

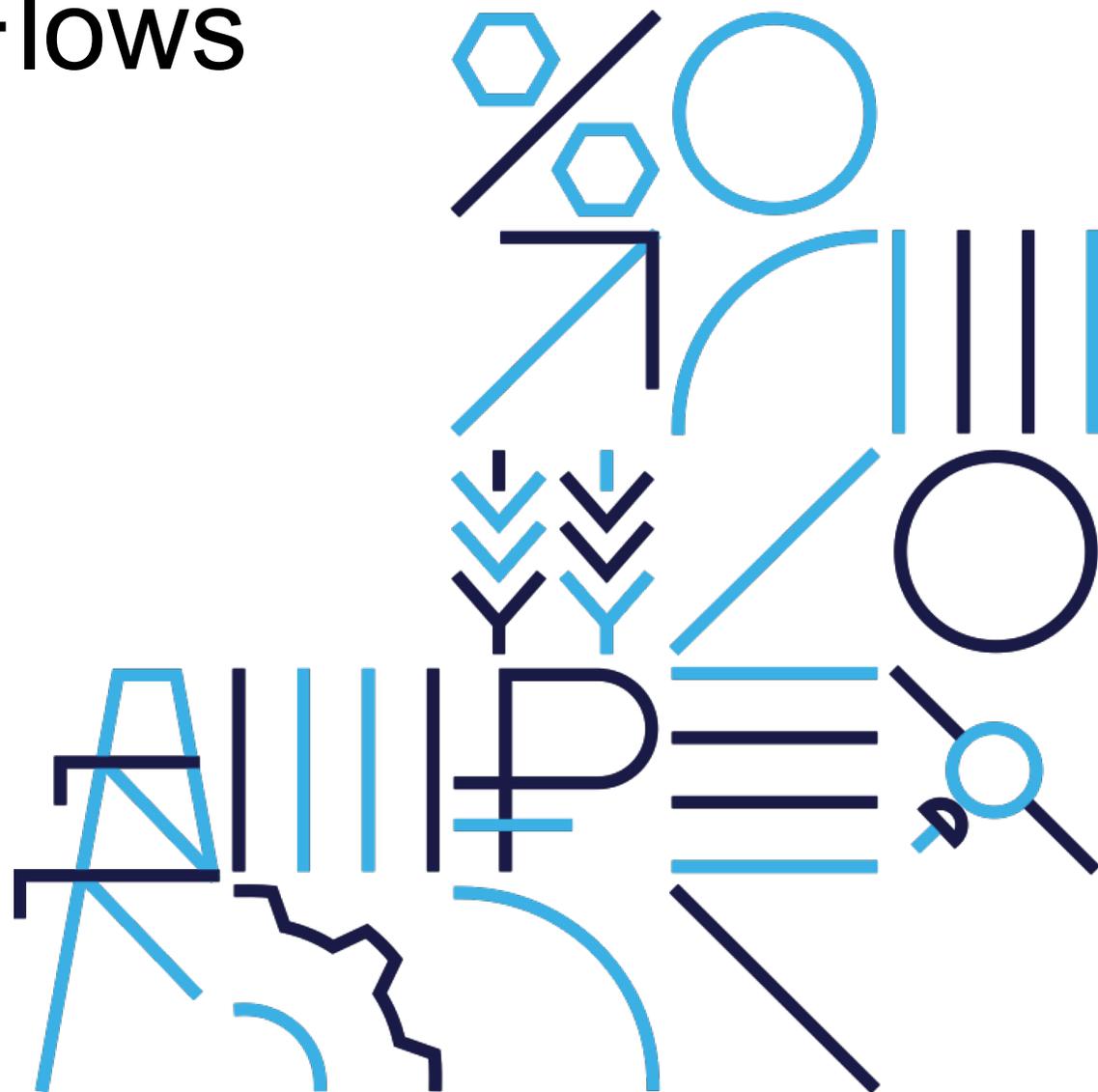
# Forecast of Russian Interregional Migration Flows

