### The Geopolitics of Repressions

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#### Outline

- Motivation
- 2 Literature Review
- Theoretical Expectations
- 4 Historical Background
- Data
- 6 Methodology
- Results
- 8 Conclusion

#### Motivation

#### Soviet Union, 1920s - inclusion of minorities

- Individuals from ethnic minorities promoted to leadership positions
- The languages and culture of minorities supported (Martin, 2001)

#### Motivation

#### Soviet Union, 1930s - repression

- Mass arrests and deportations targeted at ethnic minorities
- Over 240,000 people executed just in the NKVD's National Campaigns of 1937-1938 alone (Martin, 1998, p. 855)

#### **Motivation**

- What caused this sharp reversal in Soviet policy towards its minorities?
- Why states sometimes choose to accommodate or assimilate its ethnic minorities but repress them in other cases?

#### Literature Review

- Role of institutions (Davenport, 2007) and economic shocks (Blaydes, 2018)
- Cultural distance, legibility of an ethnic group (Blaydes, 2018)
- States with many ethnic groups more likely to repress demands for autonomy due to precedent setting (Evera, 1994; Toft, 2005; Walter, 2009)

## Theoretical Expectations

- Mylonas (2013) and Butt (2017) highlight importance of geopolitical factors
- If a minority has ethnic ties to an external power which is
  - an ally to the host state, repression is less likely since that could jeopardize the alliance
  - an enemy, repression is more likely because the minority is viewed as a potential 'fifth column'

### Historical Background

 We test these hypotheses on the case of German minority in the USSR

#### Main phases in Soviet-German relations

- Neutrality (1921-1933)
- Hostilities (1933-1939)
- Non-aggression pact (1939-1941)
- War (1941-1945)
- Post-war period (after 1945)

- Data on Soviet repressions come from database of Russian NGO Memorial
- More than 2 million records of individual arrests by the Soviet secret police mostly from archival sources
- 38 ethnic groups, years from 1921 to 1960
- Large fraction of observations with missing ethnicity and date of arrest
  - Imputation of ethnicity based on names using Naive Bayes classifier more
  - Imputation of date of arrest based on date of trial

#### Difference-in-differences

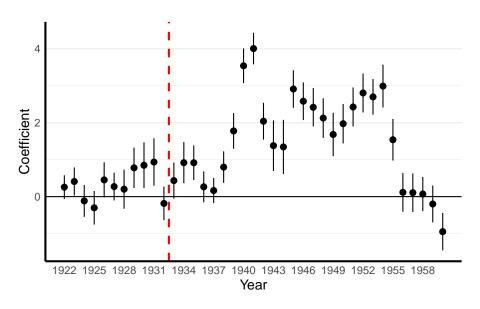
- Dynamic difference-in-differences model with ethnicity and year fixed effects
- Identifying assumption parallel trends
  - $\beta_k$  for k < 1933 can help assess its plausibility

$$\log(1+y_{it}) = \sum_{k=1022}^{1960} \beta_k \operatorname{German}_i \cdot \operatorname{Year}_t^k + \lambda_t + a_i + \operatorname{Relations}_{it} + u_{it}$$

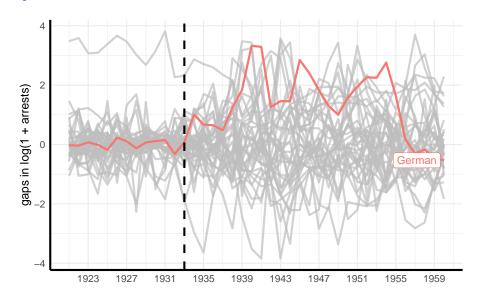
# Synthetic Control Method

- Synthetic version of the treated unit is constructed as linear combination the control units based on matching of pre-treatment outcomes and other covariates
- The treatment effect is estimated as a difference between the actual values and the synthetic control
- Significance is assessed with placebo tests (applying the same procedure to control units)

