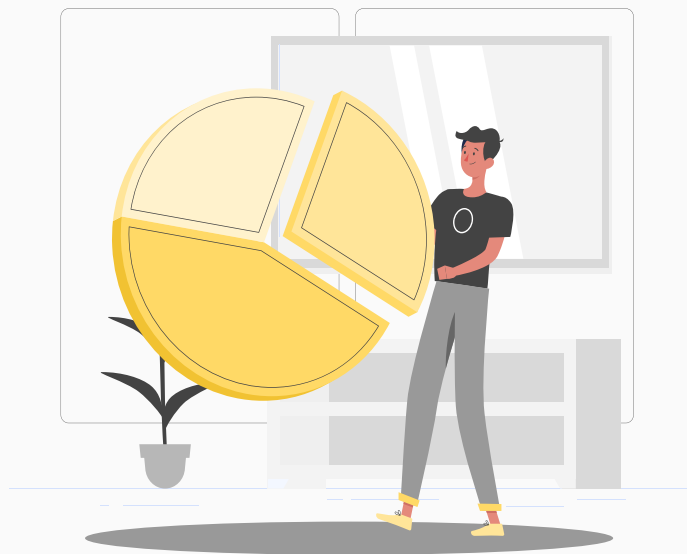


# MORTGAGE IN RUSSIA 2019-2021

German Elizaveta



# CONTENTS



## 01 THE STORY

Construction sector  
Housing market

## 03 DATA

Indicators

## 02 OBJECTIVES

Preferential program  
Mortgage loans

## 04 RESULTS

Models  
Prospects

- The share of **construction sector in GDP** of Russia was **5,1%** in 2020
- **The construction** provides about **9% of jobs** in the economy
- **Mortgage** is the most important (mostly, the only) way to **improve living conditions**

### **APRIL-MAY 2020 – COUNTRYWIDE LOCKDOWN**

- **Covid-19 crisis**: decreasing demand and pace of construction
- The **new preferential mortgage program** was introduced as a part of **governmental support** for the construction sector and citizens
- Government supports **developers** by **subsidizing mortgage rate** for buying new housing
- The experience of 2015-2016: similar measures to save sector from failing

## THE PREFERENTIAL PROGRAM

- **Mortgage rate 6,5%** that remains the same for the entire loan period
- The loan amount is up to **3 million** of rubles in the regions, up to **8 million** in Moscow and St. Petersburg
- **Launched** in May 2020
- **Changes** in conditions in June 2021: increased rate **to 7,0%**, reduced loan amount **to 3 million** in all regions
- Danger: rising prices and already realized demand of "good" clients



## OBJECTIVES

### PREFERENTIAL PROGRAM

- Analyze the program dynamics (if there is any diffusion process)
- 2 scenarios after changing conditions - the speed of decreasing demand

### MORTGAGE OVERALL

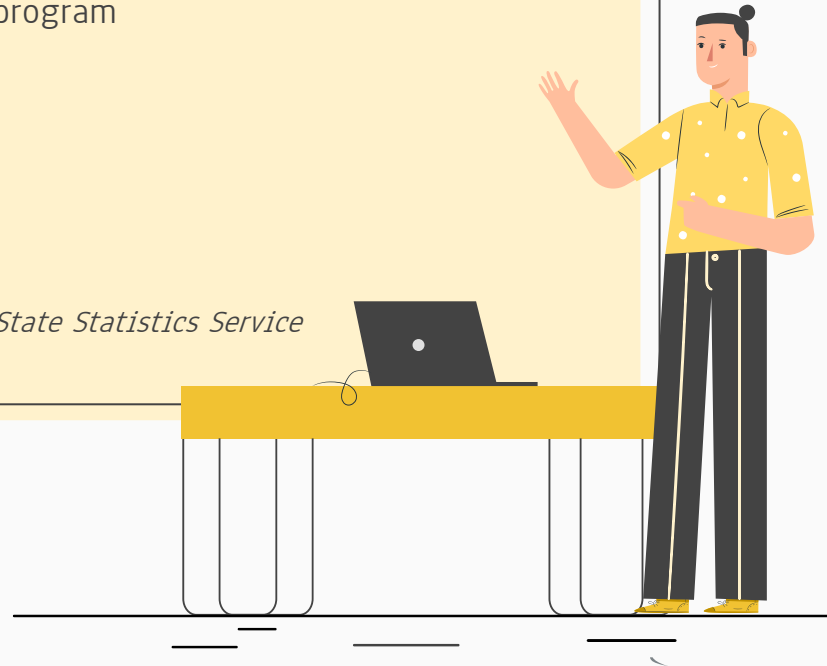
- Predict the mortgage dynamics by means of macroeconomic indicators:
  - Mortgage rate
  - Unemployment
  - Income
  - Housing prices
  - Commissioning of housing

