

# Project in Data Intensive Systems

4DV652  
Lab Lecture 5b  
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## Agenda

- Ensemble techniques in regression and classification
- Lab 5b task descriptions

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## Ensemble techniques

- Bagging
- Random Forest
- Boosting
- Heterogenous ensembles with different estimators
- Stacking

## Heterogenous ensembles with different estimators

Idea:

- Train different models using different approaches
- Independent approaches (regression-, probability-distribution-, tree-based)
- Aggregate the results using
  - averaging (regression) and
  - majority voting (classification)
- Can be combined with bootstrap for quasi-independent training datasets

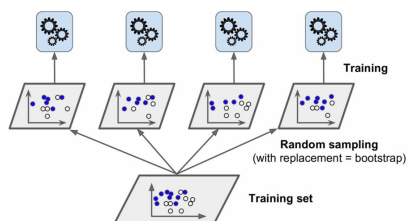
Assumption:

- gives independent predictors,
- hence, better predictions with lower error

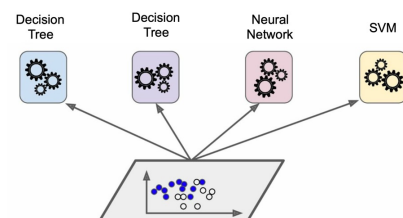
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## Bootstrap: getting quasi-independent training datasets



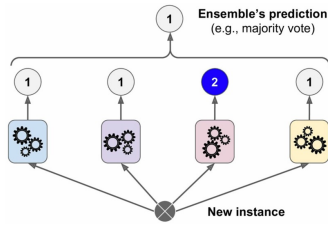
## Heterogenous ensembles training



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## Heterogenous ensembles prediction



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## Other ensemble techniques

- Bagging
- Random Forest
- Boosting
- Heterogenous ensembles with different estimators
- Stacking

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## Stacking

### Idea

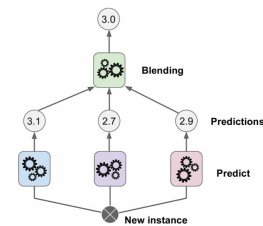
- Replace simple aggregation using average or mode with yet another machine learning model also called blender or meta-learner
- Maps output of the ensemble models to the final prediction
- It is trained on the output of the individual models and the actual response
- Can be combined with both bootstrap and heterogenous ensembles

### Assumption:

- can learn complex aggregation functions
- hence, better predictions with lower error

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## Stacking prediction



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## Resources

- Tutorial by Pádraig Cunningham:  
<https://towardsdatascience.com/ensembles-in-machine-learning-9128215629d1>
- Comes with Jupyter notebooks in Python:  
<https://github.com/PadraigC/EnsemblesTutorial>

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- Ensemble techniques in regression and classification
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## Lab assignment 5b: ensemble techniques for regression and classification

- ML
  - Challenge the current champion [regression with an ensemble approach](#)
  - Challenge the current champion [classification with a ensemble approach](#)
- Software development
  - If applicable, implement and deploy the new champion regression and classification
- Reporting:
  - In a next notebook, document the iteration(s) over the ML process steps
- Deadline: 2023-03-08