#### **Data Mining 1** Introduction to the Student Projects





#### Outline



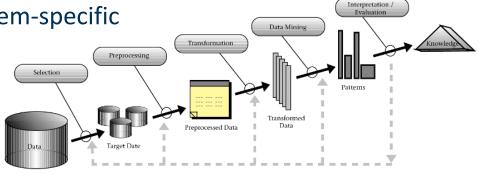
- 1. Requirements for Student Projects
- 2. Requirements for Project Reports
- 3. Final Exam

#### **Student Projects**



#### • Goals

- Gain practical experience with the complete data mining process
- Get to know additional problem-specific
  - preprocessing methods
  - data mining methods



#### Expectation

- Select an interesting data mining problem of your choice
- Solve the problem using
  - the data mining methods that we have learned so far plus some advanced problem-specific data pre-processing
  - other data mining methods which might be helpful for solving the problem and build on what we learned in class

#### Procedure



#### • Teams of five to six students

- realize a data mining project
- write a 12 page summary of the project and the methods employed in the project
- present the project results to the other students (10 minutes presentation + 3 minutes discussion)
- Final mark for the course
  - 20 % written summary about the project
  - 5 % project presentation
  - 75 % written exam





Week	Wednesday	Thursday				
03.10.2022	Kick Off Team Project					
10.10.2022	Lecture: Regression	Exercise: Regression				
Monday, October 10th, 2022, 23:59: Submission of Project Proposals						
17.10.2022	Lecture: Text Mining	Exercise: Text Mining				
24.10.2022	Lecture: Association Analysis	Exercise: Association Analysis				
31.10.2022	Project feedback	Project Work				
07.11.2022	Project feedback	Project Work				
14.11.2022	Project feedback	Project Work				
21.11.2022	Project feedback	Project Work				
28.11.2022	Project feedback	Project Work				
05.12.20212	Presentation of project results	Presentation of project results				
Friday, December 9th, 2022, 23:59: Submission of Project Report						

## Where to find interesting Data Sets?



- Public sector data
  - US government: <u>https://www.data.gov</u>
  - UK government: <u>https://data.gov.uk</u>
  - EU: https://www.europeandataportal.eu
  - CIA World Fact Book: <u>https://www.cia.gov/library/publications/the-world-factbook/</u>
  - Health data (over 125 years): <u>https://www.healthdata.gov/</u>

#### • Data registries

- Datasets hosted on Amazon AWS <u>https://registry.opendata.aws</u>
- Million Song Dataset, 1000 Genome Project, database of satellite imagery of Earth from NASA, Web Crawl
- Google's Dataset Search: <u>https://datasetsearch.research.google.com/</u>
- Microsoft Datasets: <u>https://msropendata.com/</u>
- Dataset collection on Github: <u>https://github.com/awesomedata/awesome-public-datasets</u>
- Data Hub: <u>http://datahub.io</u>
- Linked Open Data Cloud: <u>http://lod-cloud.net/</u>

## Where to find interesting Data Sets?



- Knowledge graphs
  - Wikidata: <u>https://www.wikidata.org</u>
  - BabelNet: <u>https://babelnet.org</u>
  - DBpedia: <u>http://wiki.dbpedia.org</u>
- Language resources
  - WordNet: <u>https://wordnet.princeton.edu</u>
  - EuroWordNet: <u>http://projects.illc.uva.nl/EuroWordNet/</u>
  - Project Gutenberg (36.000 ebooks): <u>http://www.gutenberg.org/</u>
  - New York Times (starts 1851): <u>http://developer.nytimes.com/docs</u>
  - Wikitionary: <u>https://www.wiktionary.org</u> as KG: <u>http://kaiko.getalp.org/about-dbnary/</u>

#### Competitions

- Kaggle: <u>https://www.kaggle.com/</u>
- Data Mining Cup: <u>http://www.data-mining-cup.de</u>
- KDD Cup: <u>https://www.kdd.org/kdd-cup</u>
- DrivenData: <u>https://www.drivendata.org</u>
- CrowdAnalytix: <u>https://www.crowdanalytix.com</u>

