## Employing the unemployed of Marienthal: Evaluation of a guaranteed job program

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IWER Seminar MIT Sloan, February 28, 2023 My research agenda: labor market policy and employment relations

## 1. Employment

- Evaluation of a guaranteed job program
- Reframing active labor market policy
- Work sharing / short-time work during Covid-19

### 2. Wages

- Labor market segmentation and wage growth
- Labor union membership and firm performance
- Oxford Supertracker: supertracker.spi.ox.ac.uk

My research agenda: labor market policy and employment relations

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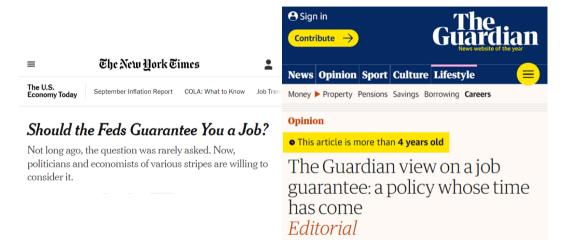
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#### Motivation

## Werner V., aged 60:

"After more than 600 job applications over three years, my wish for employment proved hopeless. Too old, too expensive, over-qualified, without long term prospects due to my age, with multiple university degrees seemingly over-qualified for service jobs..."

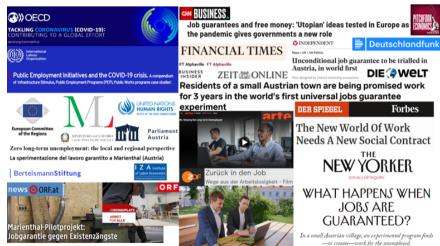
## Resurgent interest on both sides of the Atlantic



The Marienthal job guarantee pilot

- October 2020 April 2024 in Gramatneusiedl (Marienthal).
- Operated by AMS Niederösterreich (public employment service) and it.works (service provider).
- Budget: 7.4 Million Euro, which amounts to 29,841 Euro per participant/year.
- All longtime unemployed (>12 months) are eligible.

## The Marienthal job guarantee pilot Strong public interest



This paper: Evaluation of a guaranteed job program

#### Our contribution

- We evaluate a pilot job guarantee scheme in a natural field experiment.
- We document anticipation effects using a second control group.
- We observe spillover effects using a pre-registered synthetic control.

## Preview of findings:

- 1. Positive effects on economic and social wellbeing. -
- 2. No effect on physical health and economic preferences. →
- 3. Anticipation effects for subjective wellbeing.
- 4. Effects are largely persist over time. -
- 5. Large reduction of municipality-level unemployment.

This paper: Evaluation of a guaranteed job program

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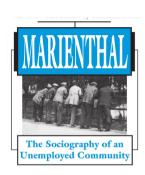
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#### What do we know?

- 1. Public employment programs are not effective for future employment prospects (Heckman et al., 1999; Kluve, 2010; Crépon & van den Berg, 2016; Card et al., 2010, 2018).
  - Literature mostly considers (market) employment and earnings.
  - By contrast, we are interested in participant welfare.
- 2. Correlation between employment and wellbeing is widely documented
  - Health (Avendano & Berkman, 2014).
  - Wellbeing (Clark & Oswald, 1994; Korpi, 1997; Young, 2012; Haushofer & Fehr, 2014).
  - Positive link extends to public employment programs. (Andersen, 2008; Breidahl & Clement, 2010; Fervers, 2018; Wang et al., 2021).
  - The **causal link** with employment remains contested.
- 3. Little evidence on impact of **job guarantee programs**, esp. for rich countries.



## Latent and manifest benefits of employment



Marie Jahoda, Paul F. Lazarsfeld, and Hans Zeisel Jahoda, Lazarsfeld & Zeisel (1933); Jahoda (1982): Employment, with appropriate pay and working conditions, can have numerous benefits, economic and non-economic

- 1. Collective purpose: Work as a source of meaning.
- 2. Social inclusion: Social interaction at work.
- 3. **Status:** Respect instead of social stigma.
- 4. Activity: Energy and involvement in life.
- 5. **Time structure:** Balance between work and spare time.
- 6. Financial strain: Income that allows for participation.

## Possible advantages and disadvantages of guaranteed employment

## Unconditional outside options.

 Improving the bargaining position of those worst off, in employment, towards bureaucracies, and (romantic) relationships.

## Non-economic benefits of employment:

- Work as a source of meaning.
- Social interactions in the workplace and beyond.
- Social respect.

## Possible disadvantages:

- Spillovers, crowding out of market employment.
- Forced work if participation is not voluntary.
- Meaningless activities.

