

# Introduction to Sequential Data Modelling

# Course Structure

## Tuesday/Thursday

Lecture - 1/2 hour(s)

Seminar - 1/2 hour(s)

## Friday

Test

## Instructor

Ekaterina (@kate\_nil)

## Manager

Alexandra (@alexazdan)

**Classical models Block**  
**Focus on Time Series**  
**Analysis**

**22/11 - 06/12**

**Neural models Block**  
**Focus on Neural Sequential**  
**data Modelling**

**08/12 - 16/12**

**Projects defence - 20/12**

# What is the sequential data?

# People are the core of everything



Alex, 28 years old

Loan application



Will return a credit?



What data do we need?

How to improve customer experience?



# What data do we have?

- Tabular data is hard to collect
- It is prone to errors

A sequence of clients actions - best reflection on what she/he is doing



Alex, 28, man  
works in retail

Refuel 1753 r.

Lunch 400 r.

Login to a  
bank app

Transfer  
2000 r. to  
Maria

Watch  
LOTR

9:34

12:45

18:58 19:00

20:13

# Sequential supervised learning problem



# The classical supervised learning problem

$x$  - an image

$y$  - a class of an image

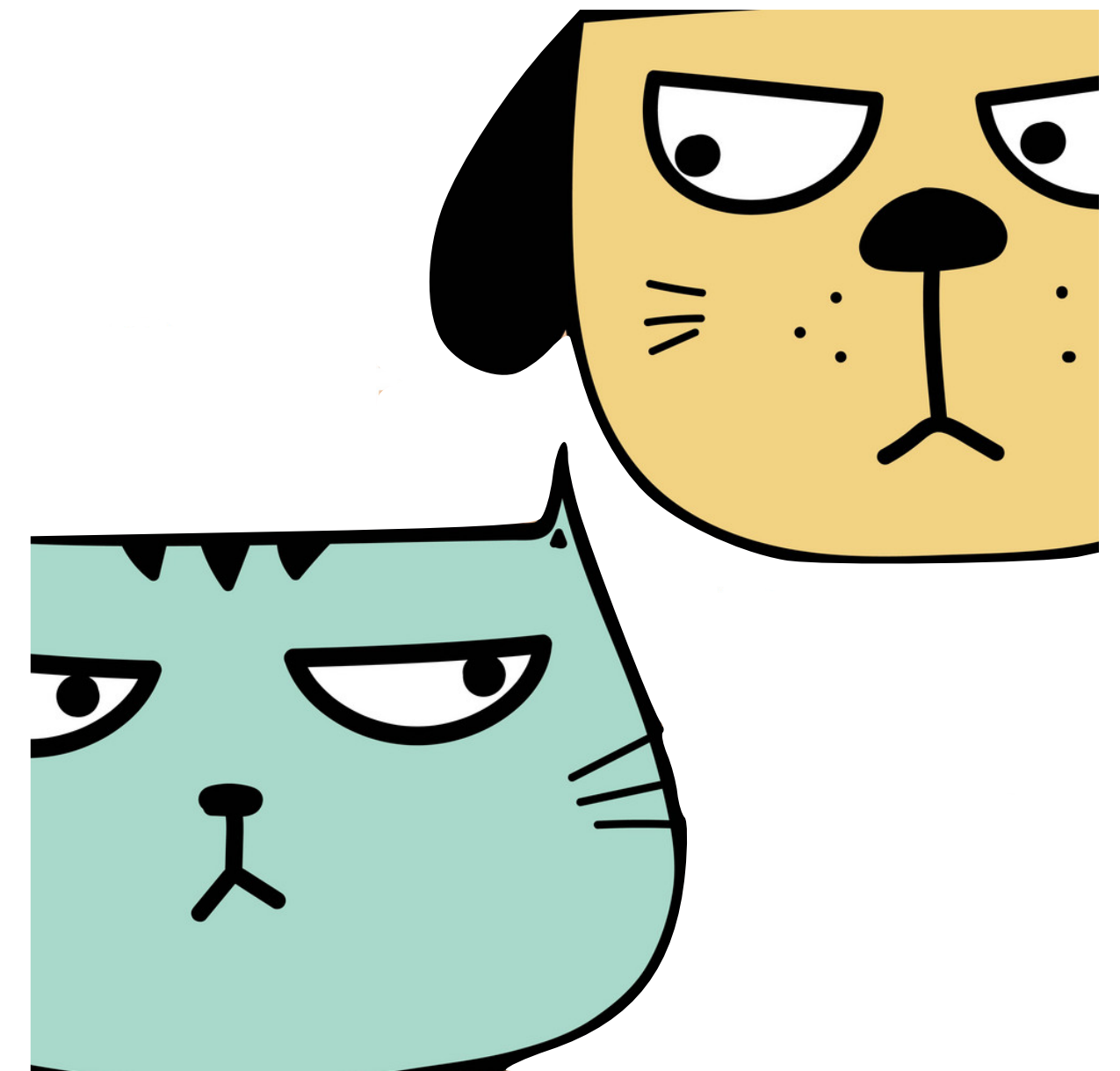
$y \in \{0,1\}$

$(x, y) \sim P(x, y)$  (independently and identically)

$\{(x_i, y_i)\}_{i=1}^N$  - a set of  $N$  training examples

$h$  - classifier, i.e. a function that maps from images to classes

