Basics of Machine Learning

20_KIN2 – Artificial Intelligence and Machine Learning

Lecture Contents

- Machine Learning & Learning
- Applications & Examples of ML
- Induction, Transduction, Deduction
- Supervised & Unsupervised Learning
- Experience

Terms

- Artificial Intelligence
- Machine Learning
- Optimization
- Simulation
- Modeling
- Robotics
- Data Science
- Data Mining
- Data Analytics
- Autonomous Decisions





Consequences

Apple Card algorithm sparks gender bias allegations against Goldman Sachs

Entrepreneur David Heinemeier Hansson says his credit limit was 20 times that of his wife, even though she has the higher credit score

By Taylor Telford

November 11, 2019 at 4:44 p.m. GMT+1

Twitter taught Microsoft's Al chatbot to be a racist asshole in less than a day

By James Vincent | Mar 24, 2016, 6:43am EDT Via The Guardian | Source TayandYou (Twitter)

AMS-Algorithmus: Forscher warnen vor Diskriminierung und bemängeln fehlende Transparenz

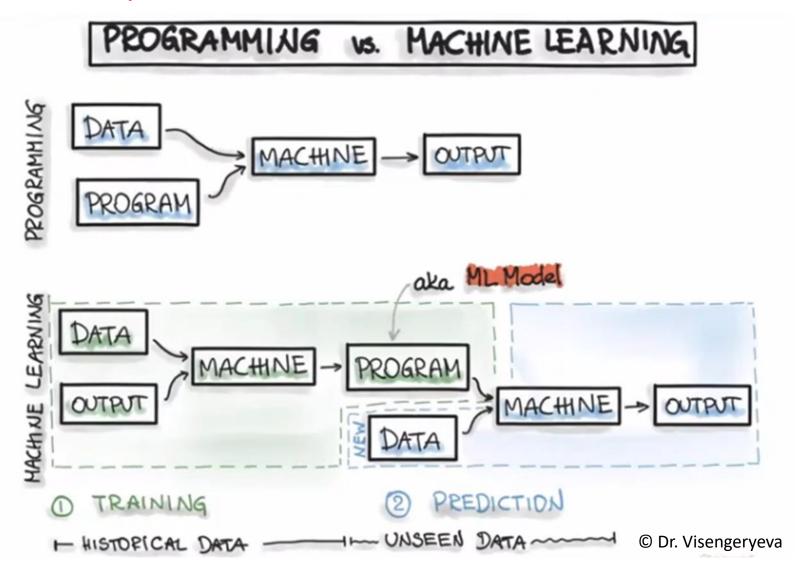
Im Juli dürfte der Algorithmus, mit dem das Arbeitsmarktservice Jobsuchende in drei Gruppen einteilt, in Echtbetrieb gehen. Einige Wissenschafter äußern Bedenken

András Szigetvari 25. Februar 2020, 06:00 512 Postings



<u>ProPublica</u>

https://www.youtube.com/watch?v=VYIXNWxqJ2A



Machine Learning





Number recognition

7

4

Prognosis

Input

Output



Machine Learning in Python



```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt

data = pd.read_csv("data.csv")
X = data.iloc[:, :-1]
y = data.iloc[:, -1]
```

```
from sklearn.linear model import LinearRegression
model = LinearRegression()
model.fit(X, y)
from sklearn.discriminant analysis import LinearDiscriminantAnalysis
model = LinearDiscriminantAnalysis(store covariance = True)
model.fit(X, y)
from sklearn.tree import DecisionTreeRegressor
model = DecisionTreeRegressor(max depth = 5)
model.fit(X, y)
from sklearn.ensemble import RandomForestClassifier
model = RandomForestClassifier(n estimators=100)
model.fit(X, y)
from sklearn.svm import SVR
model = SVR(kernel = "linear")
model.fit(X, y)
predictions = model.predict(X)
```

Machine Learning / Data Mining

"The field of machine learning is concerned with the question of how to construct computer programs that automatically improve with experience."

(Tom Mitchell, 1997)

"Data Mining is the non-trivial process of identifying valid, novel, potentially useful, and ultimately understandable patterns in data."

(Fayyad *et al*, 1996)

What is learning?

