

UNIVERSITÄT BERN

### TA Session 1

#### **Anthony Gillioz**

Institute of Computer Science - University of Bern, Switzerland

Contact: anthony.gillioz@unibe.ch

Task 1

## $u^{t}$



## Theoretical Tasks

 Summarize the advantages and drawbacks of graph based pattern representation when compared with vectorial approaches.

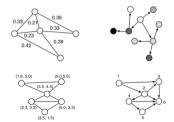
- You have to write a two-column table.
- The first column should contain at least two advantages, while the second column should contain at least two disadvantages.



### **Theoretical Tasks**

### Task 2

Regard the following fours graphs and decide for each of them which special graph type it represents the best.



 Use Fig. 1.9 (in the lecture notes) to find which graph type (labeled, unlabeled, directed, ...) corresponds to or would suit the most the following graphs.

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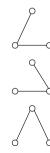
### **Theoretical Tasks**

### Task 3

- 3. (a) Suppose N(n, k) is the number of non-isomorphic graphs with n nodes and k edges. Find N(4,3).
  - (b) Define and sketch the set of distinct (i.e., non-isomorphic) unlabeled graphs of size 4. Additionally, find the total number of non-isomorphic graphs of size 4.

#### Example with n=3 and k=2

$$N(3,2)=1$$



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#### **Theoretical Tasks**

### Task 4







4. Determine whether the three unlabeled graphs g<sub>1</sub>, g<sub>2</sub> and g<sub>3</sub> given in the figure above are isomorphic. Formally, for any isomorphic graph pair g<sub>i</sub>, g<sub>j</sub> explicitly determine the isomorphism f: V<sub>i</sub> → V<sub>i</sub>.

- A 3 × 3 matrix with 1 in the entry if two graphs are isomorphic 0 otherwise.
- example of explicit isomorphism

$$f(v_1) = w_3$$

$$f(v_2)=w_5$$

. . .

$$f(v_6) = \dots$$

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### Theoretical Tasks

### Task 5

Compute the association graph on the following two labeled graphs and find the maximum clique in it (different shades of gray represent different node labels).





- Each color is a label.
- Define an ID for each node.
- Use Def. 14 (in the lecture notes) to create the association graph.
- Hint: Don't forget that the edge structure is still maintained if there is no edge from  $u_1$  to  $v_1$  in  $g_1$  and no edge from  $u_2$  to  $v_2$  in  $g_2$ . Thus there is an edge between  $(u_1,u_2)$  and  $(v_1,v_2)$  in the association graph.

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### **Theoretical Tasks**

#### Task 6

- 6. You will find the following four scientific papers on ILIAS.
  - (a) Shortest-path kernels on graphs
  - (b) Graph Similarity Features for HMM-Based Handwriting Recognition in Historical Documents
  - (c) Malware Classification based on Call Graph Clustering
  - (d) A Graph Matching Based Approach to Fingerprint Classification Using Directional Variance

For each paper briefly describe how the underlying patterns/objects are actually represented as a graph  $g=(V,E,\mu,\nu)$ . In particular, elaborate on the semantic of both nodes and edges as well as the corresponding labeling functions.

- You do not need to read the complete paper
- Find the relevant parts, where the authors describe the graph extraction and/or graph representation
- A suitable way to present your submission could be in the form of a table or a similar format.

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### Implementation Tasks

In this implementation task, the goal is to implement Ullman's subgraph isomorphism test presented in the lecture notes (Alg. 2).

#### Remarks:

 You have the option to either implement Ullman's algorithm as presented in the lecture notes or the version presented on this page<sup>1</sup> for this exercise.

<sup>&</sup>lt;sup>1</sup> https://adriann.github.io/Ullman%20subgraph%20isomorphism.html



### Implementation Tasks

#### Where to code

#### Remarks

- The entire code must be contained within the file PR\_lecture/Exercise\_1/ex1.py
- You are allowed to modify the code as much as you want, including changing function signatures, creating new functions or classes, and so on.

```
if __name__ == '__main__':
    # 1. Load the graphs in the './graphs' folder

# 1.5 (You can visualize the graphs using utils.draw_all_graphs())

# 2. Perform the Ullman's subgraph isomorphic test between all pairs of graphs.
pass
```



# Implementation Tasks Idea of code structure

```
def Ullman(q1: nx.Graph, q2: nx.Graph) -> bool:
   Perform the subgraph isomorphism test between g1 and g2
       q1: A networkx graph object
       True if q1 is a subgraph of q2 and False otherwise
   # Code here
```

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# Implementation Tasks Idea of code structure

```
# You can potentially add more code here (constants, functions, ...)

def _ullman_recursive(...) -> bool:
    """
    Recursive part of the Ullman's algorithm

Returns:
    True if g1 is a subgraph of g2 and False otherwise
    """

# Code here
    return False
```



### Final remarks

• The file you upload on ILIAS as a .zip should be formatted in the following way: exercise\_1\_firstname\_lastname.zip.