#### Motivation

## The Marienthal job guarantee pilot

Study design

## Analysis

Experimental comparison

Comparison to individuals in control towns

Synthetic control municipalities

#### Conclusion

# The Marienthal job guarantee pilot Key characteristics

- Voluntary participation.
   No sanctions for declining a job offer.
- 2. Collectively bargained wage (1.500 € / month for full-time).
- Meaningful employment taking into account personal constraints.



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- 3. **Meaningful employment** taking into account personal constraints.



# The Marienthal job guarantee pilot Training, job-search and support are integral features



# The Marienthal job guarantee pilot Jobs created

Jobs are individually tailored. Options include:

- Jobs in a newly founded social enterprise (carpentry, renovation, gardening, support for elderly, ...).
- Some of these: Projects created by participants themselves (incl. planning a bike trail, book, topotheque).
- Subsidized jobs in the regular labor market.





# The Marienthal job guarantee pilot Voucher to buy job guarantee services



#### Motivation

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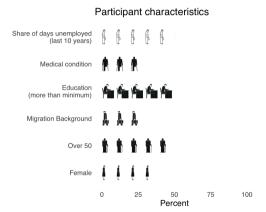
#### Conclusion

Data

#### We observe the

- employment history of every individual from social security data,
- benefit level and training participation from the AMS admin register,
- and link these to the annual survey responses.

# Study design Who are the "long-term unemployed"?



The graph draws on the "Isotype" system developed by Otto Neurath.

# Study design Three evaluation challenges and possible solutions

### 1. Small sample size:

Pairwise randomization.

Matching on a rich set of baseline characteristics.

### 2. Anticipation effects:

Staggered rollout.

Contrasting earlier to later participants, and to control town individuals.

## 3. Equilibrium effects:

Cross-location comparisons.

Pre-registered synthetic control municipalities.

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## Study design

## Three identification approaches:

1. Experimental control group based on pairwise matching and staggered roll-out Details

- 2. Comparison to non-experimental control group Details
- 3. Synthetic control comparison Details

## Causal interpretation of various contrasts

- 1. Direct treatment effects.
- 2. Anticipation effects.
- 3. Spillover effects.

$$Y_i = g(D_i, D_i^{+1}, \overline{D}, \epsilon_i).$$

- Y<sub>i</sub>: Outcome for individual i.
- $D_i$ : Current eligibility for the job guarantee.
  - $D_i^{+1}$ : Future eligibility.
  - D: Share of long-term unemployed in the municipality currently eligible.
- $\epsilon_i$ : Unobserved individual characteristics.
- $L_i$ : Indicator for unemployment > 9 months as of September 2020

Contrast	Identified effect	Interpretation
	February 2021	
Group 1 vs. Group 2	$E[g(1,1,\frac{1}{2},\epsilon_i)-g(0,1,\frac{1}{2},\epsilon_i) L_i=1]$	Average direct effect on the treated
Group 2 vs. control town	$E[g(0,1,\frac{1}{2},\epsilon_i)-g(0,0,0,\epsilon_i) L_i=1]$	Average anticipation effect on the treated
	After April 2021	
Group 1 & 2 vs. control town	$E[g(1,1,1,\epsilon_i)-g(0,0,0,\epsilon_i) L_i=1]$	Average total effect on the treated
Gramatneusiedl vs. synth (short-term unemp)	$E[g(0,0,1,\epsilon_i)-g(0,0,0,\epsilon_i) L_i=0]$	Average spillover effect on the untreated
Gramatneusiedl vs. synth (total unemp)	$E[g(L_i,L_i,1,\epsilon_i)-g(0,0,0,\epsilon_i)]$	Average total effect

## Set up

- The design is pre-registered in the AEA RCT repository,
- and has received IRB approval.
- The code is public within a reproducible environment (*Docker container*).

Disclaimer: We receive no payment for the evaluation, and will publish our findings independently from the implementation partners.

Motivation

The Marienthal job guarantee pilot

Study design

## **Analysis**

Experimental comparison

Comparison to individuals in control towns Synthetic control municipalities

Conclusion

## Findings overview

- 1. Positive effects on economic and social wellbeing. A Disaggregated social outcomes
- No effect on physical health and economic preferences. → (time, risk, reciprocity, altruism, trust)
- 3. Anticipation effects for (subjective) wellbeing, social status, social inclusion. 