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"Learning is making useful changes in our minds."
(Marvin Minsky, 1985)
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"Learning is constructing or modifying representations of what is being experienced." (Ryszard Michalski, 1986)

"Learning means behaving better as a result of experience."

(Stuart Russel & Peter Norvig, 1985)

"Learning denotes changes in a system that are adaptive in the sense that they enable the system to do the same task or tasks drawn from the same population more efficiently next time."

(Herbert Simon, 1983)

Formalization of Learning

Supervised Learning

The system gets questions (Inputs) with correct answers (Outputs) with the goal that after the training the system can give correct answers to new questions.

Unsupervised Learning

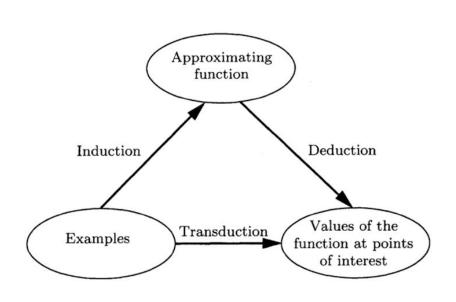
System has to identify the structure of data itself and identify patterns.

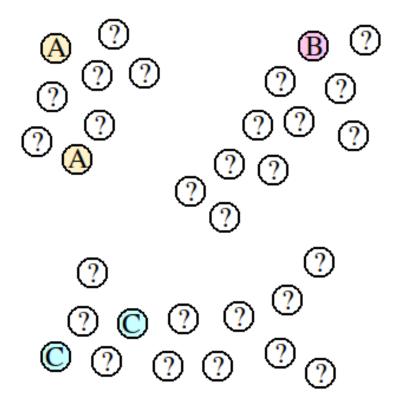
Reinforcement Learning

Control an agent by taking actions in an environment to maximize a specific reward.

Transduction

The process of directly drawing conclusions about new data from previous data, without constructing a model.

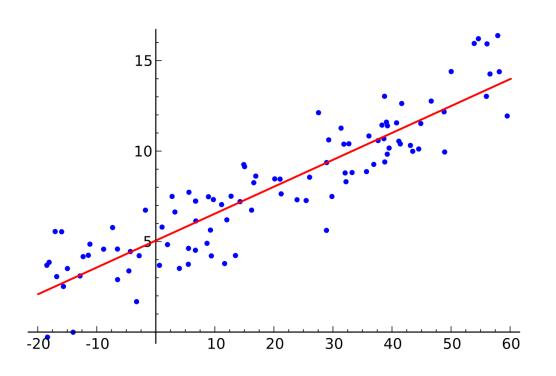


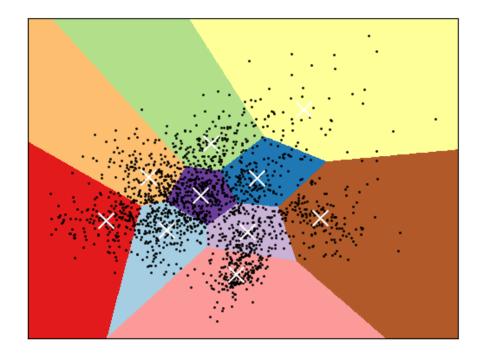


Induction

Induction = Inferring from specific cases to the general

Deduction = Applying knowledge to new cases





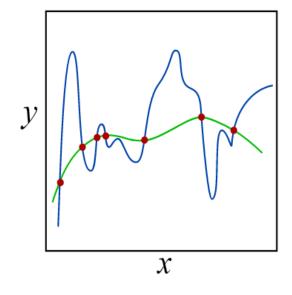
Supervised Learning

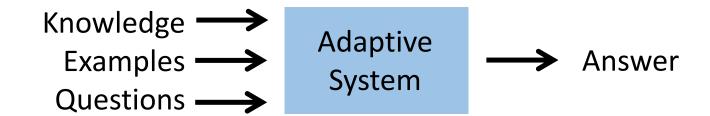
Given: A set of examples (x_i, y_i)

$$S = \{(x_1, y_1), (x_2, y_2), ..., (xn, yn)\} \subseteq x \times y$$

Transduction: Output y for input x_0 ??

Induction: Complete functionally relation $f: X \to Y$??

