

# Uvod v strojno učenje

Jure Žabkar

[jure.zabkar@fri.uni-lj.si](mailto:jure.zabkar@fri.uni-lj.si)



**A.I. LAB**  
*Ljubljana*

# Predavanja

Torek, 17:00 Skype (oz. predavalnica P3, če/ko bo možno v živo)

April  
14

April  
21

April  
28

Maj  
5

Maj  
12

Maj  
19

Maj  
26

# Consultations

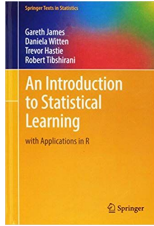
AI Lab @ FRI, R3.54

Please send an email including:

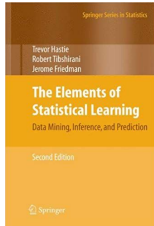
- the topic you would like to discuss
- your time constraints

to *jure.zabkar@fri.uni-lj.si*

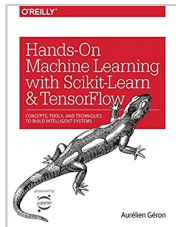
# Literatura



James, G., Witten, D., Hastie, T., & Tibshirani, R. (2013). ***An introduction to statistical learning*** (Vol. 6). NY: Springer.



Friedman, J., Hastie, T., & Tibshirani, R. (2009). ***The Elements of Statistical Learning: Data Mining, Inference, and Prediction***. Springer Series in Statistics.



Geron, A. (2017). ***Hands-on machine learning with Scikit-Learn and TensorFlow***. O'Reilly.

# Ocenjevanje

2 domači nalogi (2 x 15%)

Projekt (70%):

- Tema po izbiri
- Oddaja predloga na spletni učilnici
- Ustni zagovor

# Podatkovne zbirke

[UC Irvine Machine Learning Repository](#)

[Kaggle datasets](#)

[Amazon's AWS datasets](#)

<http://dataportals.org/>

<http://opendatamonitor.eu/>

<http://quandl.com/>

# Strojno učenje

*(angl. Machine Learning)*







# ParkinsonCheck™

- A smartphone app for (early) detection of motoric signs of Parkinson's disease and some other tremors
- Freely available in Slovenia
- A built-in expert system enables users to use it in their home environment
- Fully standalone, no need to communicate with an outside server or sensor
- Based on spirometry, but enhanced with other sensors, e.g. accelerometry