  Anticipation effects
- 4. Effects are largely persist over time. ✓ ▶ Economic wellbeing ▶ Social wellbeing
- 5. Large reduction of municipality-level unemployment. > Unemployment Spillovers

► Case studies ► Participant voices

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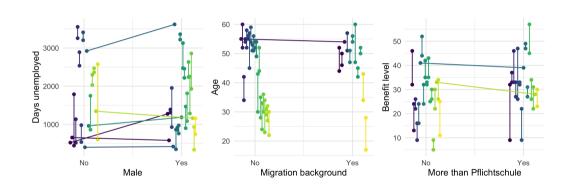
Conclusion

Study design: experimental control group Pairwise matching and staggered roll-out

## Pairwise matching and staggered roll-out:

- Baseline covariates from admin sources (as of September 2020): Gender, age, migration background, education, disability, level of benefits, days unemployed in the last 10 years.
  - ⇒ Pairwise Mahalanobis distance.
- 2. Pairwise matching minimizing sum of distances within pairs.
- 3. Random assignment to one of two waves within pairs.
- 4. Start of employment for the two waves:
  - 1.: December 2020.
  - 2.: April 2021.

# Study design: experimental control group Matched pairs

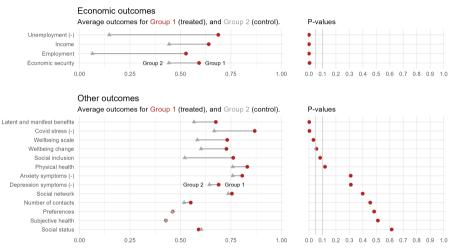


#### Measurement

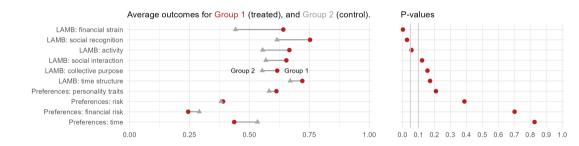
- We conducted annual in-depth surveys among all participants (wave 1 and 2), and unemployed in control towns, and link them to social security records.
- Index construction:
  - Sign each variable so that higher is better.
  - Average all variables in each category.
  - Normalize index to range from 0 to 1.
- We control for the false discovery rate of multiple hypothesis using the Benjamini-Hochberg procedure.

► Multiple hypothesis testing

#### Experimental estimates with linear controls Normalized index with each variable signed so that a higher value is better



# Experimental estimates with linear controls Disaggregated social outcomes



## Participant views

### Werner V., aged 60:

"After more than 600 job applications over three years, my wish for employment proved hopeless. Too old, too expensive, over-qualified, without long term prospects due to my age, with multiple university degrees seemingly over-qualified for service jobs... many obstacles seemed to exist. The job guarantee proved extremely valuable and useful for me. In cooperation with the municipality and the local museum, I am archiving and documenting the cultural, scientific and economic value of the historical site of Marienthal."

Case study: animal therapy



Two participants are employed with an association providing animal-assisted therapy for children with various conditions (e.g. autism, ADHD, disabilities, learning difficulties). By looking after the association's animals, house, and garden, they have enabled the centre to improve its services and care for more young people.

Motivation

The Marienthal job guarantee pilot

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### **Analysis**

Experimental comparisor

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Comparison to individuals in control towns

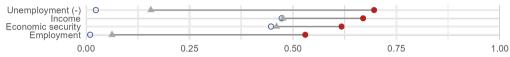
# Individual-level comparison to control municipalities.

- Individuals in the three control municipalities with the largest weight: Ebreichsdorf, Zeillern, Rußbach.
- Selected based on eligibility criterion of MAGMA:
   9 months of unemployment as of September 2020.
- Comparisons adjust for baseline covariates.

Control town comparisons with linear controls, economic outcomes Normalized index with each variable signed so that a higher value is better

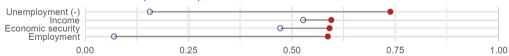
#### Outcomes for 2021

Group 1 (treated), Group 2 (control), and Control towns.



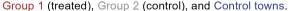
#### Outcomes for 2022

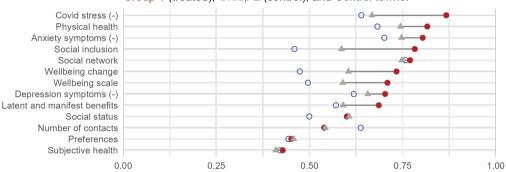
Marienthal (all treated), and Control towns.