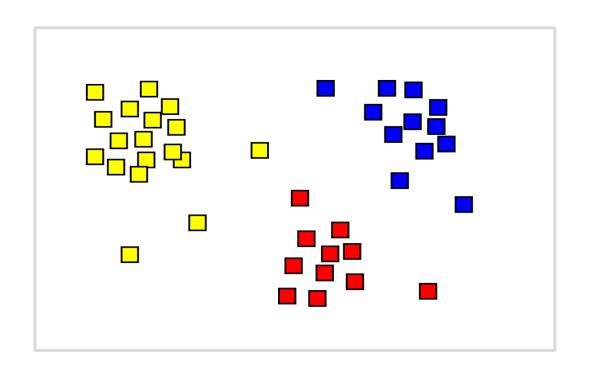


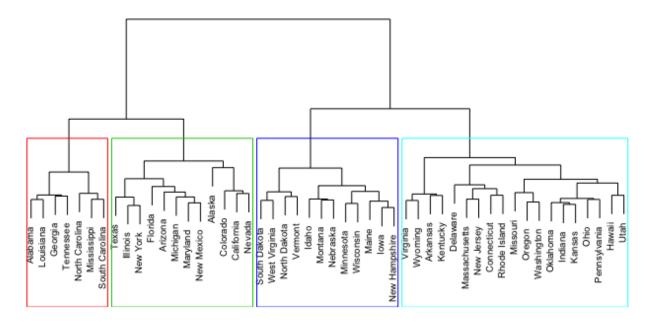


Unsupervised Learning

Given: A set of examples (X)

Output: Patterns / Commonalities in the data X

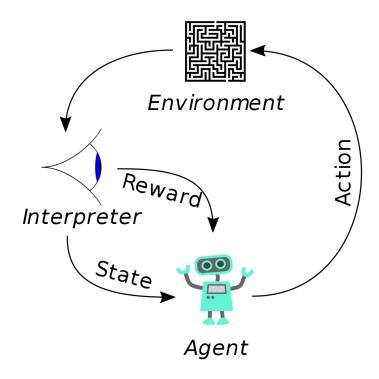


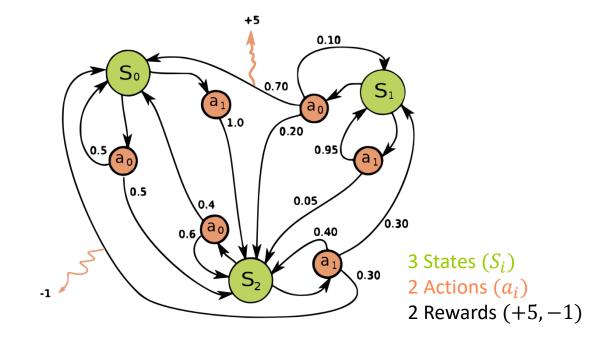


Reinforcement Learning

Given: Agent, Environment, Reward function

Output: Learnt behavior (policy)





Unsupervised machine learning tasks

Distinction based on distance metrics

Clustering

- Group together unlabeled data
- Similarity measure (metric) required

Dimensionality Reduction

- Obtain low-dimensional representation
- Retain meaningful information

Association

- Collocation extraction
- Find connections between terms

Supervised machine learning tasks

Distinction based on output

Classification

- Categorical output
- Binary classification
- Multi-class classification
- Multi-label classification
- Ordinal classification

Regression

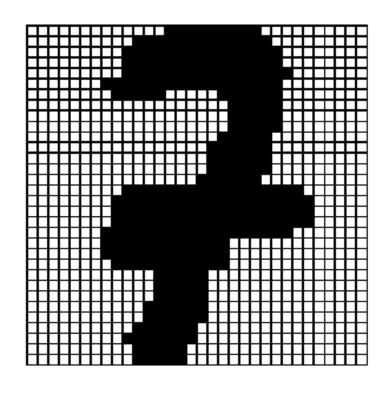
- Numerical output
- Linear regression
- Nonlinear regression
- Time series analysis

Examples of Machine Learning

List examples of machine learning applications that you encounter in your every day life

- Why is the example connected to machine learning?
- What is the method behind the application?
- What is necessary for the method to succeed?