# DATA

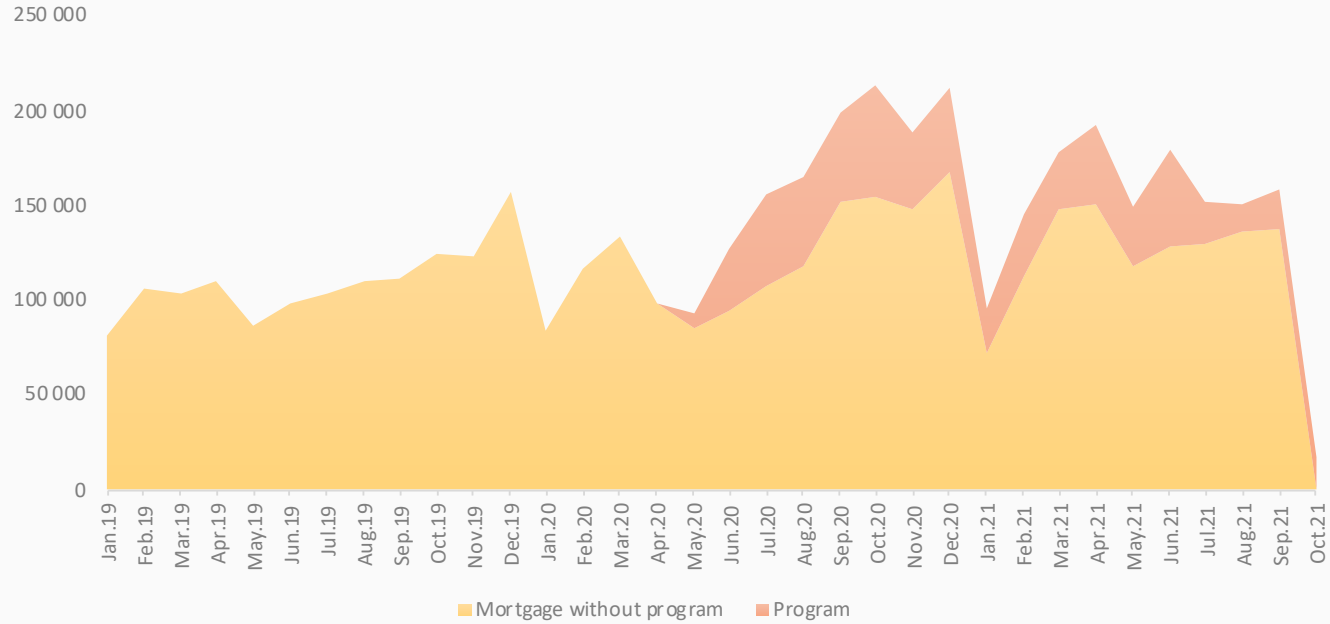
**Time series** from Jan 2019 to Oct 2021:

- Amount of mortgage loans overall
- Amount of loans in preferential program
- Mortgage rate (%)
- Unemployment rate (%)
- Real disposable income (%)
- Housing prices (rubles)
- Commissioning of housing (m<sup>2</sup>)

*Sources: Central Bank of Russia, Federal State Statistics Service*

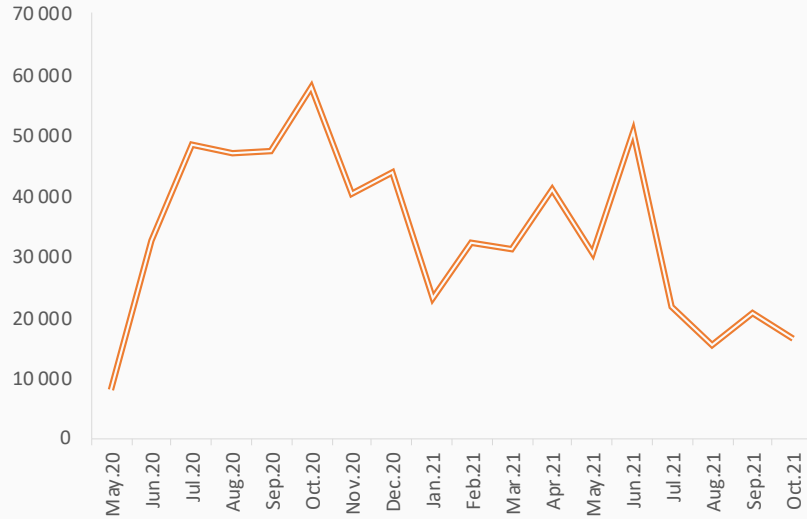


## MORTGAGE 2019-2021

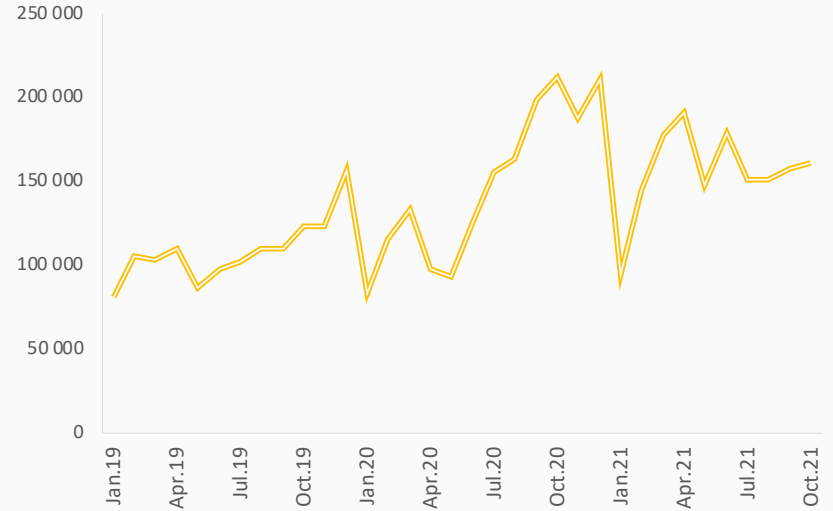


## MORTGAGE 2019-2021

Program  
(amount of loans)