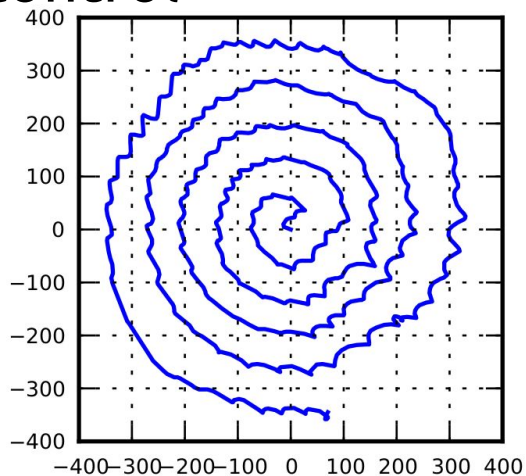


<http://www.parkinsoncheck.net/>

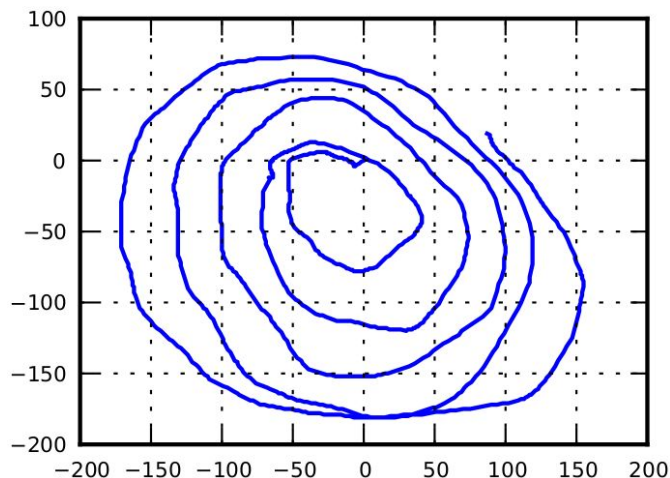
# Early detection, Patient monitoring



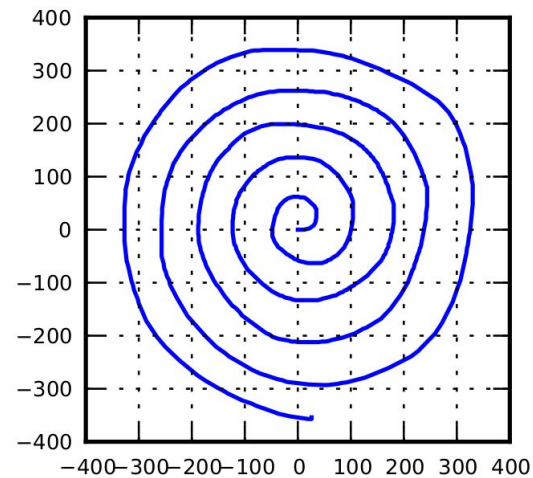
Essential tremor  
control

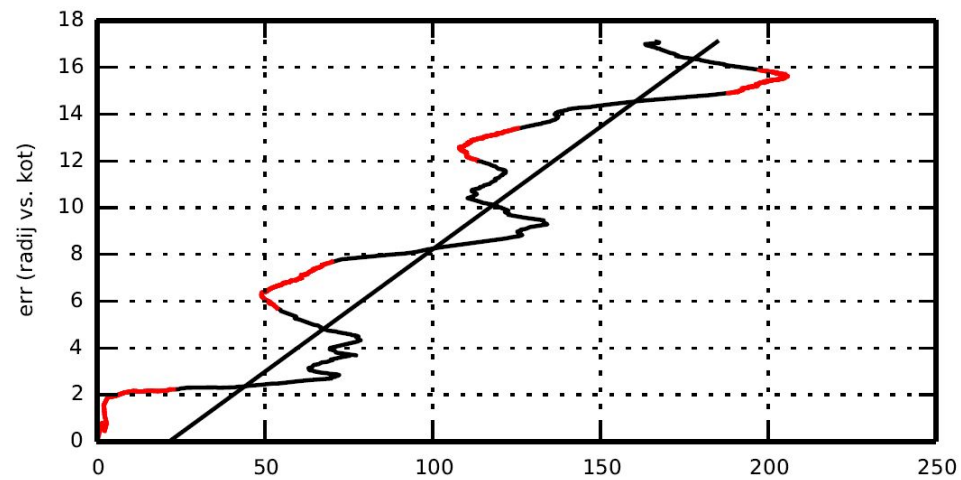
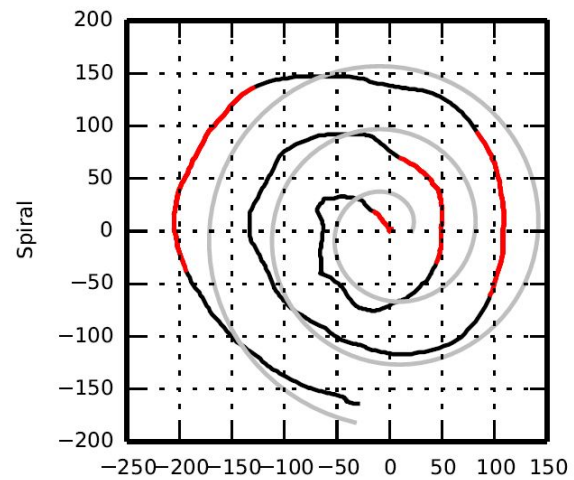


Parkinsonian tremor



Healthy



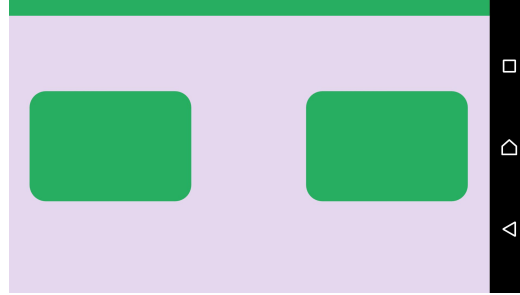


The coefficients of the logistic regression with pre-discretization of attributes. Ten most influential attributes (by beta value) are given.