Recognize handwritten numbers



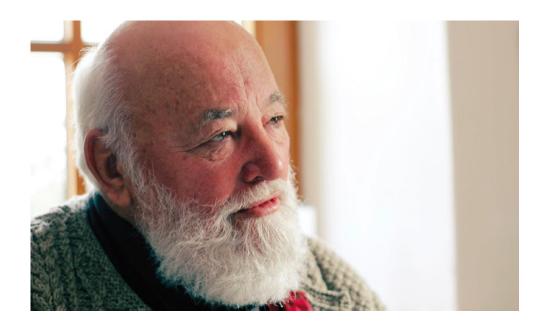
System properties

Input: $X \in \{0, 1\}^{1024}$

Output: $Y \in \{0, 1, 2, 3, 4, 5, 6, 7, 8, 9\}$

Classification of man or woman?

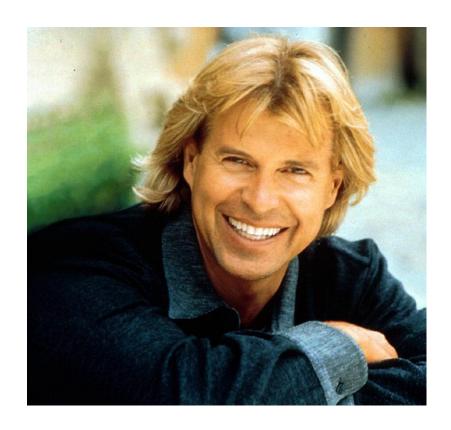
System properties



Input: Picture of a person

Output: Sex of the person

Classification of man or woman



System properties

Input: Picture of a person

Output: Sex of the person

Object recognition



System properties

Input: Picture

Output: List of objects

Spam detection

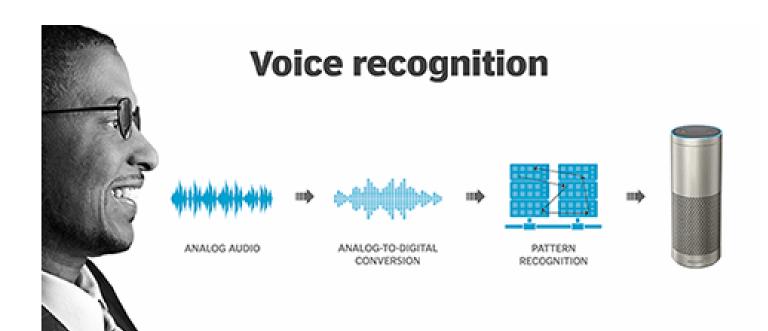


System Properties

Input: E-Mails (+Metadata)

Output: Spam or No Spam

Speech Recognition

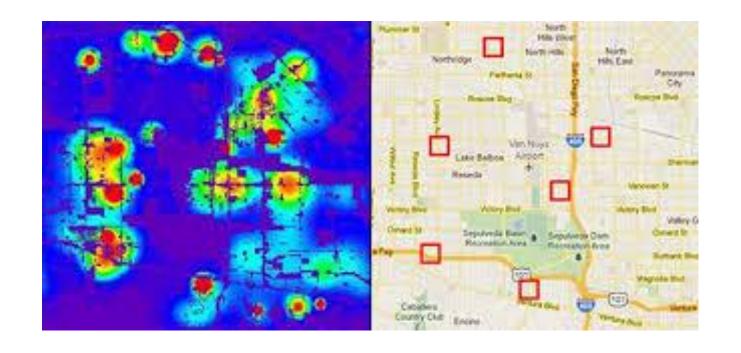


System Properties

Input: Audio files

Output: Recognized text

Predictive Policing



System Properties

Input: Lots of data sources

Output: Predictions from crime

probability

Self driving cars



System Properties

Input: Sensors, Maps, Route, ...