## Where to find interesting Data Sets?

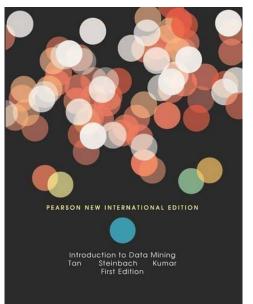


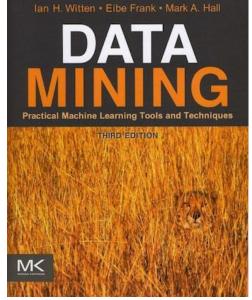
- Covid19
  - Johns Hopkins University <u>https://github.com/CSSEGISandData/COVID-19</u>
  - Our world in data: <u>https://github.com/owid/covid-19-data</u>
  - ECDC <u>https://www.ecdc.europa.eu/en/covid-19/data</u>
  - Harvard: <u>https://dataverse.harvard.edu/dataverse/covid19</u>

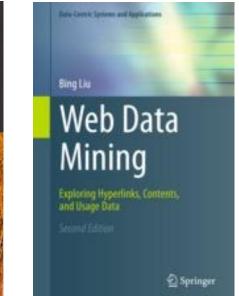
# Where to find Information about additional Methods?



- Pang-Ning Tan, Michael Steinback, Vipin Kumar: Introduction to Data Mining, Pearson / Addison Wesley.
- Ian H. Witten, Eibe Frank, Mark A. Hall: Data Mining: Practical Machine Learning Tools and Techniques, 3rd Edition, Morgan Kaufmann.
- Bing Liu: Web Data Mining, 2nd Edition, Springer.







# Where to find Information about additional Methods?



- Check out the solutions to your problem that other people have tried.
  - for instance by looking at submissions of the KDD Cup or Data Mining Cup as well as Kaggle
  - or search for relevant scientific papers using
    - <u>https://scholar.google.com</u>



<u>https://paperswithcode.com/datasets</u>

[IIII] Search (	Browse State-o	f-the-Art Datasets	Methods	More v	9 de	
		Datas	ets			
	🛕 SI	hare your dataset with	the ML commu	nity!		
Search for datasets Q	6924 datas	set results				
Best match •		CIFAR-10 The CIFAR-10 dataset (Canadian Institute for Advanced Research, 10 classes) is a subset of the Tiny Images dataset and consists of 60000 32x32 color images. The 9,563 INVERT-59 REFORMANCE ImageNet The ImageNet dataset contains 14,197,122 annotated images according to the WordNet hierarchy. Since 2010 the dataset is used in the ImageNet Large Scale 9,111 INVERS - 89 EDICIMANCE COCO (Microsoft Common Objects in Context) The MS COCO (Microsoft Common Objects in Context) dataset is a large-scale object detection, segmentation, key-point detection, and captioning dataset. The 6,354 INVERS - 78 EDICIMANCE				
Filter by Modality Images 2040						
Texts 1812   Videos 649   Audio 428   Medical 243						
Filter by Task			ST database (Modified National Institute of Standards and Technology ) is a large collection of handwritten digits. It has a training set of 60,000 s - 42 EDECIMARES			
Question 295		CIFAR-100				

he CIFAR-100 dataset (Canadian Institute for Advanced Research, 100 classes)

## Some Project Ideas (not binding)



- Web Log Mining
  - Learn a classifier for the categorizing the visitors of your website.
  - Which features matter? Number of pages visited, time on site, ...
  - Learn and evaluate classifier
- Wikipedia Contributors / Hoax Articles
  - Examine the edit history of Wikipedia contributors
  - Cluster users by different attributes (no of edits, edits/day, topic, ...)
  - Or learn a classifier for the categorizing Wikipedia contributors
- Sentiment Analysis for Discussion Forum / Rating Site / Tweets
  - Are people positive or negative about topic / product? (Bing Liu 11.x)
- SPAM Detection
  - eMail, blog or discussion forum (Bing Liu 6.10, 11.9)
  - you tube comments

