.034,)           |  |
| $\beta_{\delta}^{RTI}$                    |                            | -0.025<br>(0.028,)    | 0.024<br>(0.029,)            |                            | 0.138<br>(0.027,)     | -0.018<br>(0.024,)          |  |
| $\beta_{\delta}^{BK}$                     |                            | 0.072<br>(0.029,)     | -0.028<br>(0.029,)           |                            | 0.078<br>(0.027,4)    | 0.023<br>(0.023,)           |  |
| Unobs. Heterogeneity<br>Control Variables | Yes<br>Yes                 |                       |                              | Yes<br>Yes                 |                       |                             |  |
| Log-Likelihood                            | -35,355.59                 |                       |                              | -43,986.88                 |                       |                             |  |

Standard errors are reported in parentheses. Model contains control variables and unobserved heterogeneity with a total of seven mass points. In total, 102 parameters were estimated.

- So far we have not taken re-employment quality into account.
- High-Routine worker who find a new job might be employed in worse matches than before.
- We calculate two variations
  - Duration of the new match after unempmloyment; simple addition to the hazard rate model
  - Wage of the new job (model of Donald et al. (2000): cumulative distribution function of wages can be modeled as a duration hazard

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## Model (III) Results including Post-Unemployment Job Duration

|   | Male   |   |   |  | Female                                       |   |   |  |  |
|---|--|---|---|--|--|---|---|--|--|
| -   | Treatment<br>hazard<br>θ <sub>Training</sub> | Employment<br>hazard<br>θ <sub>Employment</sub> | Out-of-Labor Force<br>hazard<br><sup>0</sup> Out-of-Labor Force | Duration New Job<br>hazard<br><sup>0</sup> New Job | Treatment<br>hazard<br>θ <sub>Training</sub> | Employment<br>hazard<br>θ <sub>Employment</sub> | Out-of-Labor Force<br>hazard<br><sup>θ</sup> Out-of-Labor Force | Duration New Job<br>hazard<br><sup>θ</sup> New Job |  |
| Panel A: Occ. Requirer                                      | nents  |   |   |  |  |   |   |  |  |
| $\gamma^{RTI}$  | 0.043<br>(0.016,)                            | -0.068<br>(0.009,)                              | -0.016<br>(0.011,)  | 0.032 (0.011,)                                     | 0.167<br>(0.017,)                            | -0.312<br>(0.014,)                              | -0.013<br>(0.012,)  | -0.125<br>(0.014,)                                 |  |
| $\gamma^{OFF}$  | 0.096 (0.019,)                               | -0.252<br>(0.012,)                              | 0.040 (0.013,)  | -0.080<br>(0.014,)                                 | 0.073 (0.016,)                               | -0.224<br>(0.014,)                              | 0.035 (0.011,)  | -0.187<br>(0.015,)                                 |  |
| $\gamma^{\text{RTIxOFF}}$                                   | -0.061<br>(0.013,)                           | 0.135<br>(0.008,)                               | -0.018<br>(0.009,)  | -0.004<br>(0.010,)                                 | -0.077<br>(0.011,)                           | 0.194<br>(0.009,)                               | -0.009<br>(0.008,)  | 0.098<br>(0.010,)                                  |  |
| Panel B: Training   |  |   |   |  |  |   |   |  |  |
| δ   |  | 0.393<br>(0.037,)                               | 0.338<br>(0.039,)   | 0.237<br>(0.047,)                                  |  | 0.810<br>(0.037,)                               | 0.238<br>(0.033,)   | -0.065<br>(0.049,)                                 |  |
| Unobs. Heterogeneity<br>Control Variables<br>Log-Likelihood | Yes<br>Yes<br>-49,302.96                     |   |   |  | Yes<br>Yes<br>-54,122.42                     |   |   |  |  |

Standard errors are reported in parentheses. Model contains control variables and unobserved heterogeneity with seven mass points. In total, 129 parameters were estimated.

# Model (IV) Results including Post-Unemployment Wage

|   |                            |                       | Male                                 |                    | Female                     |                       |                                      |                    |  |
|---|----------------------------|-----------------------|--------------------------------------|--------------------|----------------------------|-----------------------|--------------------------------------|--------------------|--|
|   | Treatment<br>hazard        | Employment<br>hazard  | Out-of-Labor Force<br>hazard         | Wage               | Treatment<br>hazard        | Employment<br>hazard  | Out-of-Labor Force<br>hazard         | Wage               |  |
|   | $\theta_{\text{Training}}$ | $\theta_{Employment}$ | $\theta_{\text{Out-of-Labor Force}}$ | $\theta_{\omega}$  | $\theta_{\text{Training}}$ | $\theta_{Employment}$ | $\theta_{\text{Out-of-Labor Force}}$ | $\theta_{\omega}$  |  |
| Panel A: Occ. Require                                       | ments                      |                       |                                      |                    |                            |                       |                                      |                    |  |
| $\gamma^{RTI}$  | 0.043<br>(0.016,)          | -0.067<br>(0.009,)    | -0.015<br>(0.011,)                   | 0.040<br>(0.008,)  | 0.175<br>(0.017,)          | -0.306<br>(0.013,)    | -0.014<br>(0.012,)                   | 0.024<br>(0.011,)  |  |
| $\gamma^{OFF}$  | 0.098<br>(0.019,)          | -0.238<br>(0.012,)    | 0.038<br>(0.013,)                    | -0.095<br>(0.011,) | 0.071<br>(0.016,)          | -0.233<br>(0.013,)    | 0.041<br>(0.012,)                    | -0.098<br>(0.012,) |  |
| $\gamma^{\text{RTIxOFF}}$                                   | -0.062<br>(0.013,)         | 0.127<br>(0.008,)     | -0.019<br>(0.009,)                   | 0.093<br>(0.007,)  | -0.077<br>(0.011,)         | 0.190<br>(0.009,)     | -0.011<br>(0.008,)                   | 0.034<br>(0.008,)  |  |
| Panel B: Training   |                            |                       |                                      |                    |                            |                       |                                      |                    |  |
| δ   |                            | 0.398<br>(0.036,)     | 0.343<br>(0.040,)                    | 0.329<br>(0.033,)  |                            | 0.815<br>(0.037,)     | 0.281<br>(0.033,)                    | 0.152<br>(0.036,)  |  |
| Unobs. Heterogeneity<br>Control Variables<br>Log-Likelihood | Yes<br>Yes<br>-41,002.15   |                       |                                      |                    | Yes<br>Yes<br>-57,053.38   |                       |                                      |                    |  |

Standard errors are reported in parentheses. Model contains control variables and unobserved heterogeneity with seven mass points. In total, 129 parameters were estimated.

- High-Routine job content and risk of offshorability increase unemployment duration.
- ALMP in general is increasing the hazard out of unemployment and – in three of four cases – it can also reduce unemployment duration more for workers with routinisation or offshorability handicaps.
- Results on new job stability and wages a bit mixed.