Attribute	Importance	General description
radSp.avgP.min	1.13	radial speed variability
tangSp.avgP.min	1.02	tangential speed variability
absSp.avgP.min	0.78	absolute speed variability
plrErrComCnt.avg	0.70	level of curvature/smoothness of the spiral
radSp.percNeg005.min	0.69	percentage of time the patient drew towards the centre
plrErrComCnt.max	0.67	level of curvature/smoothness of the spiral
plrErrFit.avg	0.65	general misfit from the ideal spiral (template)
tangSp.avgP.rng	0.65	tangential speed variability
tangSp.avgP.max	0.63	tangential speed variability
rot.avgP.min	0.62	number of times the spiral crosses itself

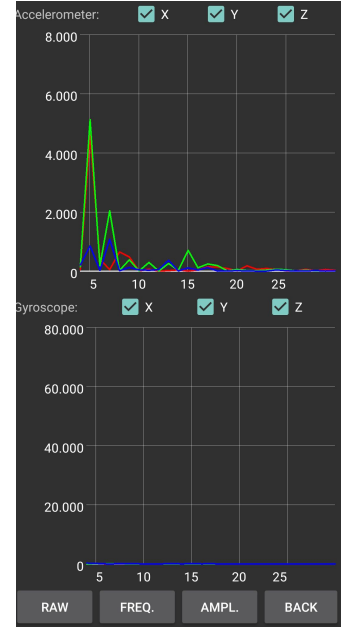
# Digitizing UPDRS

Tapping test



Accelerometry

Finger tapping



QUIERO

# H2020 project QUIERO (motivation)

- >30 million MRI scans per year in EURAMET countries,
- one of the most important tomographic tools adopted in clinical practice,
- MRI scan results interpreted by visual inspection,
- limited objectivity and comparability

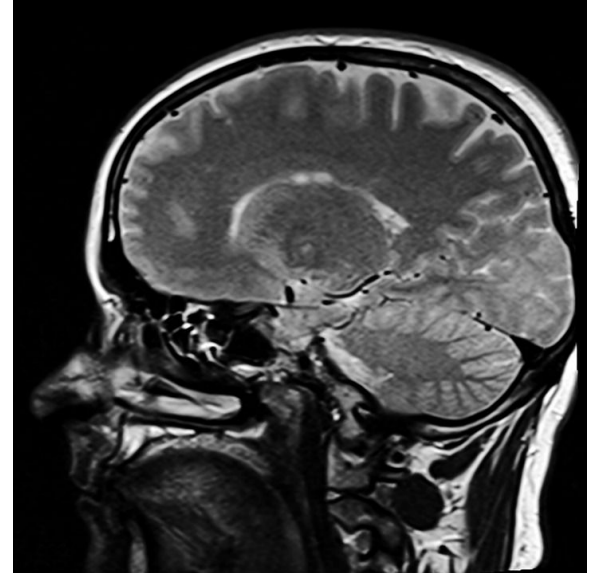


# QUIERO (aim)

To provide a full metrological  
characterization of Electric


Properties Tomography (EPT) &  
Magnetic Resonance Fingerprinting (MRF)

to underpin their use in clinical practice.



# Dislex.AI, Screening for Dyslexia




Projekt ŠIPK





Aplikacija za odkrivanje disleksije  
s pomočjo naprave za sledenje  
pogledu

STAROST

SPOL

   Drugo

ODLOČBA

Začni ?

Javni sklad Republike Slovenije, razpisna shema št. 100/2021, razpisna shema št. 100/2021, razpisna shema št. 100/2021

University of Ljubljana  
Faculty of Computer and  
Information Science

EVROPSKA UNIJA  
EVROPSKI SKLAD  
NALOŽBA V VAŠO PRIHODNOST

# Screening for Dyslexia

AIM:

To develop a set of digital tests for assessing dyslexia in primary school children.