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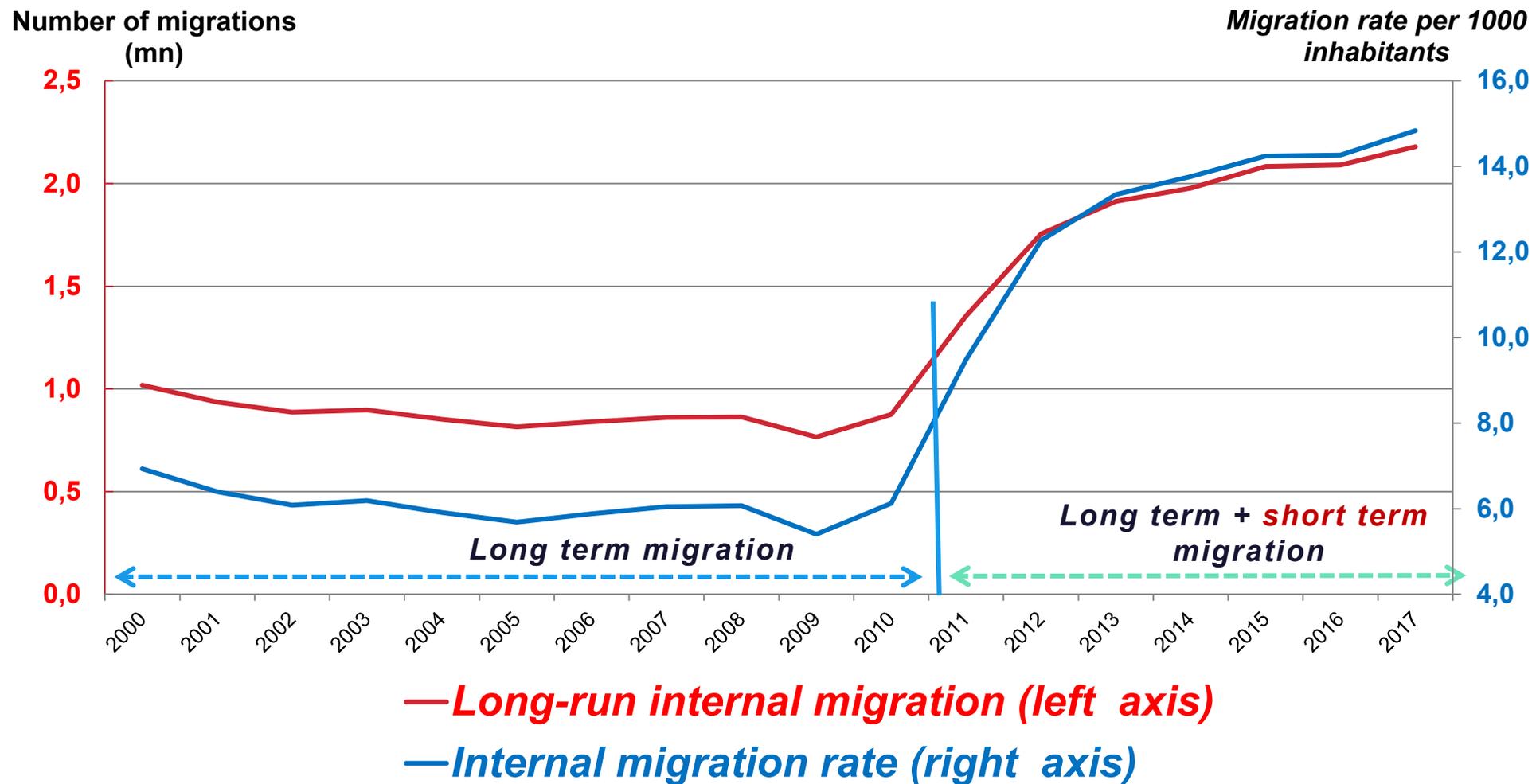
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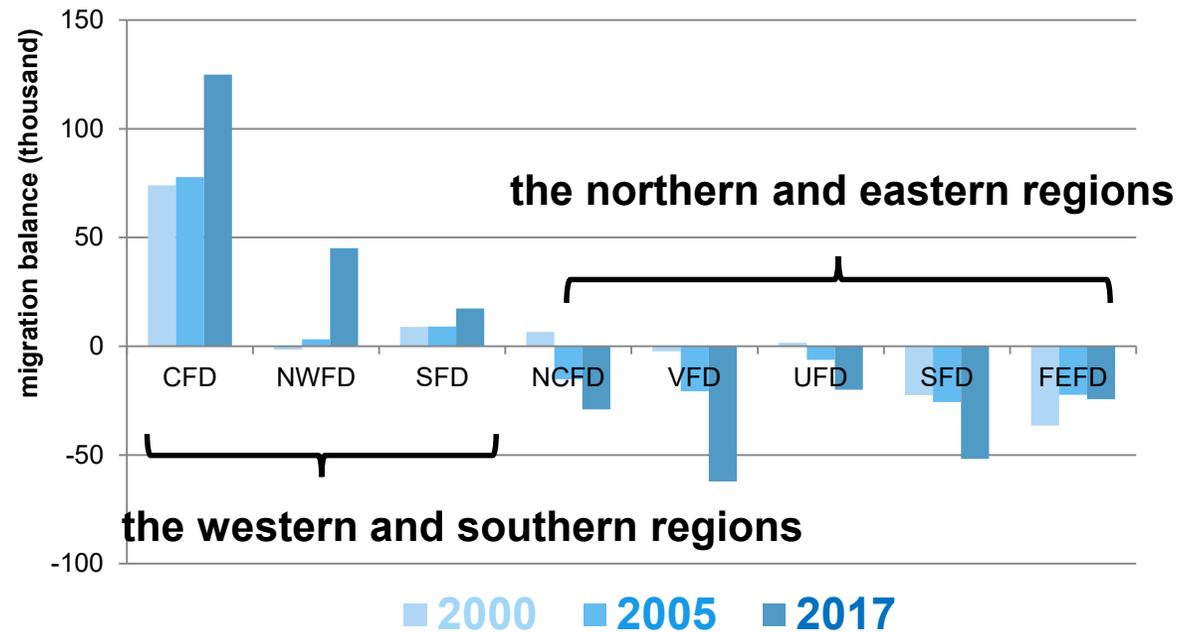
Some key features of interregional migration in Russia