**Learning goal:** find an  $h$  that correctly predicts the class  $y = h(x)$  of new images  $x$



# The classical supervised learning problem for sequences



$x$  - a telephone call  
 $y$  - a class of a call  
 $y \in \{0,1\}$



$x$  - a part-of-speech  
 $y$  - a tag of a part-of-speech  
(noun, verb, adjective, etc.)  
 $y \in \{0,1,...,N\}$



$x$  - a tweet  
 $y$  - a class of a tweet  
 $y \in \{0,1\}$

***Not drawn independently and  
identically (iid) from some joint  
distribution***

Sequences exhibit significant  
sequential correlation

# The sequential supervised learning problem

$\{(x_i, y_i)\}_{i=1}^N$  - a set of  $N$  training examples

$(x_i, y_i)$  - pair of sequences

$x_i = \langle x_{i,1}, x_{i,2}, \dots, x_{i,T_i} \rangle$

$y_i = \langle y_{i,1}, y_{i,2}, \dots, y_{i,T_i} \rangle$

**Learning goal:** find an  $h$  that correctly predicts the class  $y = h(x)$  of new sequence  $x$



$x_i = \langle \text{you will learn sequence modelling} \rangle$

$y_i = \langle \text{pronoun verb verb noun noun} \rangle$

# Time series models

# How to predict the position of a ball at time $(T + 1)$ ?



$T - 2$



$T - 1$



$T$



Sequential data is  
essential for some  
prediction problems

# For credit scoring usage of sequential data leads to better models

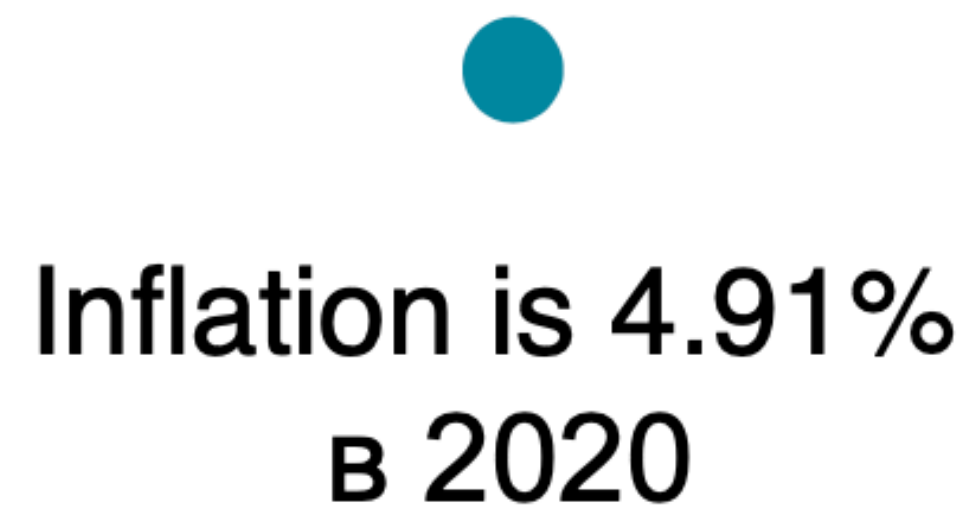
	Number of input features (↓)	GINI (↑)	
Logistic regression	400	0.56	Classic methods
Gradient boosting	7000	0.62	
<b>NNs for time series</b>	<b>12</b>	<b>0.66</b>	