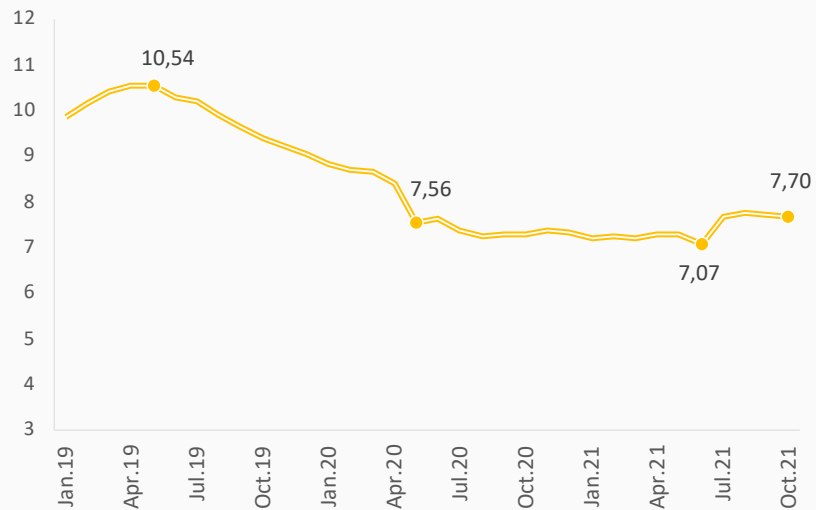
Mortgage overall  
(amount of loans)



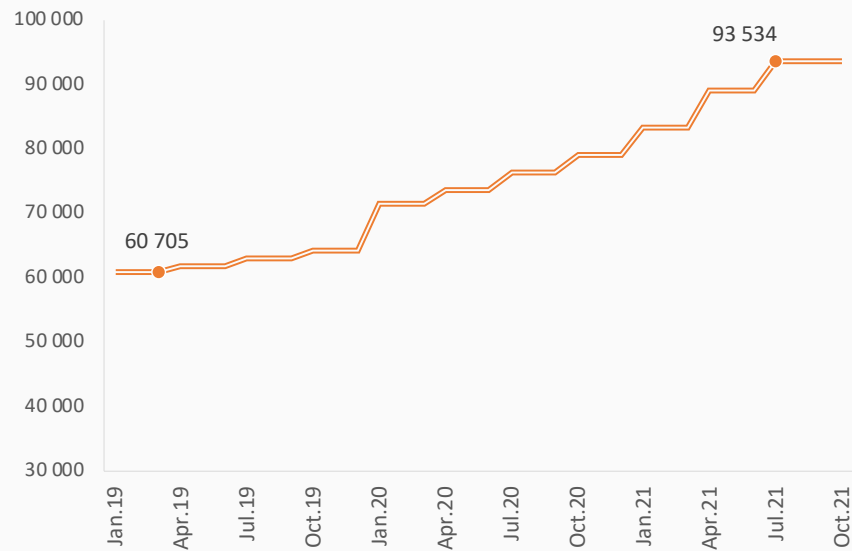


## MORTGAGE RATE AND HOUSING PRICE

Mortgage rate (%)

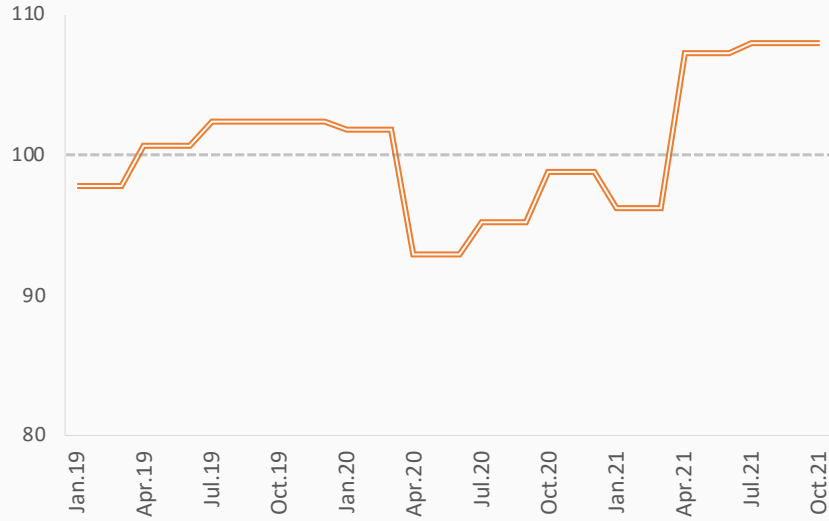


Price of 1 m<sup>2</sup> (rubles)