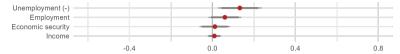
Control town comparisons with linear controls, other outcomes Normalized index with each variable signed so that a higher value is better

#### Outcomes for 2021





# Anticipation Confidence intervals for contrast of Group 2 and control town individuals, February 2021 Economic outcomes



#### Other outcomes Wellbeing change Social inclusion Social status Wellbeing scale Physical health Anxiety symptoms (-) Depression symptoms (-) Covid stress (-) Latent and manifest benefits Preferences Subjective health Social network Number of contacts -0.4 0.0 0.4 8.0

Participant views - anticipation

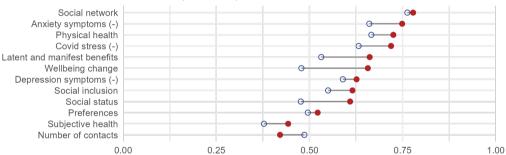
### Johann G., aged 65:

"I live in Gramatneusiedl and worked for 38 years at a company in chemical industry that was located in Gramatneusiedl and closed down some years ago. I am now taking part in the job guarantee since 2020, which makes me feel comfortable. Under the scheme, I have worked in renovation and have been able to apply my skills in many ways. With the help of the job guarantee, I can start as a warehouse worker in a recycling company in October 2022."

Control town comparisons with linear controls, other outcomes Normalized index with each variable signed so that a higher value is better

#### Outcomes for 2022





# Findings so far

- 1. Positive effects on economic and social wellbeing. <
- 2. No effect on physical health and economic preferences. → (time, risk, reciprocity, altruism, trust)
- 3. Anticipation effects for (subjective) wellbeing, social status, social inclusion.
- 4. Effects are largely persist over time. <

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# Study design: synth control Synthetic control comparison

- 1. Multiple municipal-level data sources (as of December 2019): AMS Data Warehouse, AMS occupational-career monitoring, and the national statistical agency.
- 2. Pick the 26 (5%) of municipalities in Lower Austria closest to Gramatneusiedl in terms of Mahalanobis distance.
- 3. Find the synthetic control (convex combination) of these municipalities closest to Gramatneusiedl in terms of baseline covariates and in terms of the trajectory of unemployment 2011-2020.

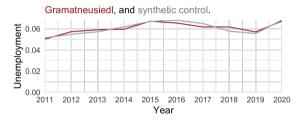
Both pairwise randomization and synthetic control were pre-registered!

# Study design: synth control Variables used for the construction of the synthetic control

Variable	Definition
Working age pop	Working age population.
Long term unemp/pop	Number of long-term unemployed ( $>1$ year) as a share of working age pop.
Inactive/pop	Number of inactive persons in working age as a share of working age pop.
Mean age	Mean age in years of the total population.
Share small firms	Small firms (less than 10 employees) as a share of total firms.
Share mid firms	Medium sized firms (10-249 employees) as a share of total firms.
Share low edu	Persons with low education (ISCED 1-2) as a share of total pop.
Share mid edu	Persons with medium education (ISCED 3-4) as a share of total pop.
Share men	Male persons as a share of total pop.
Share migrant	Persons with a migrant background as a share of total pop.
Share care resp	Active persons with care responsibilities as a share of total pop.
Mean wage	Mean wage level.
Mean age unemp	Mean age in years of the unemployed.
Low edu/unemp	Unemployed with low education (ISCED 1-2) as a share of total unemployed.
Mid edu/unemp	Unemployed with medium education (ISCED 3-4) as a share of total unemployed.
Poor German/unemp	Unemployed with low German skills ( $<$ A2 CEFR) as a share of total unemployed.
Men/unemp	Male unemployed as a share of total unemployed.
Migrant/unemp	Unemployed with a migrant background as a share of total unemployed.
Health cond/unemp	Unemployed with a medical condition limiting employment opportunities as a share of total unemployed.
Communal tax/pop	Communal tax per working age pop.

# Study design: synth control Synthetic control gap

Weight	Municipality
0.487	Ebreichsdorf
0.203	Zeillern
0.134	Rußbach
0.079	Leopoldsdorf im Marchfelde
0.046	Strasshof an der Nordbahn
0.024	Sieghartskirchen
0.023	Sollenau



► Synthetic Control Construction

Return

# Study design: synth control Location of Gramatneusiedl (Marienthal) and control municipalities



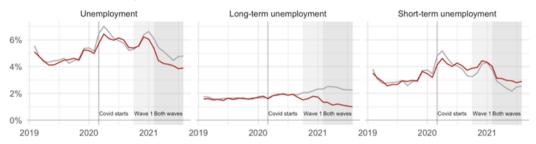
Red: Treated.

Orange: Control with larger weight. Blue: Control with smaller weight.

# Municipality comparison

#### Outcome levels

Gramatneusiedl, and synthetic control.