Output: Driving actions

Playing video games

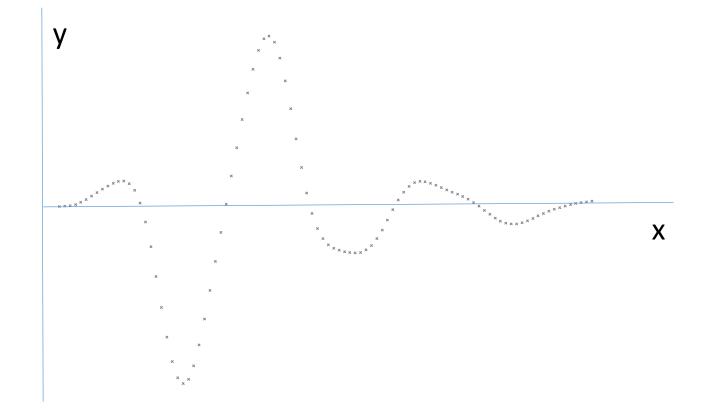
Generation: 1
Score: 0

System properties

Input: Game state

Output: Score

Modeling

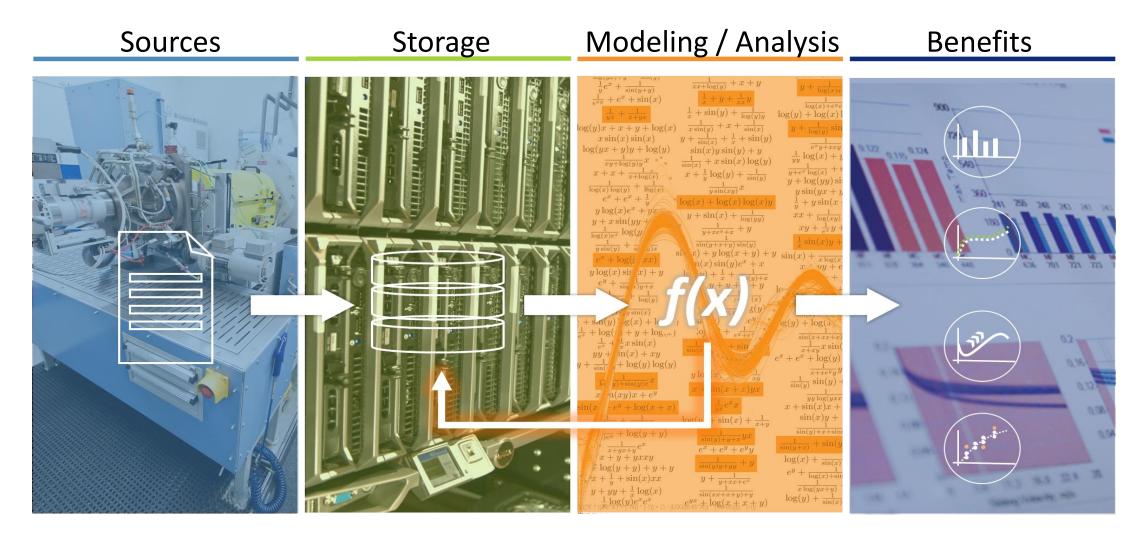


System Properties

Input: Numerical data X

Output: Predictions for Y

ML Usecases



Heuristic and Evolutionary Algorithm Laboratory



- Research Group
 - since 2005 at FH OÖ
 - 5 Professors
 - 20 Research associates
 - Interns, Bachelor and Master students



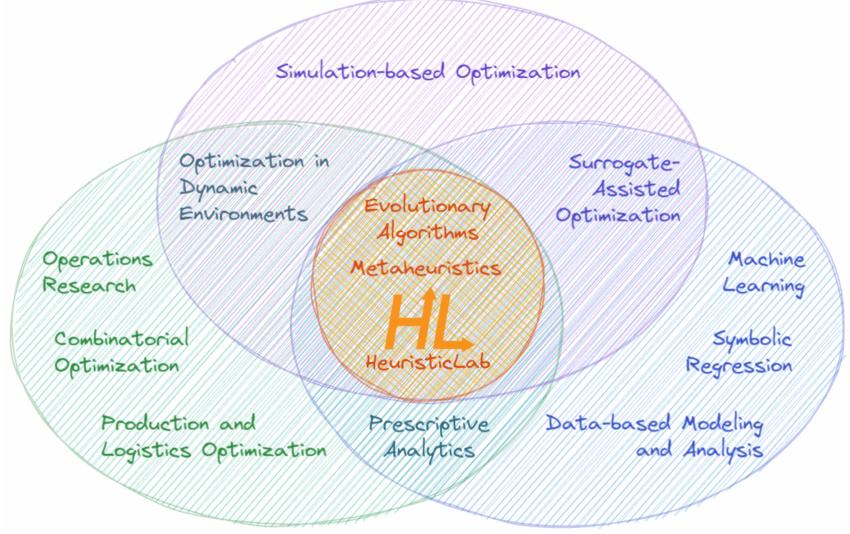
- > 25 research projects
- > 200 publications
- 11 dissertations
- > 80 bachelor and master theses
- various prices and awards