Medvedek Medo se je nekega jutra prebudil in zaupano vstal iz postelje. Najprej si je umil zobe, nato obraz, šele potem pa se je preoblekel iz pižame v svoja dnevna oblačila. Odklenil je vrata in odšel iz svojega stanovanja.

## Dyslectic

vs.

## non-dyslectic

Medvedek Medo je sedel v svoj bleščeče rdeč  
avtomobil in se odpeljal skozi velik zelen park do  
mesta, ki je bilo sivo in je imelo visoke stolpnice.  
Skozi mesto se je pripeljal do dolge podezelske poti  
in nadaljeval vožnjo vse do majhnega jezera, ki je  
bilo obraščeno z visokimi smrekami.

Medvedek Medo je sedel v svoj bleščeče rdeč  
avtomobil in se odpeljal skozi velik zelen park do  
mesta, ki je bilo sivo in je imelo visoke stolpnice.  
Skozi mesto se je pripeljal do dolge podezelske poti  
in nadaljeval vožnjo vse do majhnega jezera, ki je  
bilo obraščeno z visokimi smrekami.

# Priporočilni sistemi



# Prilagajanje uporabniku



# Prepoznavanje obraza



# Prepoznavanje govora



amazon alexa



# Robotika



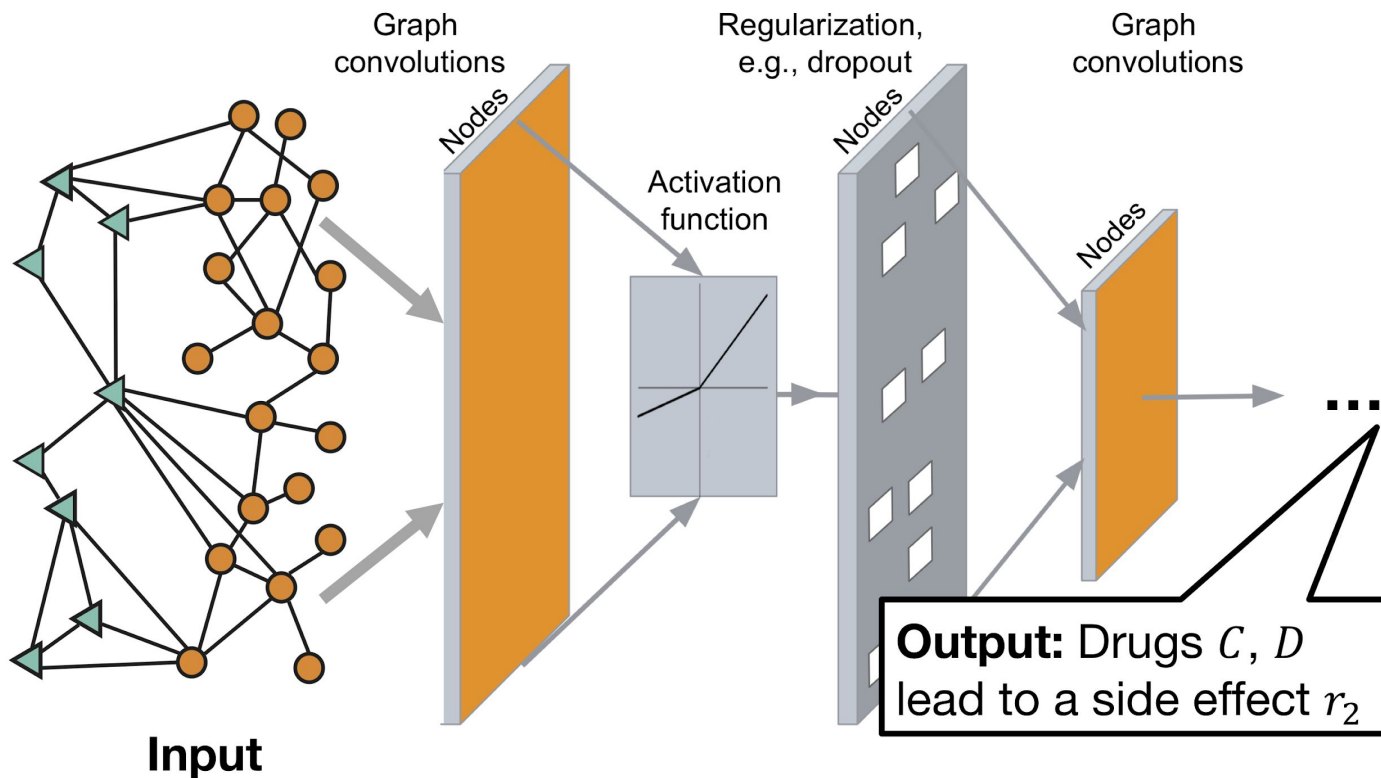


BostonDynamics

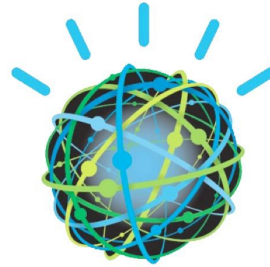




# Odkrivanje zdravil



# Igre, delnice



**IBM WATSON**



# Orodja

Orange



Scikit-learn



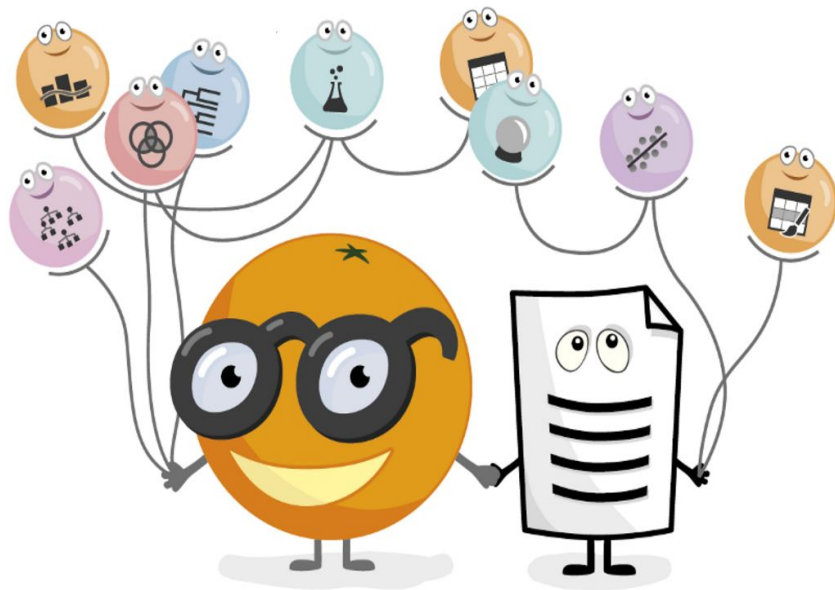
[Screenshots](#)[Download](#)[Docs](#)[Blog](#)

# Data Mining Fruitful and Fun

Open source machine learning and data visualization for novice and expert. Interactive data analysis workflows with a large toolbox.

[Download Orange](#)

The **old version**, Orange 2.7, is still available.







Scatter Plot

Axis Data

Axis x:

Axis y:

☒ Score Plots

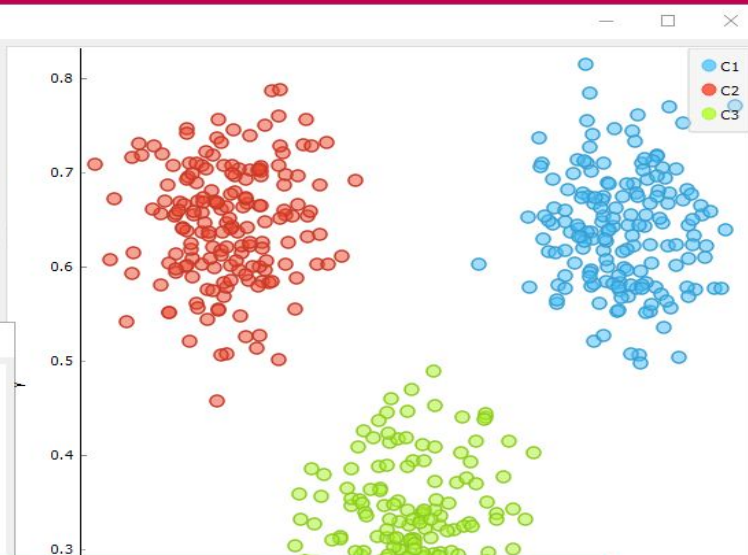
Jittering:

☐ Jitter continuous values

Points

Color:

Label:



Paint Data

Names

Variable X:

Variable Y:

Labels

☒ C1

Tools

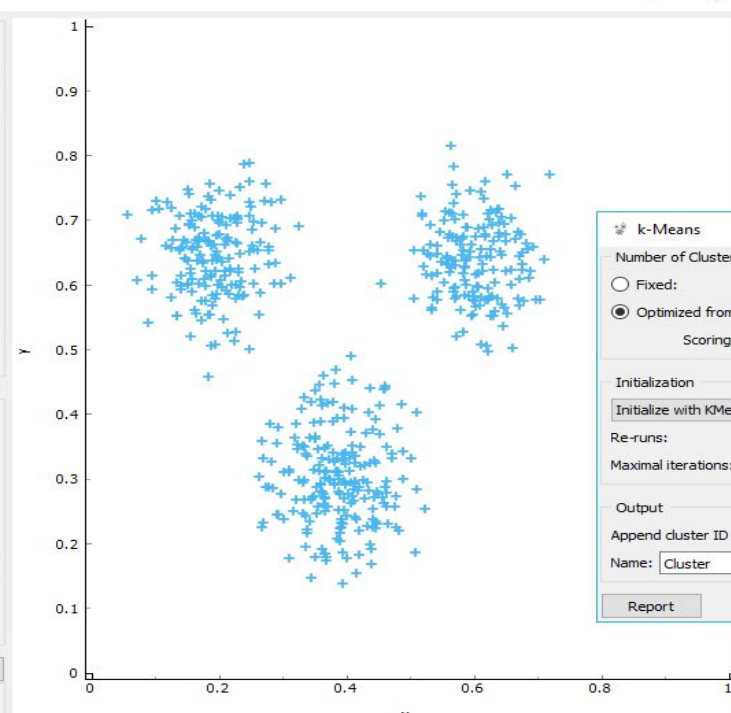
☒ Brush ☐ Put ☐ Select

☐ Jitter ☐ Magnet ☐ Clear

Radius:

Intensity:

☒



k-Means

Number of Clusters

☐ Fixed:

☒ Optimized from  to

Scoring:

Initialization

Re-runs:

Maximal iterations:

Output

Append cluster ID as:

Name:

☒

Scoring (bigger is better)

k	Score
2	0.49
3	0.72
4	0.57
5	0.46
6	0.35
7	0.34
8	0.34



Kaj je strojno učenje?

## Klasično programiranje



## Klasično programiranje



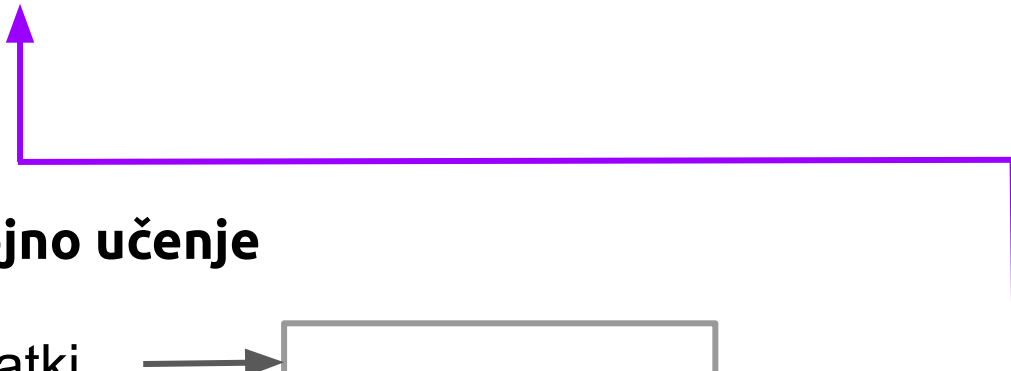
## Strojno učenje



## Klasično programiranje



## Strojno učenje



"Field of study that gives computers the ability to learn without being explicitly programmed"