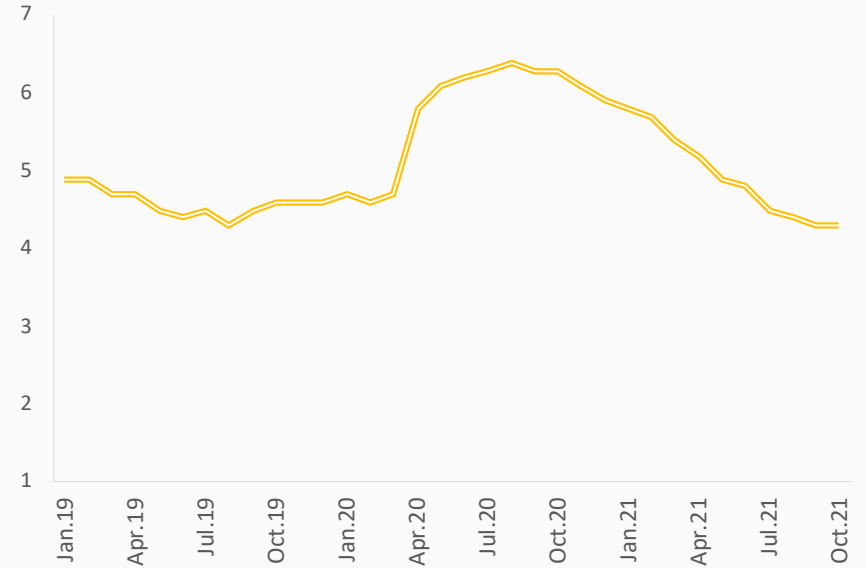


## REAL DISPOSABLE INCOME AND UNEMPLOYMENT

Real disposable income  
(% of the corresponding period of the previous year)



Unemployment rate (%)



# MODELS

## THE PROGRAM

Bass Model  
Generalized Bass Model

## MORTGAGE OVERALL

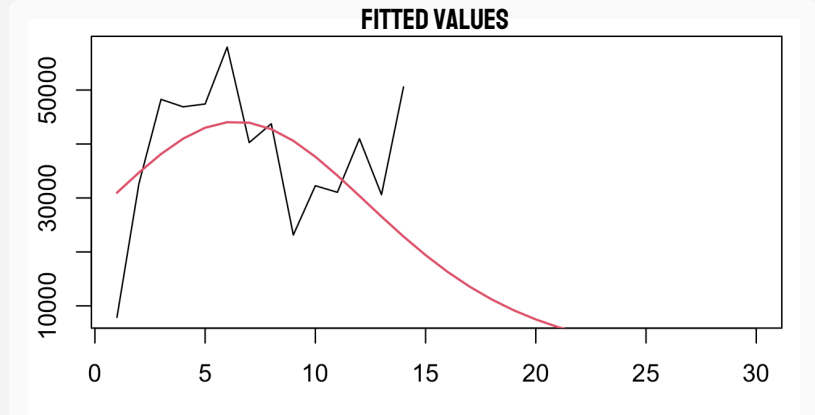
ARIMA  
Linear Regression  
Generalized Additive Model



## BASS MODEL

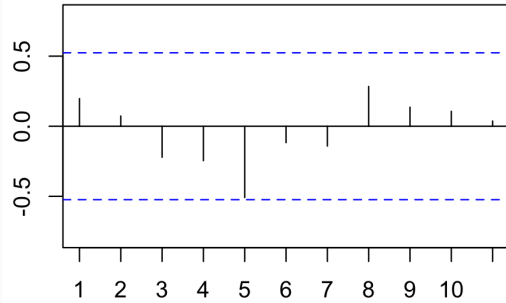
COEFFICIENT	Estimate	Std. Error	Lower bound	Upper bound	P-value
Market potential (thousand)	632,858	68,086	499,410	766,305	0,000
Innovation	0,043	0,004	0,036	0,050	0,000
Imitation	0,183	0,051	0,084	0,280	0,004