#### Difference-in-differences



# Synthetic Control Method



#### Difference-in-differences - Robustness Checks

- Only ethnic groups without independent state
- Only rehabilitated individuals 
   —here
- Only arrests from 250 km border frontier
- Only arrests outside 250 km border frontier
- Ethnicity-specific time trends here
- Different ethnicity imputation adjustments (none, parsimonious, full matrix)
- Stata standard errors here
- Different base years
  - The whole pre-treatment period (1921-1932) omitted Pere
  - Years 1921-1926 omitted here

## Synthetic Control - Robustness Checks

- Mean of the outcome used as a predictor (instead of all pre-treatment outcomes)
- Only ethnic groups without independent state here
- Only rehabilitated individuals
- Only arrests from 250 km border frontier
- Only arrests outside 250 km border frontier

#### Conclusion

- Large and significant increase in repressions with war
- Strong persistence of the effect of war (nearly 10 years)
  - Difficult to explain only by geopolitical concerns of the state
  - Consistent with desire for collective punishment of Germans for war

Thank you for your attention.

#### References I

- Blaydes, Lisa (2018) State of Repression: Iraq under Saddam Hussein, Princeton: Princeton University Press.
- Butt, Ahsan I. (2017) Secession and Security: Explaining State
  Strategy against Separatists, 1 edition, Ithaca: Cornell University
  Press.
- Davenport, Christian (2007) State Repression and the Domestic Democratic Peace, New York: Cambridge University Press.
- Evera, Stephen Van (1994) 'Hypotheses on Nationalism and War', *International Security* 18 (4), pp. 5–39.
- Martin, Terry (1998) 'The Origins of Soviet Ethnic Cleansing', *The Journal of Modern History* 70 (4), pp. 813–861, DOI: 10.1086/235168.

#### References II

- Martin, Terry (2001) The Affirmative Action Empire: Nations and Nationalism in the Soviet Union, 1923-1939, Ithaca: Cornell University Press.
- Mylonas, Harris (2013) The Politics of Nation-Building: Making Co-Nationals, Refugees, and Minorities, Cambridge: Cambridge University Press.
- Toft, Monica Duffy (2005) *The Geography of Ethnic Violence: Identity, Interests, and the Indivisibility of Territory,* Princeton: Princeton University Press.
- Walter, Barbara F. (2009) Reputation and Civil War: Why Separatist Conflicts Are So Violent, 1 edition, Cambridge: Cambridge University Press.

### Additional Analyses

- Map of German population in the USSR
- No imputation of date of arrest DiD DID
- Considering only western border areas
  - Only arrests from western border areas DDD DSCM
  - Arrests from western border areas excluded DID DID

### Replication

The R scripts and the LaTeX source codes of the thesis manuscript are available at:

#### https:

//github.com/martin-kosiik/Geopolitics-of-Repressions

The Beamer source code for this presentation itself are available at:

https://github.com/martin-kosiik/ presentation-geopolitics-of-repressions

# **Ethnicity Imputation**

- Let  $\mathbf{x} = (x_1, x_2, x_3)$  be person's first, last, and patronymic names
- Assuming conditional independence, we can express probability that a person has ethnicity  $E_k$  given his names as:

$$p(E_k \mid \mathbf{x}) = \frac{p(E_k) \ p(\mathbf{x} \mid E_k)}{p(\mathbf{x})}$$

 Naive Bayes classifier chooses ethnicity with the highest posterior probability as its prediction



### **Ethnicity Imputation Adjustments**

- The accuracy of model's predictions differs substantially by ethnicity
- To address this, we apply adjustments to the predictions
  - Parsimonious:

$$P_{it} = \alpha_i R_{it} + (N_t - R_{it}) \cdot (1 - \beta_i)$$

• Full (confusion) matrix:

$$P_{it} = \sum_{j=1}^{K} b_{ij} R_{jt} \qquad i = 1, \dots, K$$



### Imputing Missing Date of Arrest

- Date of arrest is missing for 1 650 912 observations
  - For 903 49 of them, date of trial is available we use it for imputation
- We model number of days between date of arrest and trial (y) in two-stages:
  - Logit to predict whether y = 0 (arrest and trial happening on the same day)
  - ② Log-linear regression on the subset of the data for which y>0