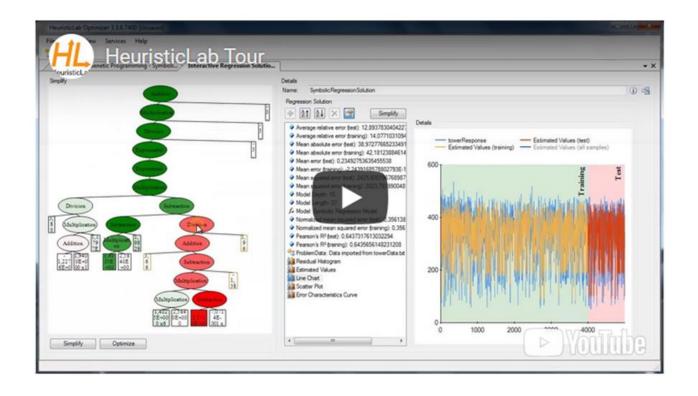
Research Focus







HeuristicLab is a framework for heuristic and evolutionary algorithms that is developed by members of the Heuristic and Evolutionary Algorithms Laboratory (HEAL) since 2002. The developers team of HeuristicLab uses this page to coordinate efforts to improve and extend HeuristicLab.



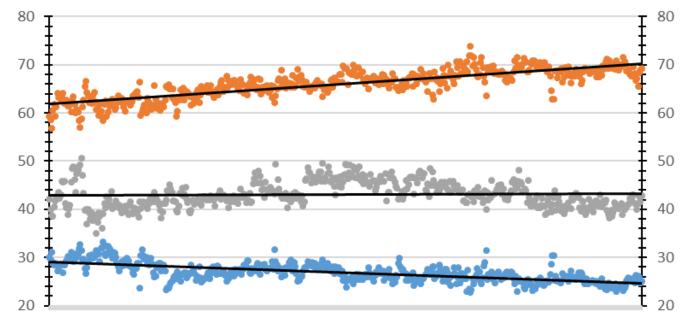
- Graphical User Interface
- Algorithm Prototyping
- Evolutionary Algorithms
- Genetic Programming
- Data Analysis
- Simulation-based Optimization
- Experiment Design and Analysis
- Plugin-based Architecture



Prediction of Coke Quality

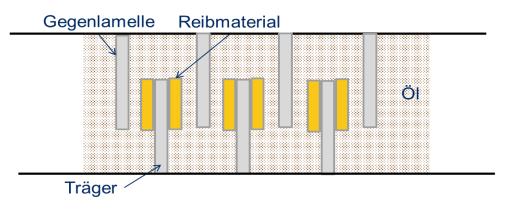
- Coke production using different coal type
- Within well-defined boundaries regarding three quality aspects