# The dynamics of internal population migration in RF



# The regional structure of population internal migration

## Russian Federal Districts



Used notation: CFD – Central Federal Districts, NWFD – Northwestern Federal District, SFD - South Federal District, NCFD - North Caucasus Federal District, VFD – Volga Federal District, UFD – Ural Federal District, SFD - Siberian Federal District, FEFD - Far Eastern Federal District.

# Why do we need the forecast of migration flows between regions?

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- 1) **Migration affects the demographic situation in the regions;**
- 2) **migration influences the parameters of regional labor markets;**  
**in particular, migration contributes to the growth of regional inequality in terms of population and labor**
- 3) **migration affects regional infrastructure load;**
- 4) **migration redistributes population incomes from one region to another;**
- 5) **and much more...**

2.

## Modeling of interregional migration flows in Russia

## Primary data of migration flows in Russia

	Region 1	Region 2	...	Region n
Region 1	$b_{11}$	$b_{12}$	...	$b_{1n}$
Region 2	$b_{21}$	$b_{22}$	...	$b_{2n}$
...	...	...	...	...
Region n	$b_{n1}$	$b_{n2}$	...	$b_{nn}$

## I. Factor trend models (class of gravitational models):

$$b_{ij}(t) = F(f_1^i, \dots, f_n^i, f_1^j, \dots, f_k^j, t) \text{ or } b_{ij}(t) = F\left(\frac{f_1^i}{f_1^j}, \dots, \frac{f_n^i}{f_n^j}, t\right) \text{ or } b_{ij}(t) = F(f_1^i - f_1^j, \dots, f_n^i - f_n^j, t)$$

where  $b_{ij}(t)$  - the number of migrants from region  $i$  to region  $j$ ;

$f_1^i, \dots, f_n^i, f_1^j, \dots, f_n^j$  - attracting and pushing factors in the regions  $i$  and  $j$ ;

$n, k$  – the number of factors;

$t$  – trend;

$F$  - form of dependence (mostly linear).

### Positive aspect of the models

- taking into account factors of both the territory of arrival and the territory of disposal

### Negative aspects of the models

- in the case of working with time series, it is not possible to take into account many migration factors

- a large number of regression equations
- (if  $i=j=82$  then the number of equations = 6724)

## II. Migration models evaluated on a panel-structured database (class of gravitational models):

$$b_{ij} = G \frac{P_i^\alpha \times P_j^\beta}{d_{ij}^b} \times \left( \frac{Y_j}{Y_i} \right)^\gamma \quad \text{or} \quad b_{ijt} = \alpha + \beta M_{ijt-1} + \gamma M_{jit-1} + \rho Dist_{ij} + \delta X_{it-1} + \chi X_{jt-1} + \mu Macro_t + \eta_{ij} + \varepsilon_{ijt}$$

where  $b_{ij}(t)$  - the number of migrants from region  $i$  to region  $j$ ;

$P_i, P_j$  - the number of population of regions  $i$  and  $j$ , respectively;

$d_{ij}$  - physical distance between regions  $i$  and  $j$ ;

$Y_j, Y_i$  - socio-economic factors of the territory of departure and arrival;

$\alpha, \beta, b, \gamma$  - constants

### Positive aspects of the models

- taking into account a lot of factors of both the territory of arrival and the territory of disposal: economic, social, demographic, infrastructural, climatic, geographical;

- a small number of regression equations: one (for all flows) or two (for counter migration flows).

### Negative aspects of the models

- it is hard to forecast migration based on such models: it is necessary to have predicted values of all explanatory variables

$$x_i = (a_i + b_i * Migr) * \left(\frac{y_i}{Y}\right)^{-\lambda_i} \prod_{k=1}^n \left(\frac{y_i}{y_k}\right)^{-\lambda_k * S_k}$$

where  $x_i$  - incoming migration flow for region  $i$ ,  $i = \overline{1..n}$

$Migr$  – total migration flow (sum by regions);

$y_k$  – income per capita for region  $i$  (base year's = 1);

$Y$  – overall income per capita index (base year's  $Y = 1$ );