R-squared: 0.9929002

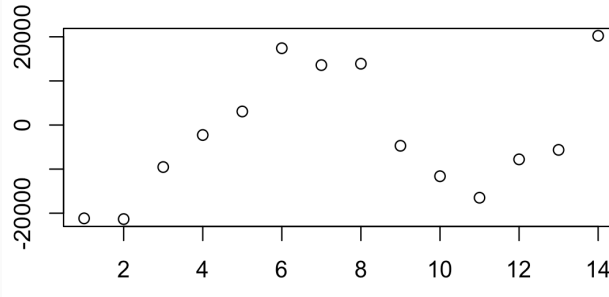


## AUTOCORRELATION AND RESIDUALS

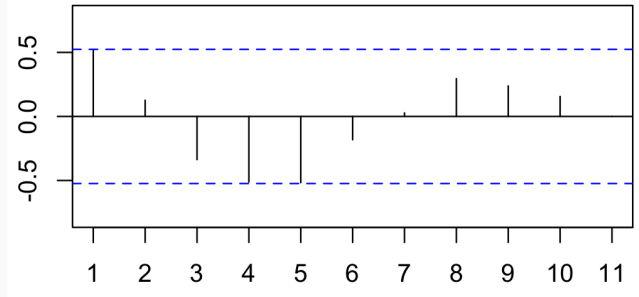
ACF TIME SERIES



RESIDUALS



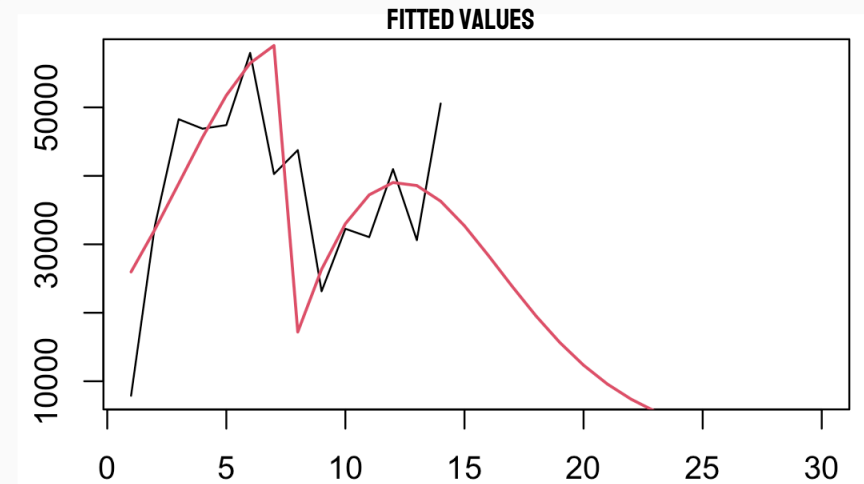
ACF RESIDUALS



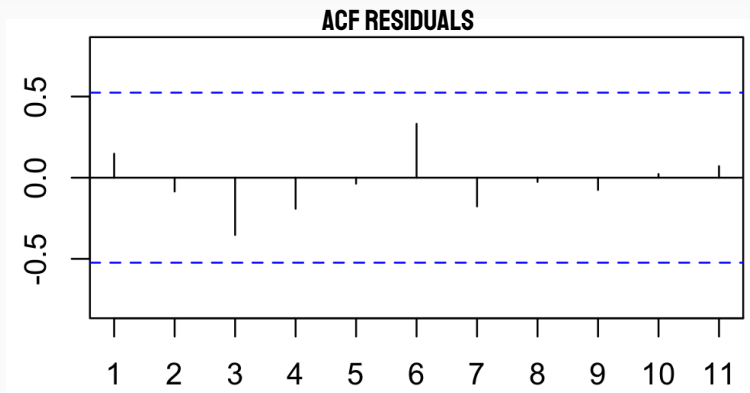
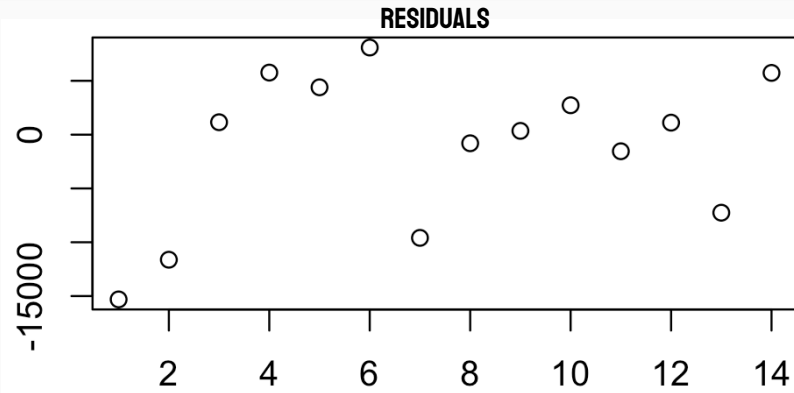
## GENERALIZED BASS MODEL

COEFFICIENT	Estimate	Std. Error	Lower bound	Upper bound	P-value
Market potential (thousand)	717 897	191 117	343 315	1 092 479	<b>0,006</b>
Innovation	0,043	0,004	0,036	0,050	<b>0,002</b>
Imitation	0,183	0,051	0,084	0,280	<b>0,001</b>
Starting time	7,460	0,466	6,548	8,373	<b>0,000</b>
Memory	-0,248	0,323	-0,882	0,385	0,464
The shock	-0,812	0,336	-1,470	-0,154	<b>0,042</b>