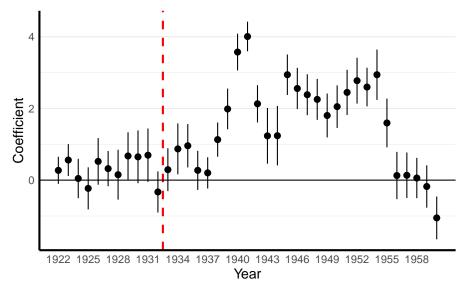


# Synthetic Control Method - Theory

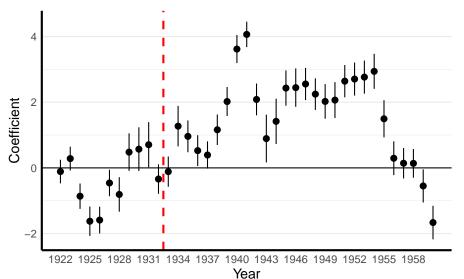
- We choose a vector of weights  $W = (w_2, \ldots, w_J, w_{J+1})$  subject to  $w_j \geq 0$  for  $j = 2, \ldots, J, J+1$  and  $w_2 + \cdots + w_J + w_{J+1} = 1$  that minimize  $\|X_1 X_0 W\|_V = \sqrt{(X_1 X_0 W)^T V(X_1 X_0 W)}$
- We model number of days between date of arrest and trial (y) in two-stages:
  - Logit to predict whether y = 0 (arrest and trial happening on the same day)
  - 2 Log-linear regression on the subset of the data for which y > 0