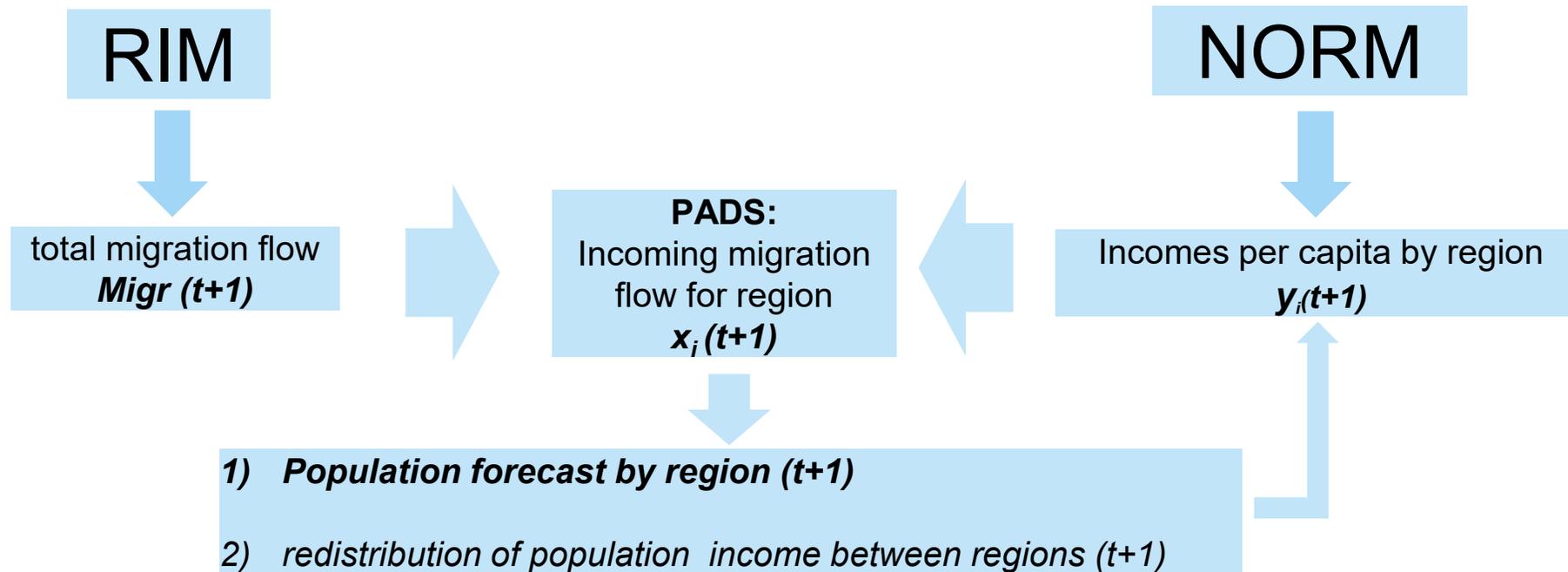
$S_k$  – share of region  $i$  in total migration flow of the base year;

$a_i, b_i, \lambda_k$  – parameters to be estimated.

The equations connect the distribution of migrants by region and the income per capita by region

# The advantages of PADS for modeling of internal migration

I. Such an approach is embedded in the model system of IEF RAS. For forecast period  $t+1$ :



II. The number of equations being evaluated is equal to the number of regions (82)

## Some difficulties of modeling

1. Changing the methodology of accounting for internal migrants, breaking the time series.
2. The variety of types of internal migration: educational, labor, etc.
3. In this regard, there are many factors affecting the structure of migration: social, demographic, infrastructural, climatic, geographical.