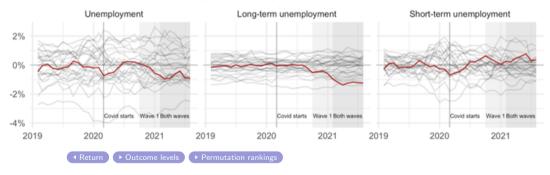


- Outcomes are measured at zip code level. Eligibility is at municipality level (a subset).
- That is why long-term unemployment is not reduced to 0, even though all long-term unemployed are eligible, and (almost) all accept.

### Findings municipal level Synthetic control - treatment effects

#### Treatment effects

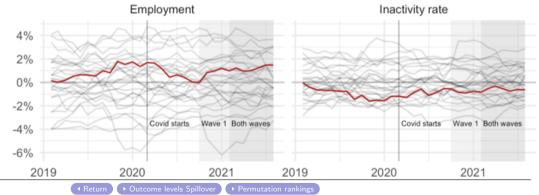
Gramatneusiedl minus control, and permuted comparisons.



#### Findings municipal level - spillovers Synthetic control - treatment effects

## Treatment effects

Gramatneusiedl minus control, and permuted comparisons.



 Lukas Lehner
 February 28, 2023
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Case study: public vegetable garden



The local mayor provided  $250\,m^2$  of land which participants cultivate as a sustainable food garden. Herbs and vegetables can be picked free of charge and the garden is open year-round. The first harvest was in summer 2022.

#### Motivation

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# Summary and conclusion I Study design

- 1. Matched random assignment to increase precision.
- 2. Staggered roll-out to separate out anticipation effects.
- Synthetic controls to estimate spillovers / equilibrium effects.
- 4. Control-town individuals to estimate long-term effects.
- Pre-registered design to tie our hands.
- Randomization inference for finite sample validity.

# Summary and conclusion II Findings

- 1. Positive effects on economic and social wellbeing.
  - Income, income security, employment.
  - Time structure, activity, social contacts, collective purpose, social status.
- No effect on physical health and economic preferences. (time, risk, reciprocity, altruism, trust) →
- 3. Similar effects when comparing to individuals in control towns. Some anticipation effects. ✓
- 4. Effects persist over time. <
- 5. Large reduction of municipality-level unemployment.
  - Near-elimination of long-term unemployment.
  - Small increase of short-term unemployment.

# Empirical social research across a century

Die Arbeitslosen vom Marienthal	Employing the unemployed of Marienthal
Classification	Causality
No control group	Several contrasts for causal inference
Historical macro event	Micro policy intervention
Capture heterogeneity	Balance out heterogeneity
Estimate = estimand	$Sample \neq population$
No uncertainty quantification	Standard errors, confidence intervals
Methodologically open-ended	Fully pre-registered

#### A historical arc:

- Jahoda elaborated the non-monetary benefits of employment.
- We find the most significant effects on LAMB, building on her work.



## Outlook

While the job guarantee debate (re-)started in the US, it is gaining traction in Europe.

#### **Evaluation**

- Currently analyzing data up to end of 2022.
- Third survey round underway with module on labor relations and job quality.

#### Recent events

- Recent calls for larger roll out in Austria.
- European Union CoR SEDEC adopted call for 750 million Euros in European funds to be earmarked for local job guarantee initiatives.
- Related initiatives in France, Belgium and the Netherlands are underway.
- Further interest from six countries in implementing job guarantee programs.

Lukas Lehner February 28, 2023 47 / 47

# Thank you!

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# **Appendix**

#### Related literature

- Experimental ALMP evaluations are rare in German-speaking countries, recent exceptions: (Altmann et al., 2018; van den Berg et al., 2021; Böheim et al., 2022), but more common in US (Card & Hyslop, 2005; Schochet et al., 2008; Gelber et al., 2016), and France (Crépon et al., 2013; Behaghel et al., 2014).
- Spillovers in experiments deserve more attention (Crépon et al., 2013; Lalive et al., 2015).
- Public employment schemes have recently been evaluated in experimental studies in developing countries, including India (Khera, 2011; Muralidharan et al., 2017; Banerjee et al., 2020), Ivory Coast (Bertrand et al., 2017), and Malawi (Beegle et al., 2017).

Return

### Job guarantee examples

- Some projects in that direction have been taking place already:
  - United States: Works Progress Administration 1935-1943
  - India: National Rural Employment Guarantee Scheme since 2005
  - France: Territoires Zéro Chômeur de Longue Durée since 2017
- Little evidence on the impact of such programs, in particular for rich countries.

### Expectations of a job guarantee

- Unconditional outside options
   Improving the bargaining position of those worst off,
   in employment, bureaucracies, and (romantic) relationships.
- Covering uncovered populations
   Dropping conditionalities and means-testing, diminishing problems of benefit non-take-up.
- Automatic stabilizers
   Smoothing business cycles and individual consumption by stabilizing disposable income.