- Arthur Samuel, 1959

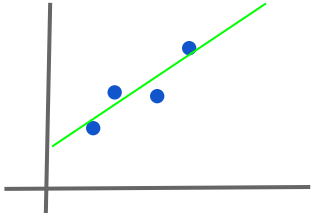
# Strojno učenje

**Nadzorovano**

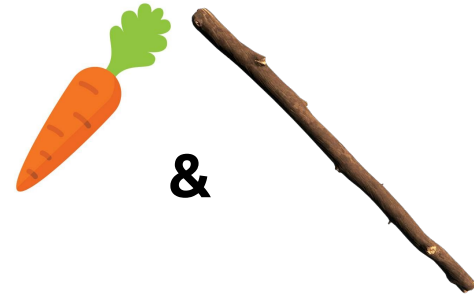
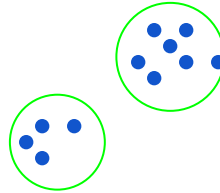
**Nenadzorovano**

**Spodbujevalno  
učenje**

Regresija, Klasifikacija



Gručenje, povezovalna pravila



# Regresija



# Klasifikacija





# Predstavitev značilk

Značilke nikoli popolnoma ne opišejo domene.

“All models are wrong, but some are useful.” - George Box

# Predstavitev značilk

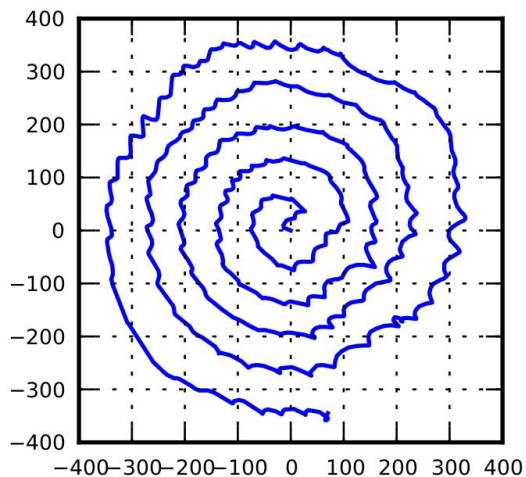
- Vektorji značilk predstavljajo učne primere.
- Na podlagi katerih značilk bi lahko napovedovali uspešnost študentov pri "Uvodu v strojno učenje" na začetku semestra?
- Npr. "povp. ocena že opravljenih izpitov", "znanje programiranja", ... se zdita smiselni značilki?

# Predstavitev značilk

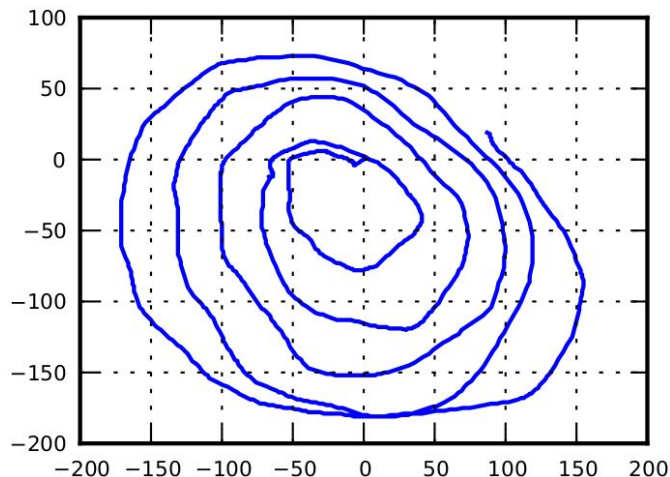
- Kaj pa "mesec rojstva" ali "barva oči"?
- Pretirano prileganje podatkom ali ...
- ... napačna interpretacija
- "some features matter, others don't":

zakaj ne vržemo kar vseh noter in vidimo, kaj pade ven?