# Some Projects realized in previous Semesters



- Twitter data
  - humor / hate speech detection
  - Sentiment Analysis of Tweets about Movies
    - Learned classifier from IMDB movie reviews
    - Applied and tested with tweets afterwards
- Airbnb (done very often)
  - predict the prices of new apartments
- Bundesliga Betting Rules
  - Find rules that help you to predict the outcome of a Bundesliga game
- last.fm Playlist Analysis
  - Cluster last.fm users according to the style of the songs they are listening to
  - Find commons sets of songs for the different clusters
- Analysis of Training Data of a Fitness Center
  - Find different customer groups by clustering exercise data
  - Find frequent combinations of exercises
- Classifying a Document's Perspective

#### **Project Outlines**



- maximum 4 pages including title page, using DWS master thesis layout (PDF!)
  - Include a project name and your team number/name on the first page!
- due Monday, October 10th, 2022, 23:59
- send by eMail to Alex, Nico & Sven
- answer the following questions:
- 1. What is the problem you are solving?
- 2. What data will you use?
  - Where will you get it?
  - How will you gather it?
- 3. How will you solve the problem?
  - What preprocessing steps will be required?
  - Which algorithms do you plan to use?
  - Be as specific as you can!
- 4. How will you measure success? (Evaluation method)
- 5. What do you expect your results to look like? (Model/Clusters/Patterns)

DWS | Data Mining 1 | Intro to Student Project

#### **Coaching Sessions**



- We will give you tips and answer questions concerning your project.
- Registration via email is mandatory!
  - mail to Alex, Nico & Sven
  - until Monday night (23:59)!
  - including the questions that you like to discuss
- We will assign you a time slot afterwards and inform you about the slot via email
- Every team has to attend at least one coaching session!

#### **Project Report**



- 12 pages (exactly!) including title/toc page and reference page
  - max. 10 pages, no appendix
  - Each extra page and each day of late submission downgrades your mark by 0.3!
- due Friday, December 9th, 2022, 23:59
- send by email to Alex, Nico & Sven

#### **Project Report**



- Outline for project report:
- 1. Application area and goals (Business Understanding)
- 2. Structure and size of the data set (minimum 1 page) (Data Understanding)
- 3. Preprocessing
- 4. Data Mining
  - (External Knowledge)
  - ML approaches
  - Evaluation
- 5. Results

## **Project Report**



- Requirements
- 1. You must use the DWS master thesis layout.
- Please cite sources properly. Preferred citation style [Author, year].
- 3. Also submit your Python scripts and (a subset) of your data.
- 4. Include your project name and your team name/number on the first page!



- Business Understanding:
  - What is the actual problem (in the domain)?
  - What is the target variable?
  - Clustering/Classification/Regression?
- Data Understanding:
  - Are examples sorted (time series)?
  - What is the distribution of labels / target variable?
  - Are all attributes and their types listed?
  - Are attributes explained?
  - What is the quality of the data?



- Preprocessing
  - Are missing values replaced (in case needed)?
  - Checked for outliers (and handled them)?
  - Validity tests of attributes (Height above sea level < 9000)?</p>
  - Check for inconsistencies (age=42, birthday=03/07/1997)
    - Check for duplicates
  - Data normalization
  - Additional features generated?
  - Has binning been tried out?
  - Correlation analysis implemented?
  - Feature subset selection implemented?
- External Knowledge:
  - Are additional datasets used?



- ML approaches
  - How many different ML approaches were tried out?
  - Do you have at least one symbolic and one non symbolic approach?
  - Do you have at least one baseline (majority class / mean value / domain specific ...)?
- Evaluation
  - Is there a train test split or 10 fold cross validation implemented
  - Is eval stratified?
  - Cost matrix or not?
  - Are the hyper parameters tuned (in which range / which attributes) ?
  - Are the tests systematic?
  - Analyse a symbolic model (how does the decision tree / rules /... looks like)
  - What features do have a high impact on the result?



- Result
  - Is the result <u>critically</u> evaluated
  - Is the result analyzed against the baseline
  - What does the result mean given the problem (could you use it)

#### **Deadly Errors to Avoid**



• Normalize numeric data before calculating any similarity metrics

- If your data is unbalanced
  - balance your training data
  - do NOT balance your test data
  - report P/R/F1, not accuracy

#### **Final Exam**



- Date: Monday, December 12th, 2022
- Duration: 60 minutes
- Structure: 5 6 open questions that
  - check whether you have understood the content of the lecture
  - require you to describe the ideas behind algorithms and methods
  - might require you to do some simple calculations