Return

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- Covering uncovered populations
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### Expectations of a job guarantee

### Unconditional outside options

Improving the bargaining position of those worst off, in employment, bureaucracies, and (romantic) relationships.

### Covering uncovered populations

Dropping conditionalities and means-testing, diminishing problems of benefit non-take-up.

#### Automatic stabilizers

Smoothing business cycles and individual consumption by stabilizing disposable income.



# The Marienthal job guarantee pilot Jobs created

#### non-market sector

- 13 Carpenters
- 7 Tailors
- 6 Gardeners
- 5 Renovation workers
- 3 Registrars
- 3 Cleaners
- 1 Driver, counselor

#### market sector

- 6 Office clerks
- 2 Warehouse workers
- 2 Assistant electricians
- 1 Care home assistant, technical sales assistant, facility manager, construction worker, salesperson, construction forman, taxi driver, hospitality assistant, carpenter, marketing, municipal building yard worker assistant, farm worker, nursery worker, call centre agent, lift technician, assistant cook, forklift driver, accounting clerk, HR consultant

Return

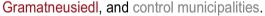
# Study design: experimental control group Covariate balance for our matched pair design

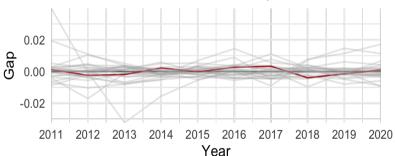
Covariate	Mean wave 1	Mean wave 2	Difference	T-statistic	P-value
Male	0.581	0.581	0.000	0.000	1.000
Age	44.452	44.935	-0.484	-0.165	0.869
Migration Background	0.323	0.355	-0.032	-0.264	0.793
Education	0.452	0.452	0.000	0.000	1.000
Health condition	0.290	0.323	-0.032	-0.271	0.787
Benefit level	29.839	29.839	0.000	0.000	1.000
Days unemployed	1721.871	1600.839	121.032	0.483	0.631

Return

Study design: synth control Synthetic control weights

Weight	Municipality	Identifier
0.487	Ebreichsdorf	30607
0.203	Zeillern	30544
0.134	Rußbach	31224
0.079	Leopoldsdorf im Marchfelde	30831
0.046	Strasshof an der Nordbahn	30856
0.024	Sieghartskirchen	32131
0.023	Sollenau	32327





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# Covariate balance for the individuals in our control town sample

Covariate	${\sf Gramatneusiedl}$	Control towns	Difference	T-statistic	P-value
Male	0.581	0.535	-0.045	0.523	0.602
Age	44.694	49.634	4.940	-2.496	0.014
Migration Background	0.339	0.310	-0.029	0.352	0.726
Education	0.452	0.535	0.084	-0.958	0.340
Medical condition	0.306	0.338	0.032	-0.386	0.700
Benefit level	29.839	34.535	4.697	-2.600	0.011
Days unemployed	1661.355	1638.521	-22.834	0.136	0.892



### Identifying averages

```
Group 1, Feb 21 E[g(1,1,\frac{1}{2},\epsilon_i)|L_i=1] Group 2, Feb 21 E[g(0,1,\frac{1}{2},\epsilon_i)|L_i=1] Both groups, after April 21 E[g(1,1,1,\epsilon_i)|L_i=1] Control town individuals E[g(0,0,0,\epsilon_i)|L_i=1] Short-term unemp, GN, after April 21 E[g(0,0,0,\epsilon_i)|L_i=0] Short-term unemp, synthetic control E[g(0,0,0,\epsilon_i)|L_i=0] Total unemp, GN, after April 21 E[g(0,0,0,\epsilon_i)|L_i=0] Total unemp, synthetic control E[g(0,0,0,\epsilon_i)]
```

◆ Return

### Randomization / permutation inference

- Consider the null hypothesis that  $Y_i^1 = Y_i^0$  for all i in the sample.
- ⇒ We can calculate test-statistics for any counterfactual treatment assignment.
- Randomization inference: Randomly reassign treatment.
   Re-calculate test-statistics.
- Fisher p-value: Share of times the re-calculated test-statistic is bigger than the actually realized one.
- Permutation inference: Similar idea for synthetic control.
   For each of our control municipalities, pretend it is the treated one.
   Re-calculate synthetic control estimates for this municipality.

Return

## Multiple testing corrections

- Multiple outcomes of interest.
- Benjamini-Hochberg procedure to control the false discovery rate (share of rejected hypotheses which in fact hold true).
- Sort the p-values, for each of m hypotheses resulting in ordered values  $P_{(j)}$ .
- For a critical value  $\alpha$ , find the largest value k such that

$$P_{(k)} \leq \frac{k}{m}\alpha.$$

• Reject the null hypothesis for all i = 1, ..., k.