# DiD - Only Ethnicities without Independent State

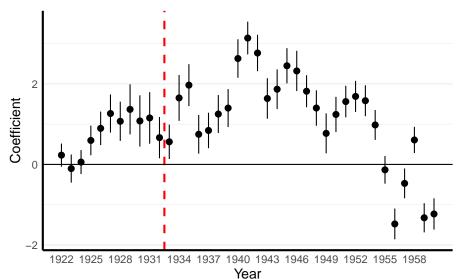


# DiD - Only Rehabilitated Individuals



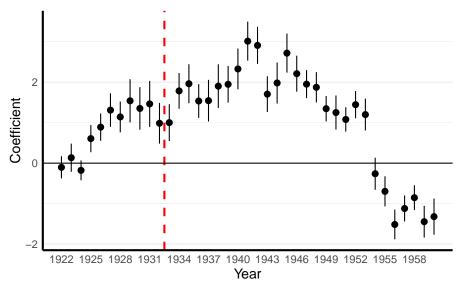


## DiD - Only arrests from Border Areas



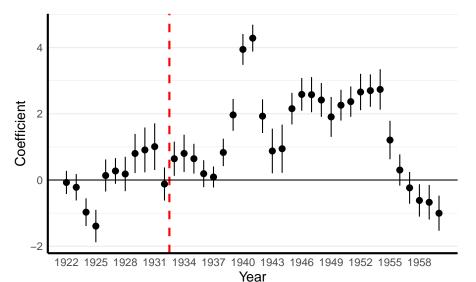


### DiD - Only arrests from Western Border Areas



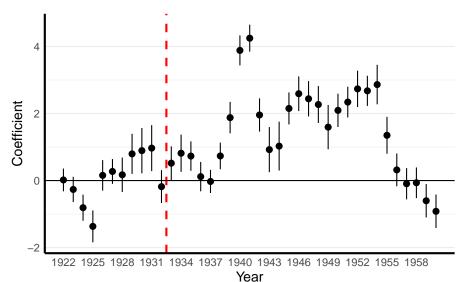


#### DiD - Arrests from Border Areas Excluded



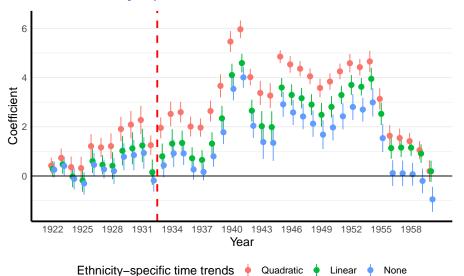


#### DiD - Arrests from Western Border Areas Excluded

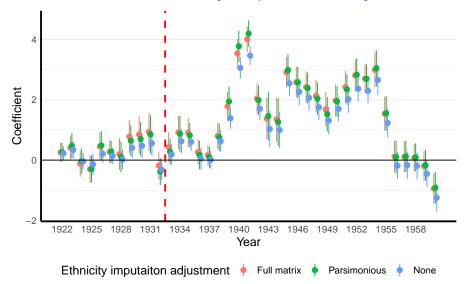




## DiD - Ethnicity-specific time trends

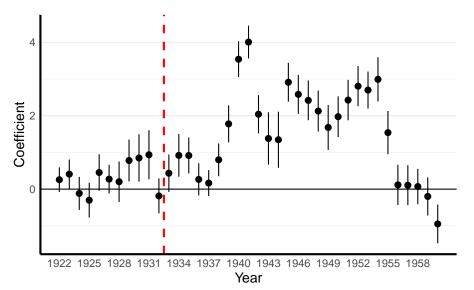


## DiD - Different Ethnicity Imputation Adjustments



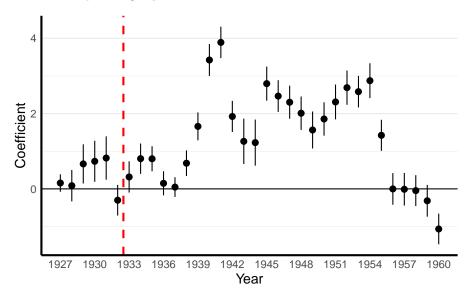


#### DiD - Stata Standard Errors



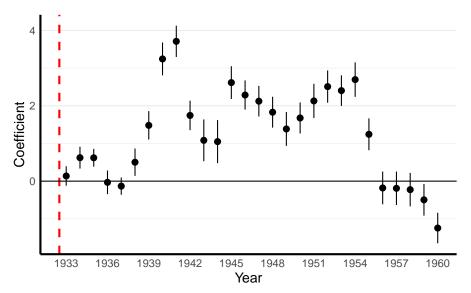


#### DiD - From 1927



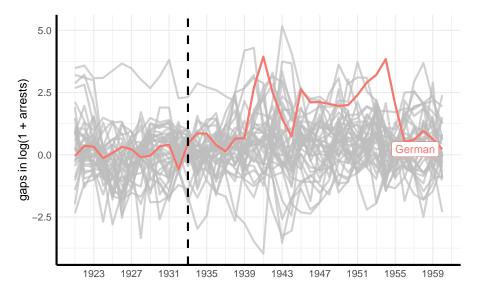


