



# Pattern Recognition

Exercise Session 9

Last Group Project(s)

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- Don't forget to sign up for the exam until 14. May 2021 through the Academia platform
- Written, in-person exam: 21.06.2021 at 10:00 - 11:00h (Joseph Deiss lecture hall)
- If you are unable to attend the in-person exam because of medical reasons, travel restrictions, etc. send an email to Prof. Fischer ASAP!

# Task 3 – Keyword Spotting

Deadline: **Today (end of day)!**

If you made a new GitHub repor, please send me the link to it / add me (LindaSt).

# Last Group Projects

Deadline: **Sunday, May 30<sup>th</sup>, 2021, end of the day**

## Task 4: Signature Verification

Can be solved with DTW

## Task 5: Molecules

Use approximate Graph Edit Distance

You need to solve only one,  
but you can solve both!

# Final Report

Please, create the final group report until **Sunday, May 30<sup>th</sup>, 2021**

It should be between 2-4 pages (A4)

The report should describe the “lessons learned”

You should describe:

- How you organized your group
- What worked, what did not work
- For each task:
  - What is special about your solution
  - What was your approach
  - What worked, what did not work
- General thoughts about the group exercise

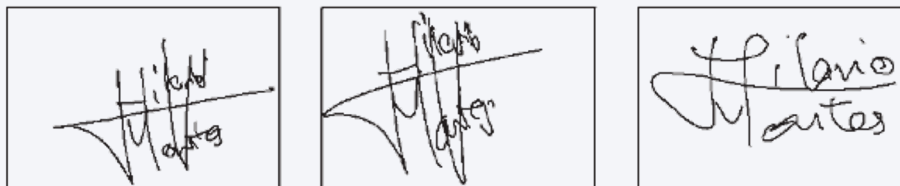
# Task 4: Signature Verification

30 writers (listed in `users.txt`)

Enrollment: 5 genuine signatures each

Verification: 45 signatures each (20 genuine, 25 forgeries)

Ground truth in `gt.txt`



## Task

Compute dissimilarity for each verification signature with the 5 genuine ones

# Task 4: Signature Verification

## Input

t x y pressure penup azimuth inclination  
Penup 1 if change between pen-up and pen-down  
Azimuth / inclination angles of the pen

## Recommendation: **DTW**

Features:  $x$ ,  $y$ ,  $v_x$ ,  $v_y$ , pressure  
 $v_x$ ,  $v_y$  velocity in  $x$  and  $y$  with respect to  $\Delta t$   
Normalize for each signature individually  
Sakoe-Chiba band can be helpful

Evaluation: mean average-precision

# Task 4: Signature Verification

Further info about the database (MCYT):

See [ortega03mcyt.pdf](#) on ILIAS → Section 4 (there are also images of signatures)



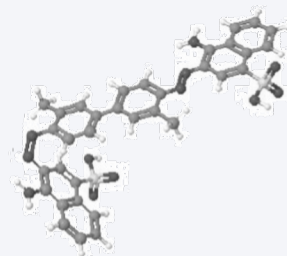
# Task 5: Molecules

AIDS Antiviral Screen Database of Active Compounds

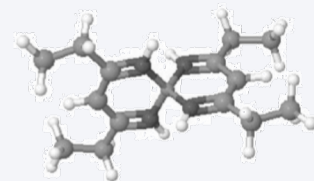
250 training, 250 validation molecules

Two classes active 'a' and inactive 'i'

Annotated in `train.txt` and `valid.txt`



(a) Active



(b) Inactive

## Task

Classify the molecules of the validation set using kNN

Distance: approximate Graph Edit Distance (GED)

# Input: Graph xml (gxl files)

## XMLs with a lot of information

→ Only use the chemical `symbol` node label and the unlabeled, undirected edges:

```
<node id="_1"><attr name="symbol"><string>C</string></attr>
```

```
...
```

```
<edge from="_1" to="_2">
```

```
...
```

## Further info about the database (AIDS):

See `riesen08graphdb.pdf` → section 2.8 (there are also images of molecules)

Hint: there are python libraries to parse XML files

# Task 5: Molecules

Compute approximate GED between pairs of molecules with  
**bipartite graph matching**

(lecture 10, slide 21)

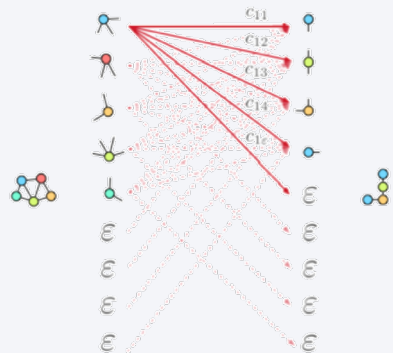
Build cost matrix (*Dirac*)

$$C = \left[ \begin{array}{cccc|cccc} c_{11} & c_{12} & \dots & c_{1m} & c_{1e} & \infty & \dots & \infty \\ c_{21} & c_{22} & \dots & c_{2m} & \infty & c_{2e} & \dots & \vdots \\ \vdots & \vdots & \ddots & \vdots & \vdots & \vdots & \ddots & \infty \\ c_{n1} & c_{n2} & \dots & c_{nm} & \infty & \dots & \infty & c_{ne} \\ \hline c_{e1} & \infty & \dots & \infty & 0 & 0 & \dots & 0 \\ \infty & c_{e2} & \dots & \vdots & 0 & 0 & \dots & \vdots \\ \vdots & \vdots & \ddots & \infty & \vdots & \vdots & \ddots & 0 \\ \infty & \dots & \infty & c_{em} & 0 & \dots & 0 & 0 \end{array} \right]$$

Hungarian Algorithm

To find optimal assignment

Derive edit path costs from the result  
(distance for classification)



kNN for classification (optimize for k)

# Task 5: Molecules

## Recommendation

Use *Dirac* cost function for GED (optimize  $C_n$  and  $C_e$ )  
(lecture 9, slide 36)

Node substitution:  $2 * C_n$  if symbols  $\neq$ , 0 otherwise

Node deletion/insertion:  $C_n$

Edge deletion/insertion:  $C_e$

Use an existing framework for the Hungarian algorithm



# Questions?