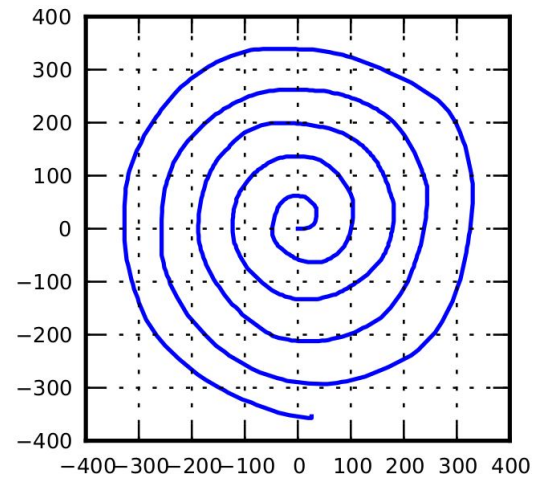
# Esencialni tremor

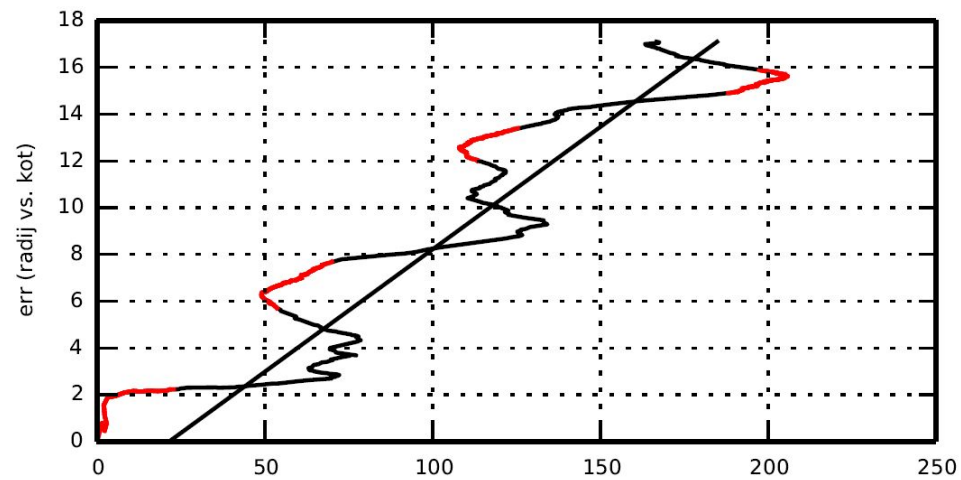
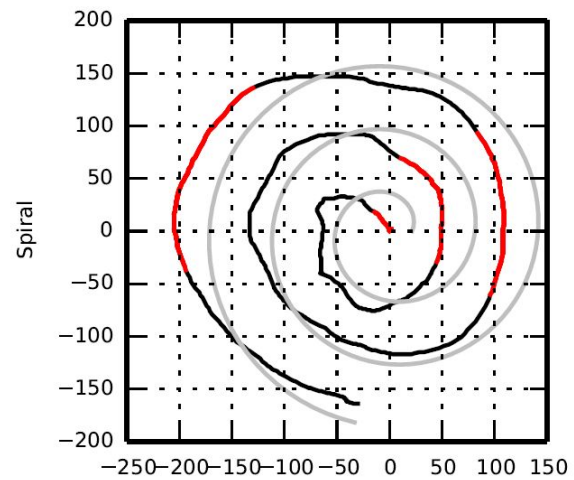


# Parkinsonski tremor



# Zdrava kontrola





Attribute	Importance	General description
radSp.avgP.min	1.13	radial speed variability
tangSp.avgP.min	1.02	tangential speed variability
absSp.avgP.min	0.78	absolute speed variability
plrErrComCnt.avg	0.70	level of curvature/smoothness of the spiral
radSp.percNeg005.min	0.69	percentage of time the patient drew towards the centre
plrErrComCnt.max	0.67	level of curvature/smoothness of the spiral
plrErrFit.avg	0.65	general misfit from the ideal spiral (template)
tangSp.avgP.rng	0.65	tangential speed variability
tangSp.avgP.max	0.63	tangential speed variability
rot.avgP.min	0.62	number of times the spiral crosses itself

# Problemi

- kako preprečiti pretirano prilagajanje?
- kako ocenjevati model?
- kako izbrati najboljše značilke?