### Considerations on possible observer effects

To account for the Hawthorne effect (Levitt and List, 2011), we

- compare the experimental control group to a second control group.
- compare preferences with wellbeing outcomes.
- collect data at multiple points in time independently of program provider and assure anonymity.

To limit social desirability bias in survey responses, we

- combine administrative data with surveys,
- apply a range of direct and indirect measures,
- rely on a questionnaire without a human interviewer.

### Surveys

- Surveys are conducted annually to capture effects over time.
- The questionnaire is available in 15 languages to ensure representativeness.
- Participants can respond online via Qualtrics or on paper. The questionnaire is optimised for PC, smartphone and tablet.
- We contact individuals at their workplace, via email, telephone, or post.
- We rely mainly on validated survey questions.

## Survey: Latent and Manifest Benefits (components)

Please select whether you agree or disagree with the following statements.

	Agree strongly	Agree	Agree somewhat	Neither agree, nor disagree	Disagree somewhat	Disagree	Disagree strongly
There is usually not enough spare time in my day.	0	0	0	0	0	0	0
I often have nothing to do.	0	0	0	0	0	0	0
I usually have a lot of opportunities to mix with people.	0	0	0	0	0	0	0
I seldom meet new people.	0	0	0	0	0	0	0
	Agree strongly	Agree	Agree somewhat	Neither agree, nor disagree	Disagree somewhat	Disagree	Disagree strongly
I rarely feel that I make a meaningful contribution to society.	0	0	0	0	0	0	0
I often feel a valuable part of society.	0	0	0	0	0	0	0
My days are usually well organized.	0	0	0	0	0	0	0
I rarely catch up with the things I need to do.	0	0	0	0	0	0	0

# Survey: Subjective social status (component)

Think of this Ladder representing where people stand



Best off: most money, most education, most respected jobs

Imagine a ladder showing where people stand in the society. At the top are the people who are the best off — those who have the most money, the most education, and the most respected jobs. At the bottom are the people who are the worst off — those who have the least money, the least education, and the least respected jobs or no job. Where would you place yourself on this ladder?

- O 10. Top of the ladder
- O 9.
- O 8.
- O 7.
- O 6.
- O 5.
- O 4
- O 3
- O 2.
- 1. Bottom of the ladder

Worst off: least money, least education, least respected jobs or no job

### Survey: Social Network (component)

#### Social Network

From time to time, most people discuss work-related and job-search issues with other people. Looking back over the last 6 months, who are the people with whom you discussed work-related and job-search issues with?

In the boxes below, please list the FIRST NAME and LAST NAME INITIAL of the people with whom you discuss important matters. E.g., Maria Maier would be recorded as "Maria M".

Please list only one name per box. If two people on your list share the same first name and last initial, use numbers to distinguish them (e.g., "Maria M" and "Maria M2").

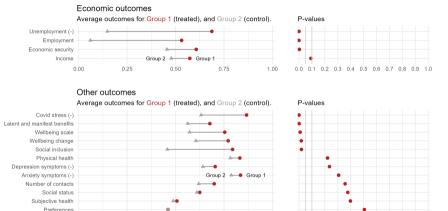
If you don't discuss important matters with anyone, just leave the fields blank.

Person 1	
Person 2	
Person 3	
Person 4	



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# Findings individual level Experimental estimates with pair controls



Social network 0.00

0.25

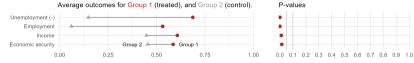
1.00

0.0 0.1 0.2 0.3 0.4 0.5 0.6 0.7

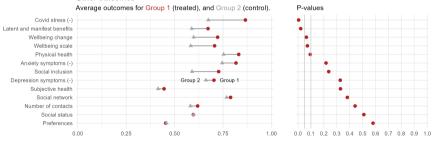
0.50

# Findings individual level Experimental estimates with no controls

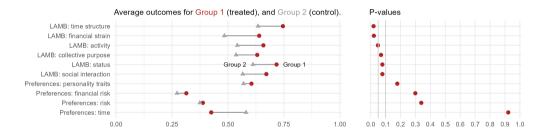
#### Economic outcomes



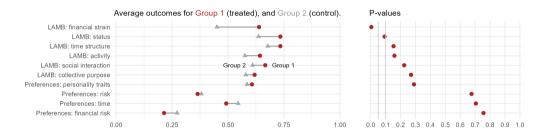
#### Other outcomes



# Findings individual level Experimental estimates with pair controls, disaggregated

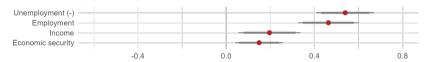


# Findings individual level Experimental estimates with no controls, disaggregated

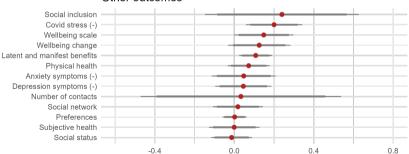


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# Findings - Confidence intervals for experimental comparison in February 2021 linear controls