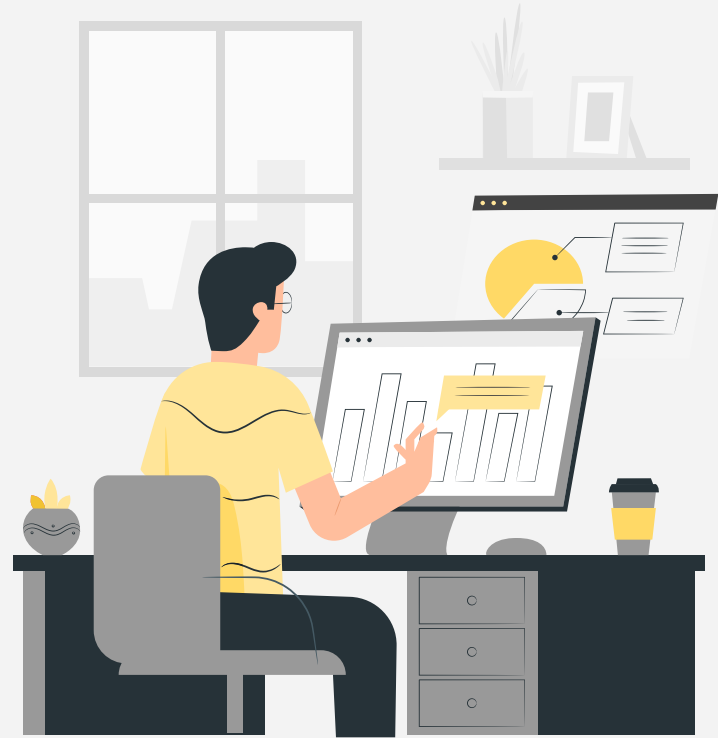
R-squared: 0.9981625



## AUTOCORRELATION AND RESIDUALS



# MORTGAGE PREDICTION





## LINEAR REGRESSION: MORTGAGE OVERALL

	VIF
UNEMPLOYMENT	9,9
PRICE	12,1
COMMISSIONING	1,2
MORTGAGE RATE	17,2
REAL DISPOSABLE INCOME	6,3

### Durbin-Watson

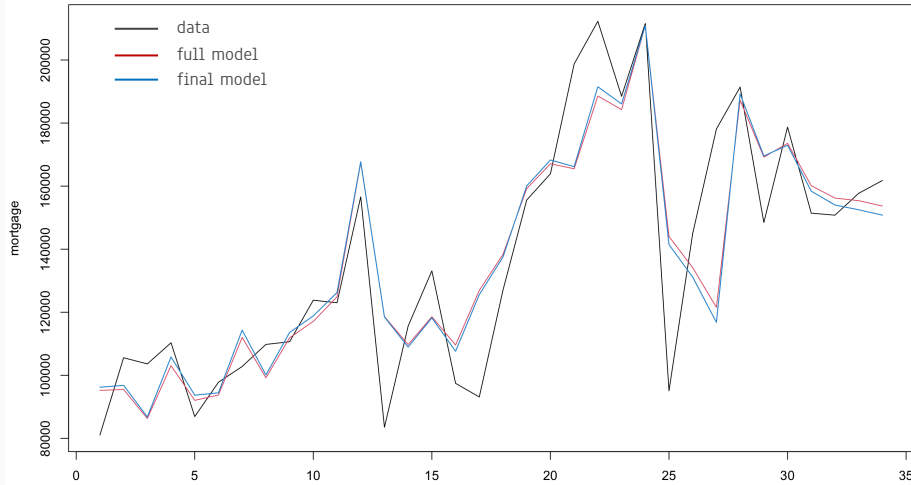
Statistics = 1,6846  
P-value = 0,107

	unemp	price_m2	mkd_m2	rate	real_income
unemp	1.00	0.17	-0.01	-0.61	-0.74
price_m2	0.17	1.00	0.04	-0.84	0.40
mkd_m2	-0.01	0.04	1.00	-0.12	0.14
rate	-0.61	-0.84	-0.12	1.00	0.04
real_income	-0.74	0.40	0.14	0.04	1.00

A heatmap visualization of the correlation matrix for five variables: unemployment, price per square meter, mortgage rate, mortgage duration, and real disposable income. The color scale ranges from -1 (dark red) to 1 (dark blue), with 0 being white. The diagonal elements are all 1.00. The strongest negative correlation is between price\_m2 and rate (-0.84). The strongest positive correlation is between price\_m2 and real\_income (0.40).

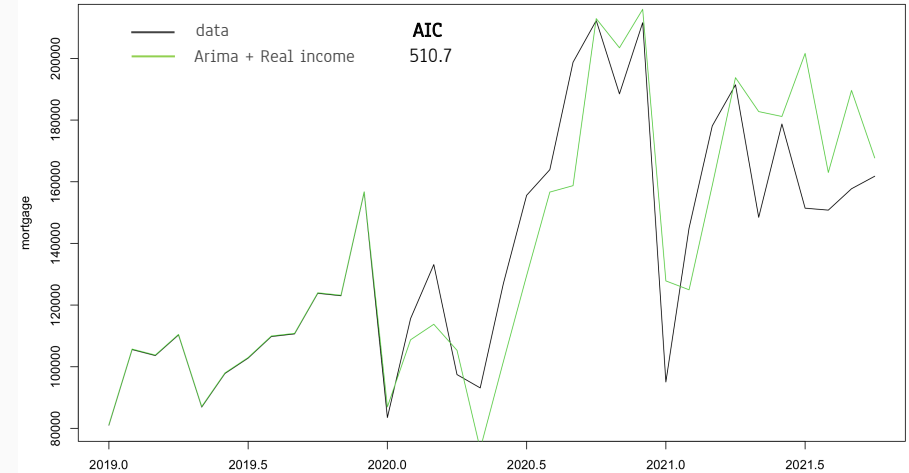
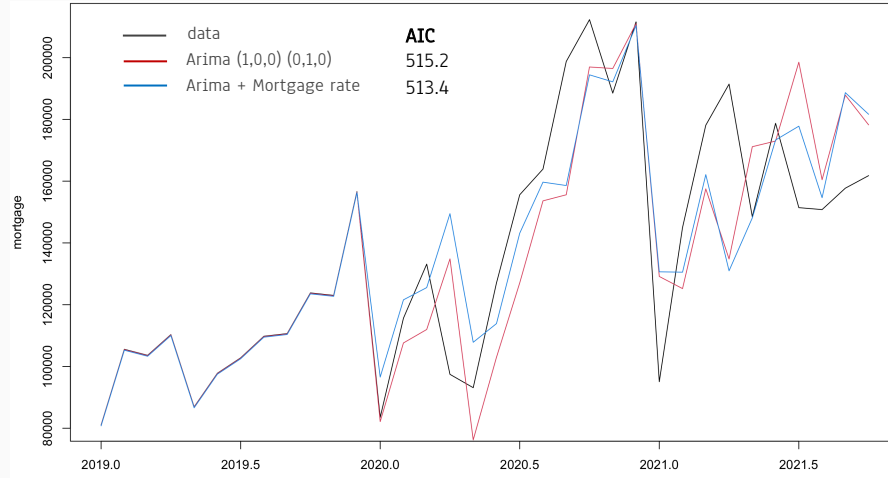
1  
0.8  
0.6  
0.4  
0.2  
0  
-0.2  
-0.4  
-0.6  
-0.8  
-1