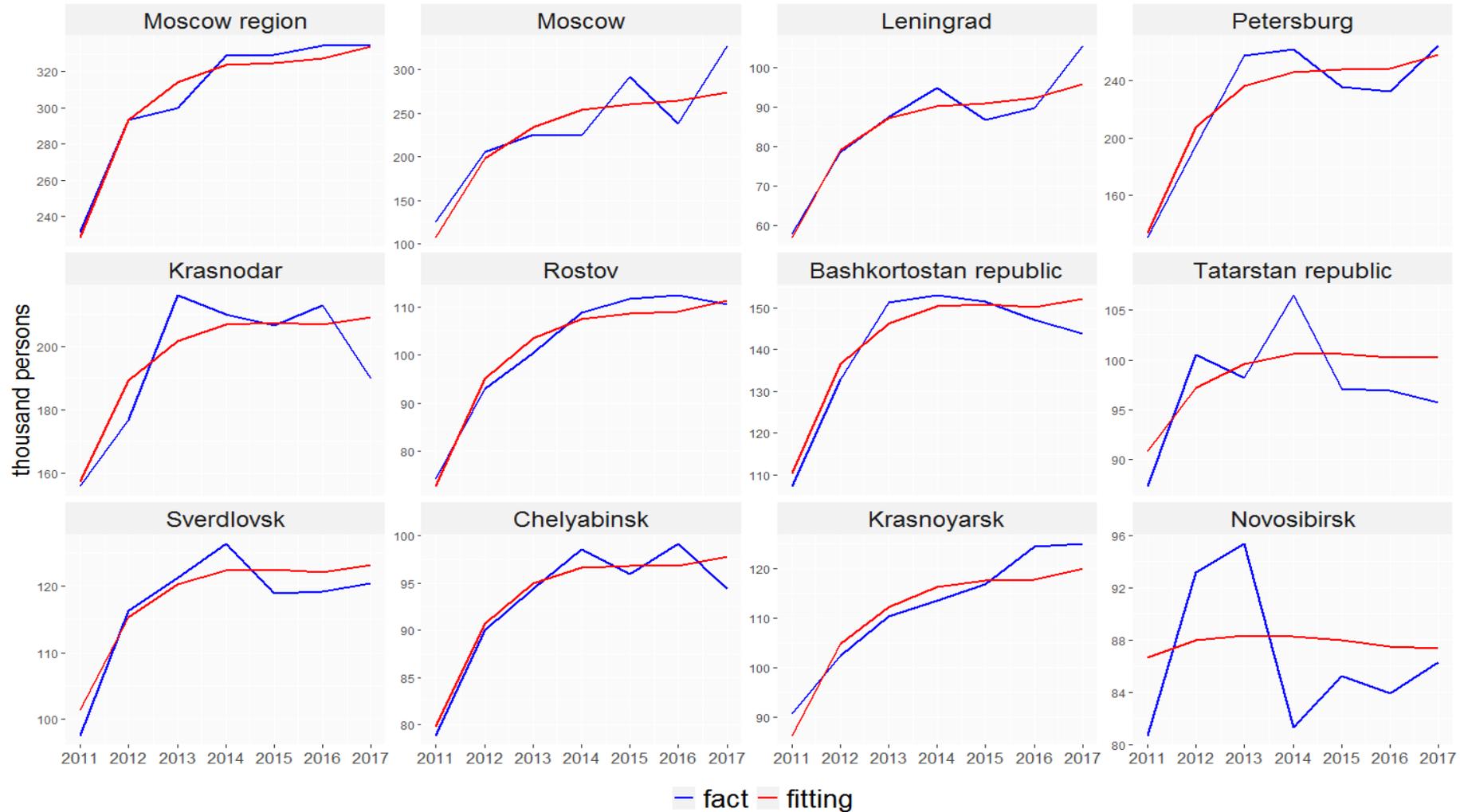
## Database for modeling

1. The dynamic series of the arrived population by region ( $x_i$ ), 2011-2017.
2. The dynamic series of income per capita by region ( $y_i$ ), 2007-2017. Estimates