#### DiD - From 1933

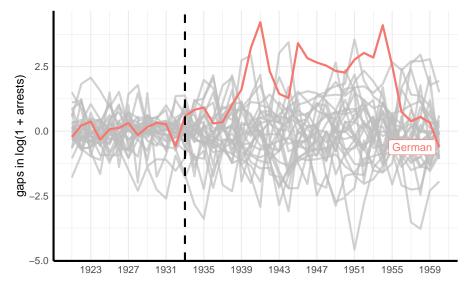




#### SCM - Mean of the Outcome as a Predictor

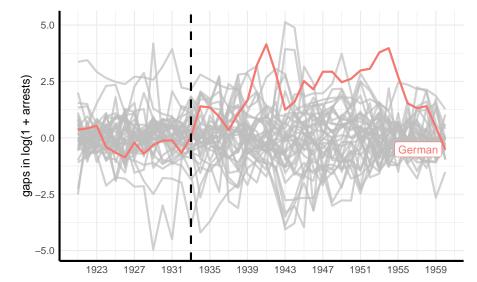


# SCM - Only Ethnicities without Independent State



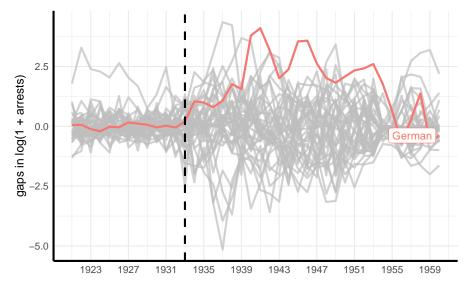


# SCM - Only Rehabilitated Individuals



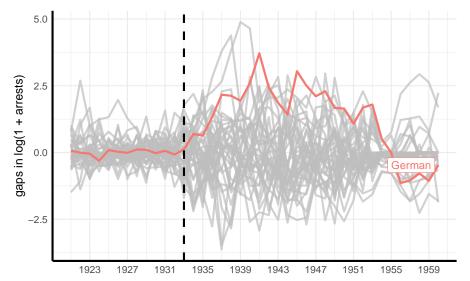


# SCM - Only Arrests from Border Areas

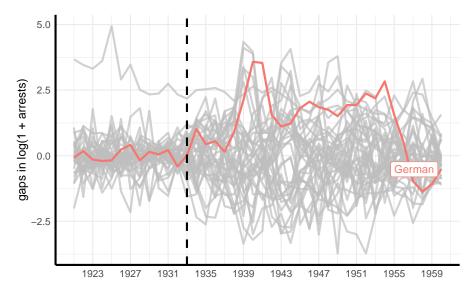




# SCM - Only Arrests from Western Border Areas

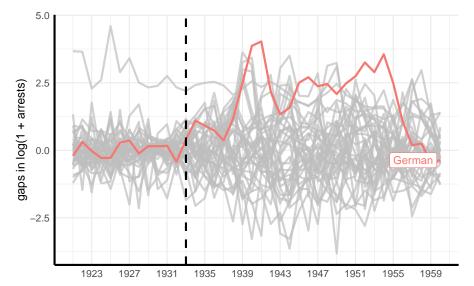


#### SCM - Arrests from Border Areas Excluded



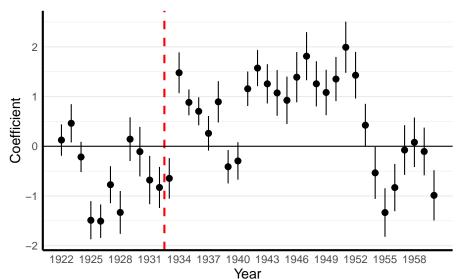


#### SCM - Arrests from Western Border Excluded



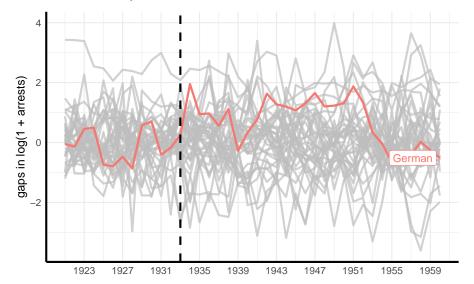


# DiD - No Imputations of Arrest Date



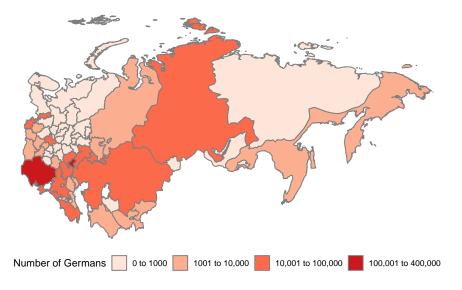


## SCM - No Imputations of Arrest Date





# Map of German population in the USSR





# Map of German population in the USSR