Time series models - the right choice

high model quality

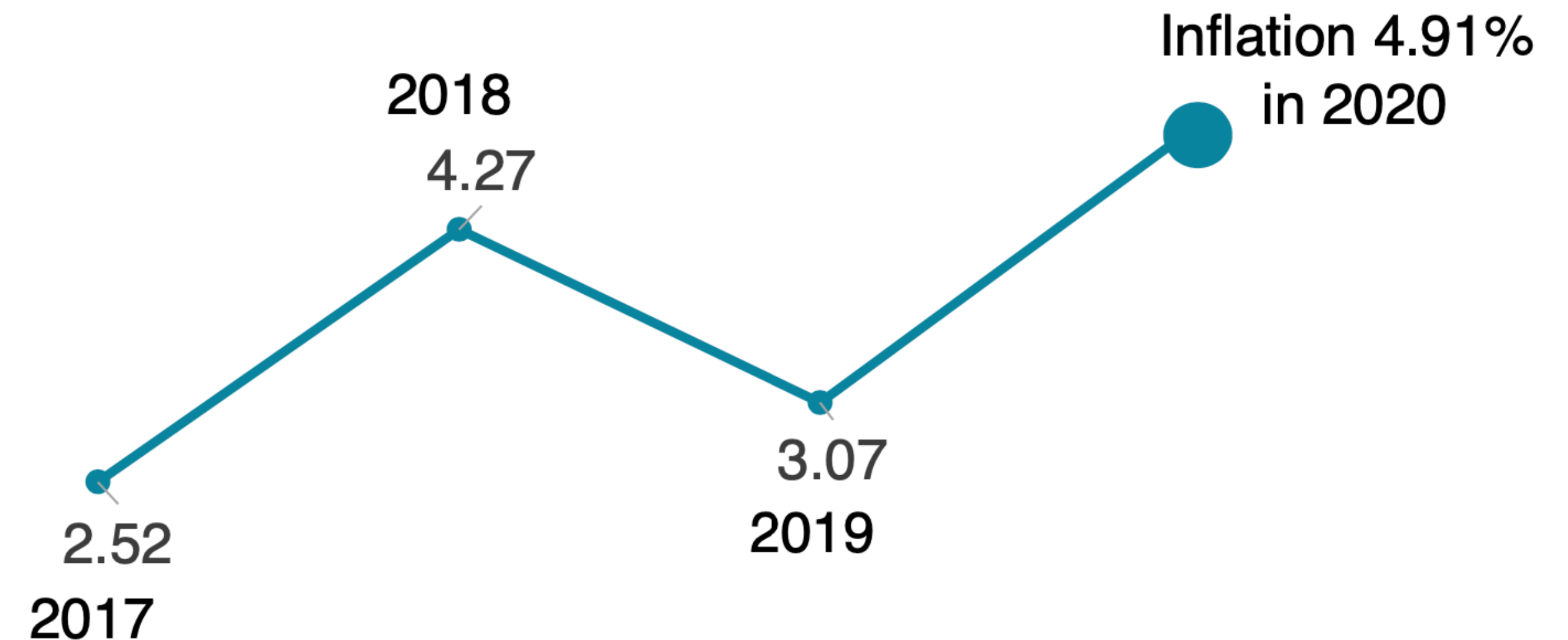
little feature engineering

# One point-based analytics 🙄



Hard to judge, if everything is good or bad

# Sequential data-based analytics 👍



Changes with time is a correct way to look at data and make decisions



# Basic Objectives of the Time Series (TS) Modelling



To describe the important features of the time series pattern

To forecast future values of the series

To explain how the past affects the future or how two TS can “interact”