## LINEAR MODELS



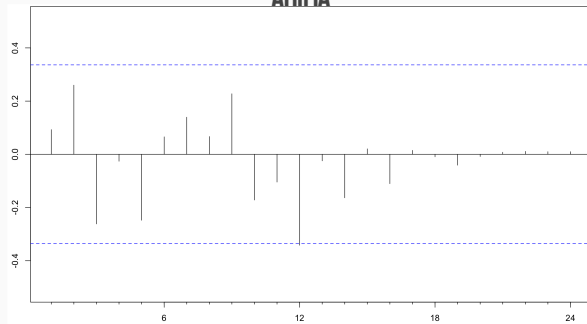
COEFFICIENT	FULL MODEL		FINAL MODEL	
	Estimate	P-value	Estimate	P-value
Intercept	-865 723,6	0,013	-969 313,9	0,000
Mortgage rate	-1 186,9	0,923		
Price	0,2	0,874		
Unemployment	53 531,5	0,002	58 999,9	0,000
Commissioning	5,4	0,005	5,3	0,002
Real income	7 027,7	0,001	7 815,1	0,000
Adj. R-Squared	0,7095		0,7262	

## ARIMA MODELS

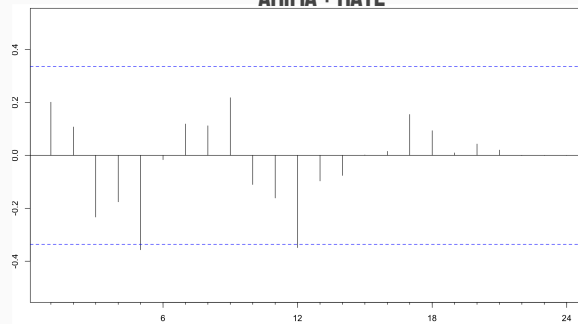


## ACF DIAGNOSTICS

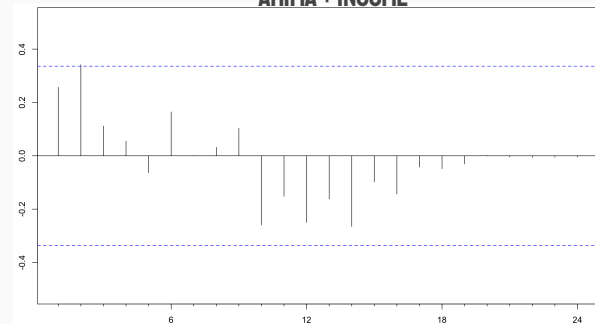
**ARIMA**



**ARIMA + RATE**

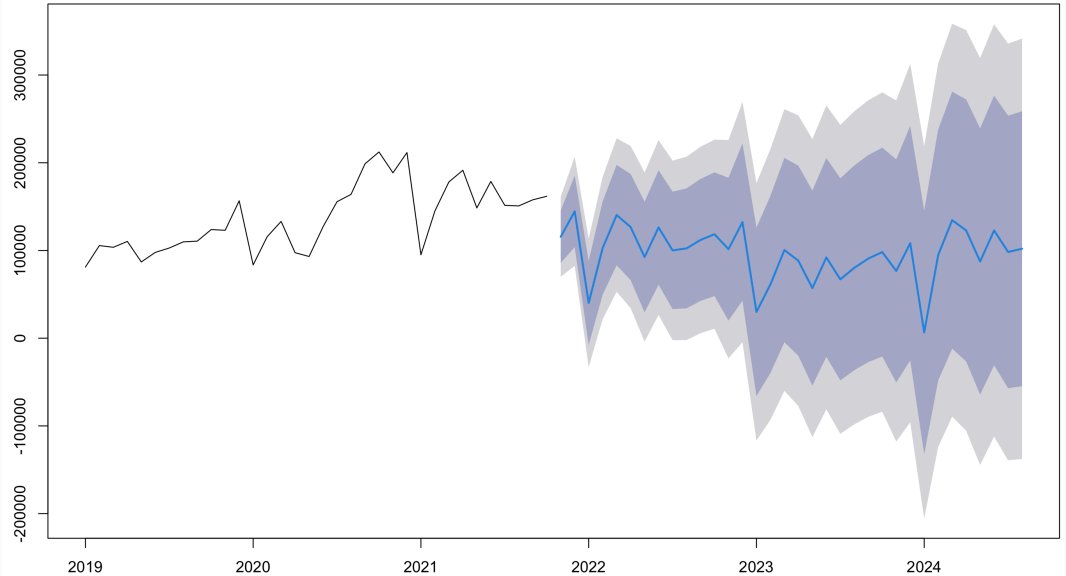


**ARIMA + INCOME**

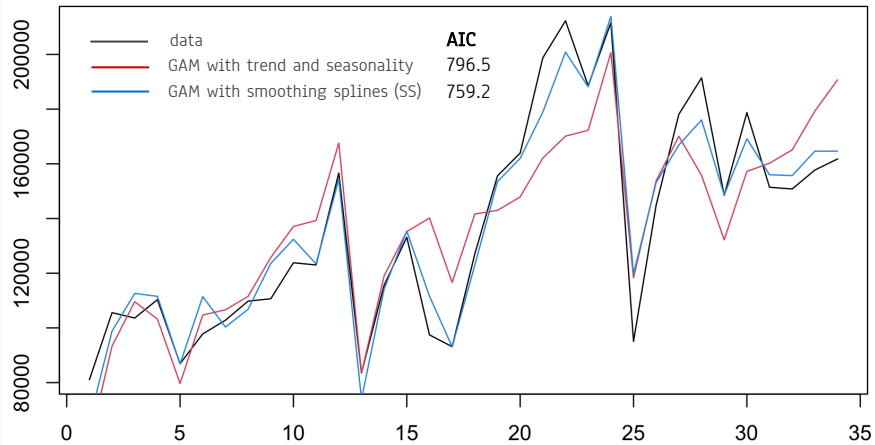


## ARIMA FORECASTING

**REAL DISPOSABLE INCOME  
AS REGRESSOR**



## GENERALIZED ADDITIVE MODELS



### PARAMETRIC EFFECTS

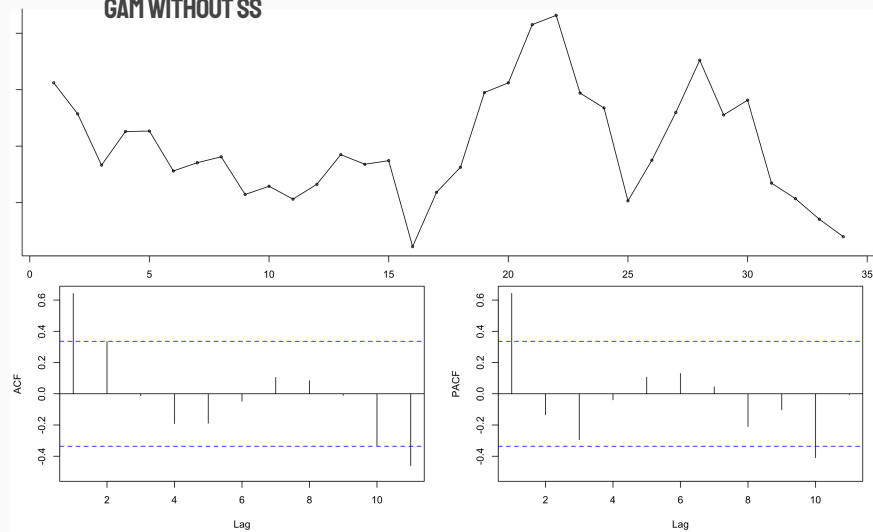