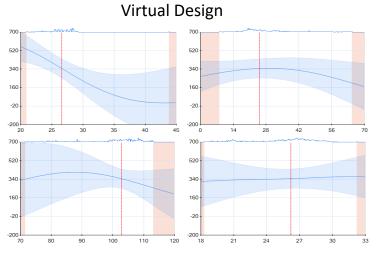


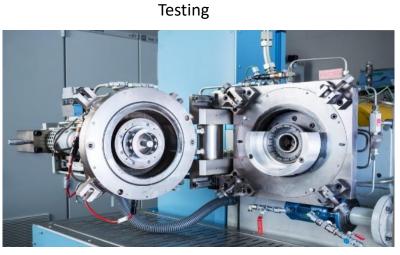


Design of Friction Systems

Tribological Systems



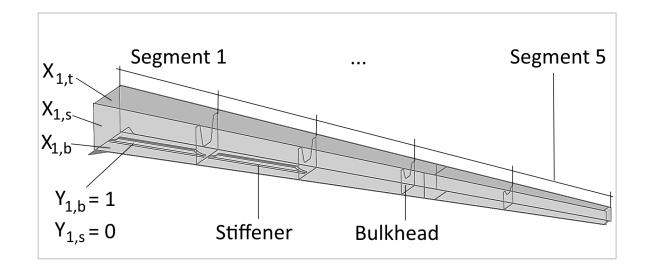




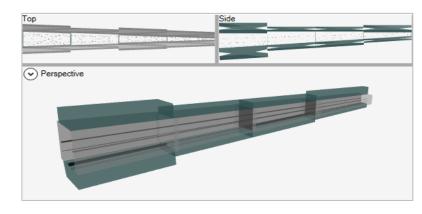


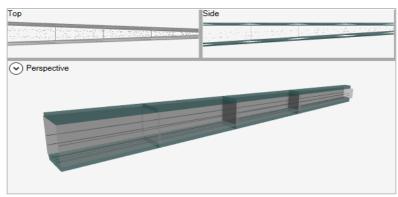
Box Type Boom Design

$$\left(\underbrace{\frac{x_{1,b}, x_{1,s}, x_{1,t}}{x_{1,b}, y_{1,b}, y_{1,s}}}_{Segment \ 1}, \dots, \underbrace{x_{n,b}, x_{n,s}, x_{n,t}, y_{n,b}, y_{n,s}}_{Segment \ n}, \underbrace{z_b, z_s}_{Segment \ n} \right)$$



early stage

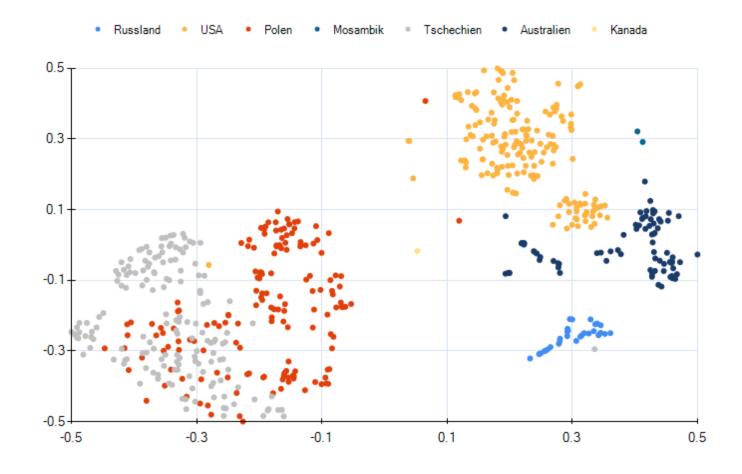




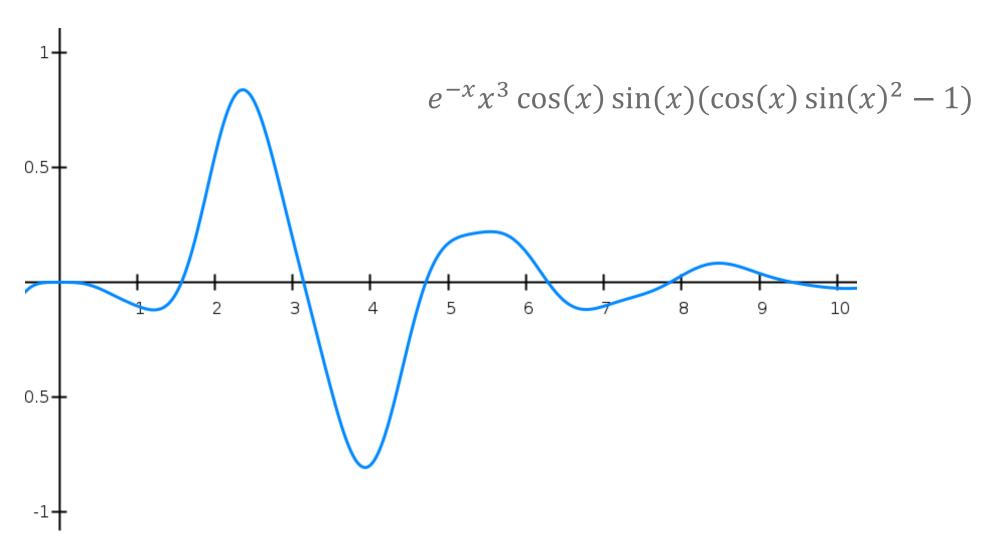
final stage

Product Origin

- Automatic chemical analysis of materials
- Control of safety relevant products
- Detection of faulty declaration



Symbolic Regression



Symbolic Regression