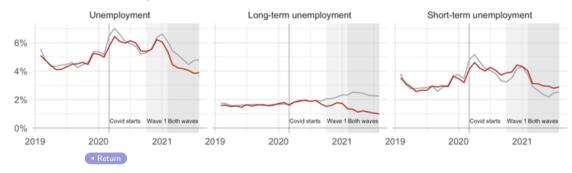
### Other outcomes



### Findings municipal level Synthetic control - outcome levels

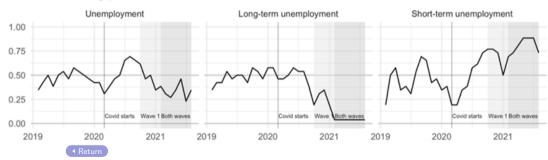
### Outcome levels

Gramatneusiedl, and synthetic control.



### Findings municipal level Synthetic control - permutation ranking

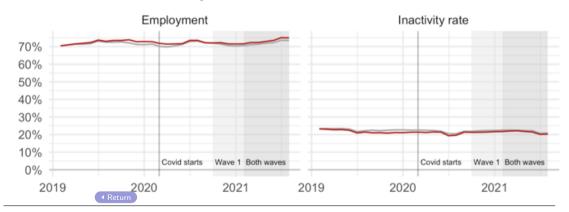
### Rank among permutations



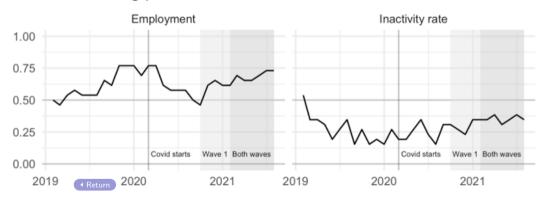
### Findings municipal level Synthetic control - spillovers: employment and inactivity

### Outcome levels

Gramatneusiedl, and synthetic control.



# Rank among permutations



### Participant views

### Werner V., aged 60:

"After more than 600 job applications over three years, my wish for employment proved hopeless. Too old, too expensive, over-qualified, without long term prospects due to my age, with multiple university degrees seemingly over-qualified for service jobs. . . many obstacles seemed to exist. The job guarantee proved extremely valuable and useful for me. In cooperation with the municipality and the local museum, I am archiving and documenting the cultural, scientific and economic value of the historical site of Marienthal."

### Mohamad A., aged 44:

"I am from Syria and live here in the village with my family - my wife and my 4 children, some of whom are already at school. I recently had a job offer, the company wanted to hire me full time but due to the current Corona situation they changed their minds and offered only a marginal employment contract. By contrast, the job guarantee scheme provides an opportunity to work [full-time], which suits me because we can work every day and learn something new. I'd also like to use the time to improve my German language skills so that I can later catch up on my general qualification for university entrance and perhaps study at a university of applied sciences. I'm grateful for the help the job guarantee offers; it is important for me."

#### Johann G., aged 65:

"I live in Gramatneusiedl and worked for 38 years at a company in chemical industry that was located in Gramatneusiedl and closed down some years ago. I am now taking part in the job guarantee since 2020, which makes me feel comfortable. Under the scheme, I have worked in renovation and have been able to apply my skills in many ways. With the help of the job guarantee, I can start as a warehouse worker in a recycling company in October 2022."

### Case studies (summary)

### Public vegetable garden:

The local mayor provided  $250m^2$  of land which participants cultivate as a sustainable food garden. Herbs and vegetables can be picked free of charge and the garden is open year-round. The first harvest was in summer 2022.

### **Animal therapy:**

Two participants are employed with an association providing animal-assisted therapy for children with various conditions (e.g. autism, ADHD, disabilities, learning difficulties). By looking after the association's animals, house, and garden, they have enabled the centre to improve its services and care for more young people.

### **Funeral urns:**

During participant Michaela P.'s (paid) internship doing office work at a funeral parlour, her employer noticed her talent for painting. Her internship turned into permanent employment in spring 2022 and, in addition to office work, she now paints urns — a new business venture for the parlour. Before Michaela became unemployed, she worked in a canteen and never thought she would be able to include her hobby in her job.