of income per capita over the past 5 years have been explanatory variables.
3. The number of regions is 82.

3.

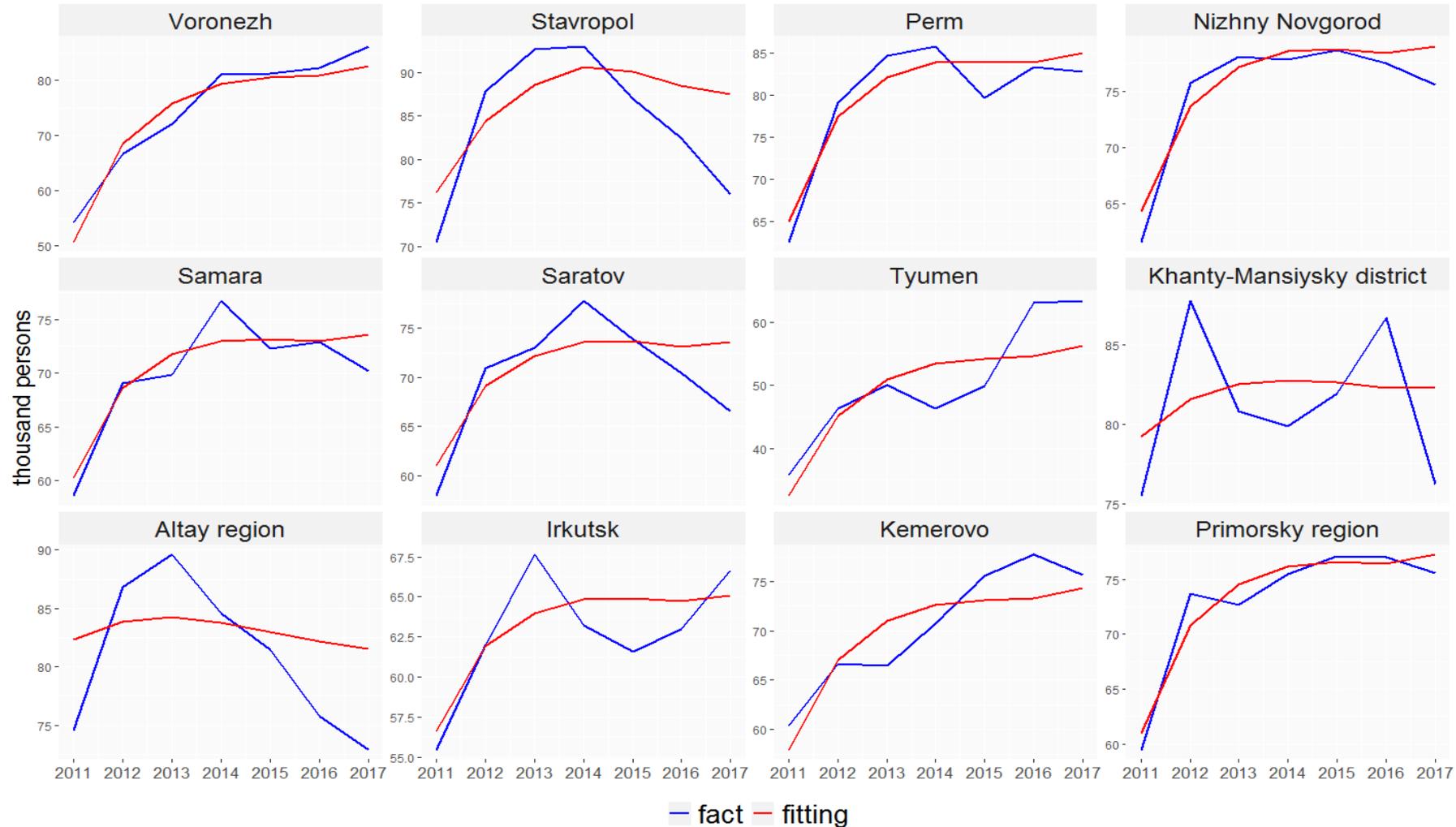
Some results of interregional  
migration modeling on the base of  
“PADS”