	F	P-value
S (trend)	118,913	0,000
Seasonality	7,018	0,001
S (income)	6,512	0,023

### NONPARAMETRIC EFFECTS

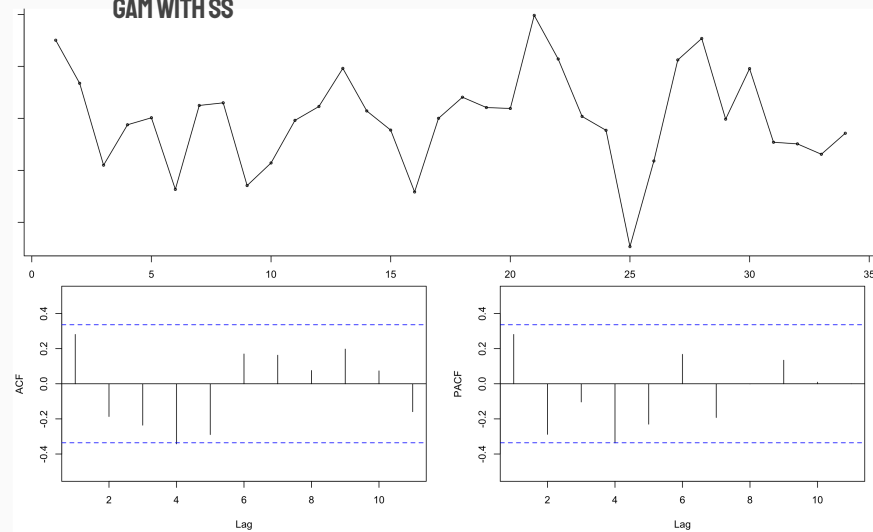
	F	P-value
S (trend)	6,971	0,004
S (income)	5,608	0,010

# RESIDUALS

**GAM WITHOUT SS**



**GAM WITH SS**



## CONCLUSIONS

### THE PROGRAM

In order to describe the program dynamics better and be able to predict it, some **micro-level indicators** are needed that can define behavioral aspect: intentions  $\neq$  actions  
Use of questionnaires

### THE MORTGAGE OVERALL

**Real disposable income** seems to be the strongest external indicator out of other proposed variables in the prediction of mortgage. More data can be tested.  
The problem is different frequency of macroeconomic data collection: monthly, quarterly, yearly



# THANK YOU