# Some results. How close are the estimates to the actual data? (part 1)

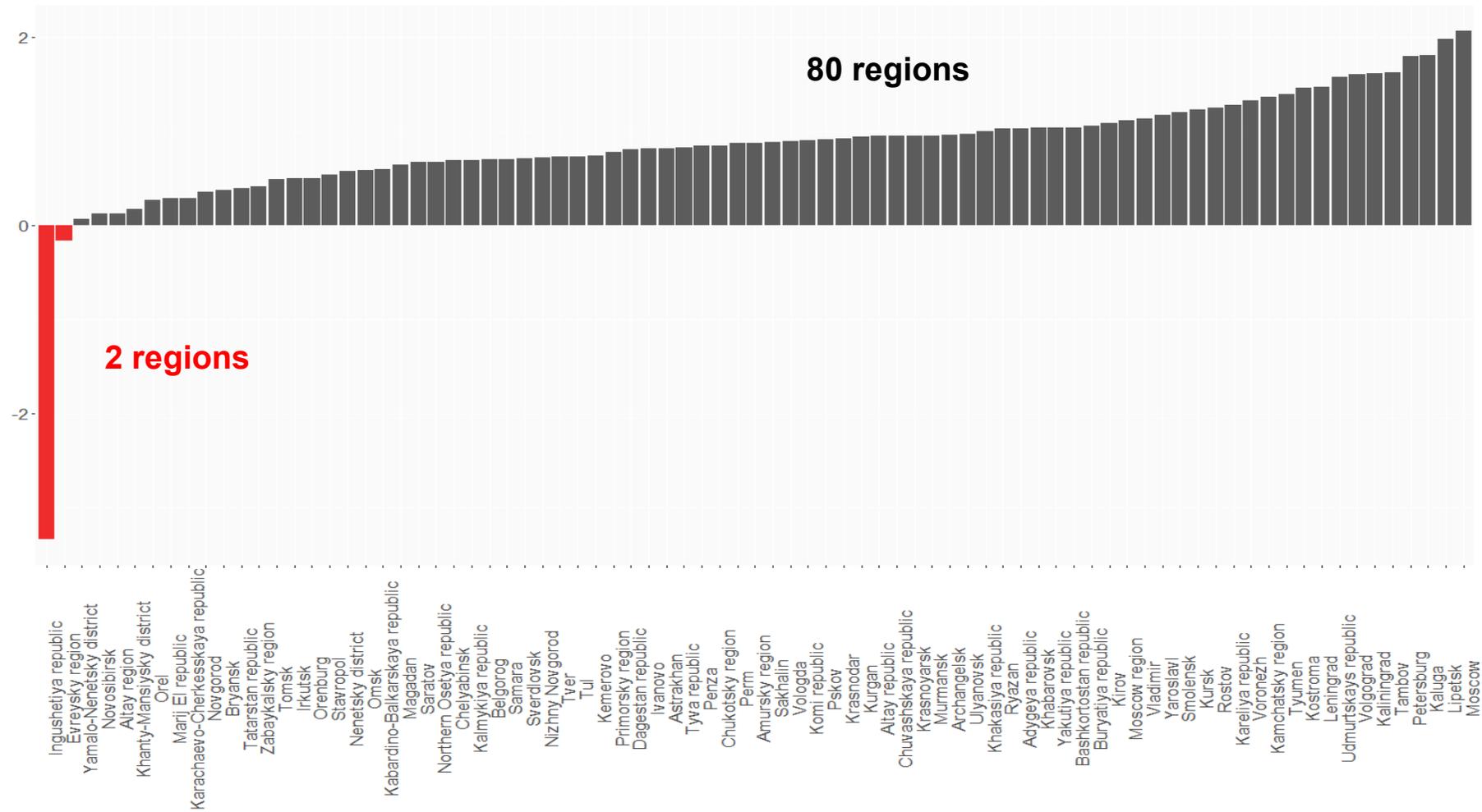


The first 12 regions with the largest number of migrants arrived

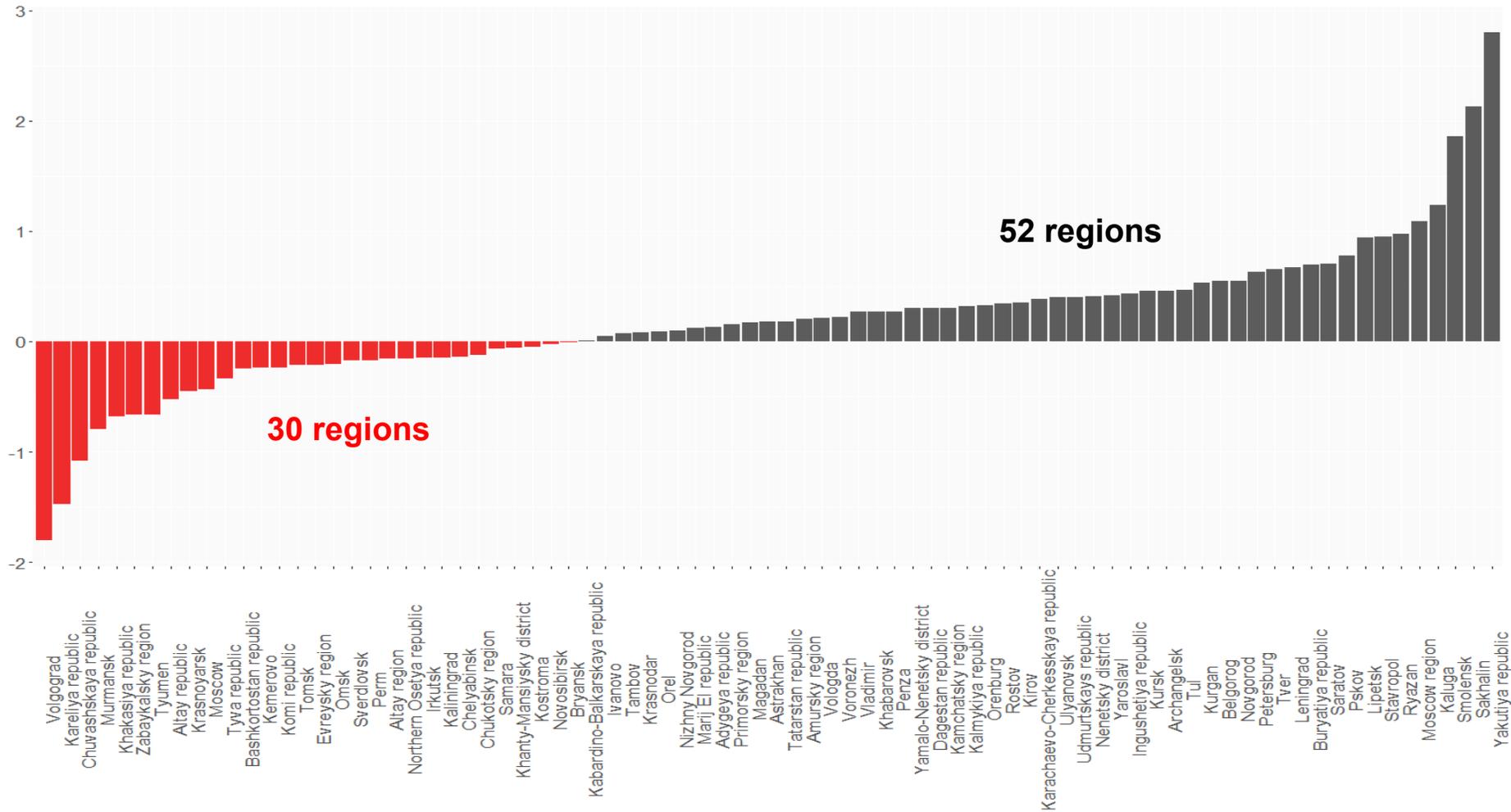
# Some results. How close are the estimates to the actual data? (part 1)



# Some results: total migration elasticity of the incoming migration flow by region (the base year = 2017)



# Some results: income per capita elasticity of the incoming migration flow by region



- ❖ The shown settlement system on the base of “PADS” was developed primarily for *forecasting* internal migration.
- ❖ The number of regions with negative income elasticity of migration less than 50%.
- ❖ For regions with the negative income elasticities of migration, only the additive part of the equation can be used to forecast the incoming flow

- Forecast of the incoming migration and the outgoing migration by region.**
- Embed this forecast in a regional demographic forecasting model.**
- Modeling separate flows of labor migrants.**
- Assessment of the scale of redistribution of population income due to internal migration.**

**Thank you for attention!**

# Contacts



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## Central Federal District

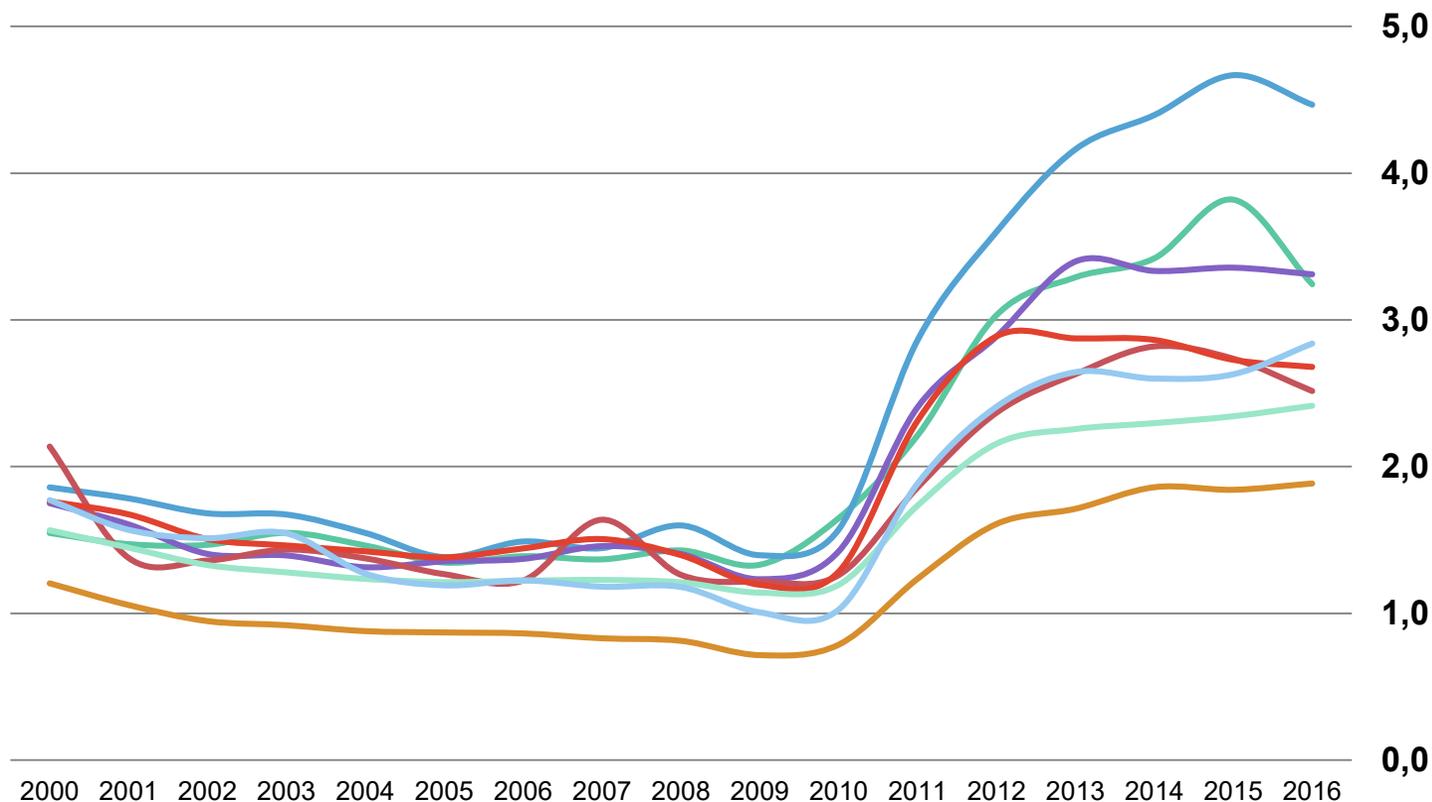


## Southern Federal District



2000-2009

# The share of internal migrants in the number of employed population by Federal Districts, %



- Federal Districts vary in the proportion of migrants in the employed population;
- By 2017 the largest share of internal migrants was observed in the Northwestern Federal District.

— CFO — NWFD — UFO — NCFO  
 — VFD — UFO — SFD — FEFD