



# BAGGING

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# BAGGING

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- What is bagging?
- Benefit of bagging
- How bagging works
- Discussion about bagging
- Bagging with supervised learning
- Bagging with unsupervised learning
- Bagging with reinforcement learning
- Code

# WHAT IS BAGGING?





Bagging, short for Bootstrap Aggregating, is a machine learning ensemble technique used to improve the stability and accuracy of algorithms. It works by training multiple versions of a model on different subsets of the data, which are created through bootstrapping (sampling with replacement).

The final prediction is made by averaging (for regression) or voting (for classification) the predictions of all models.

This method reduces variance and helps prevent overfitting.

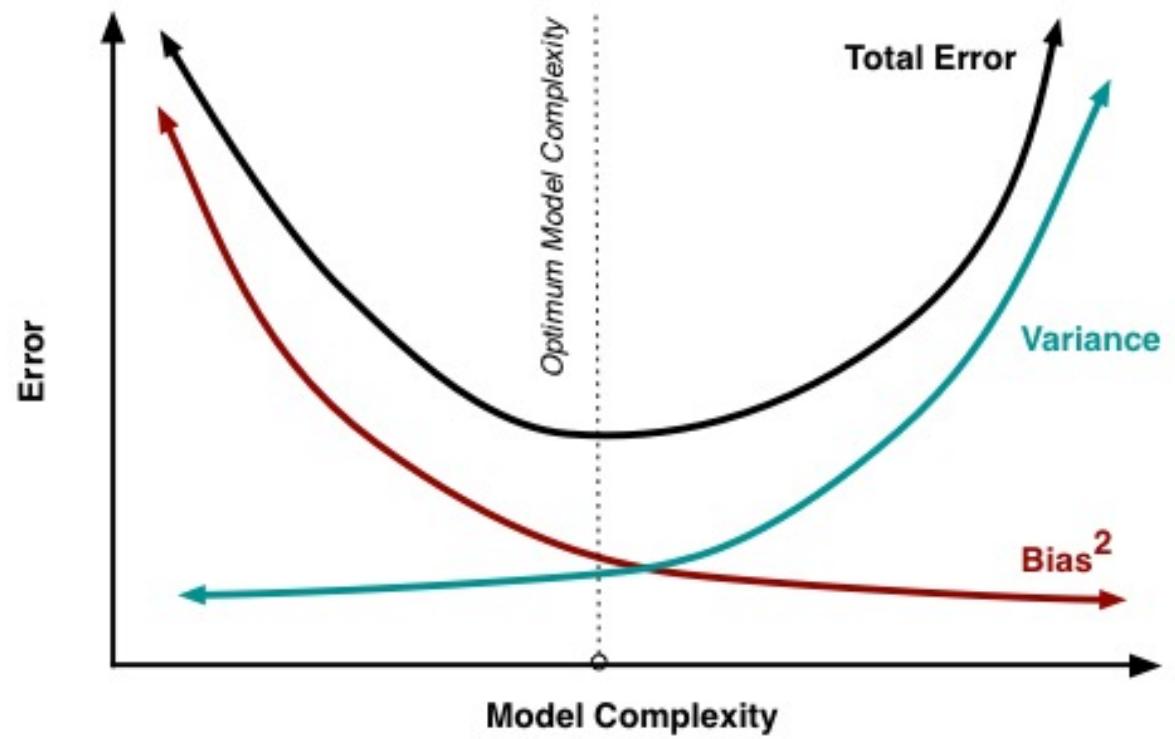
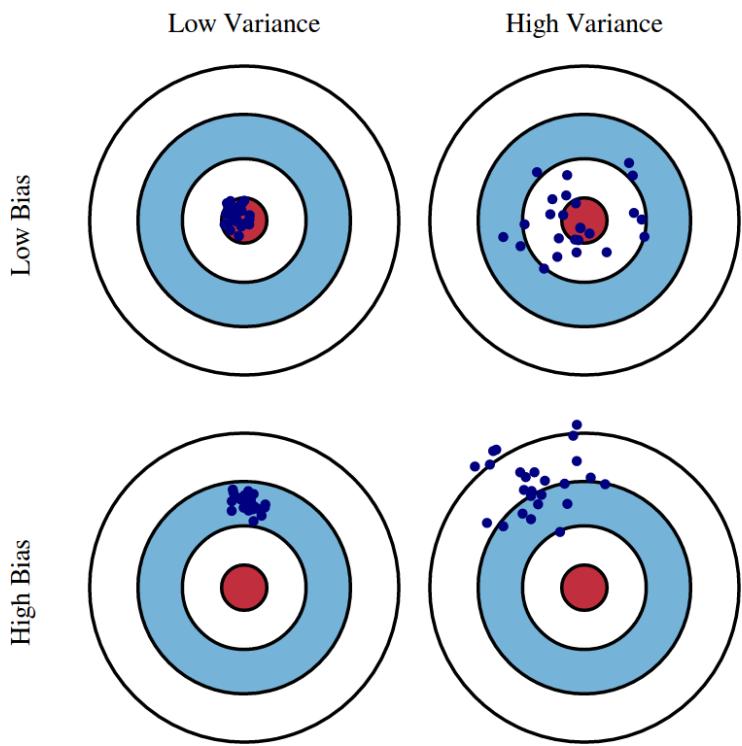
# BENEFIT OF BAGGING

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	Benefit of bagging
Supervised learning	<ul style="list-style-type: none"><li>- Reduce variance</li><li>- Improve generalization</li><li>- Robustness to overfitting</li></ul>
Unsupervised learning	<ul style="list-style-type: none"><li>- Enhance clustering stability</li><li>- Noise reduction</li><li>- Create diverse SL model</li></ul>
Reinforcement learning	<ul style="list-style-type: none"><li>- Policy stability</li></ul>

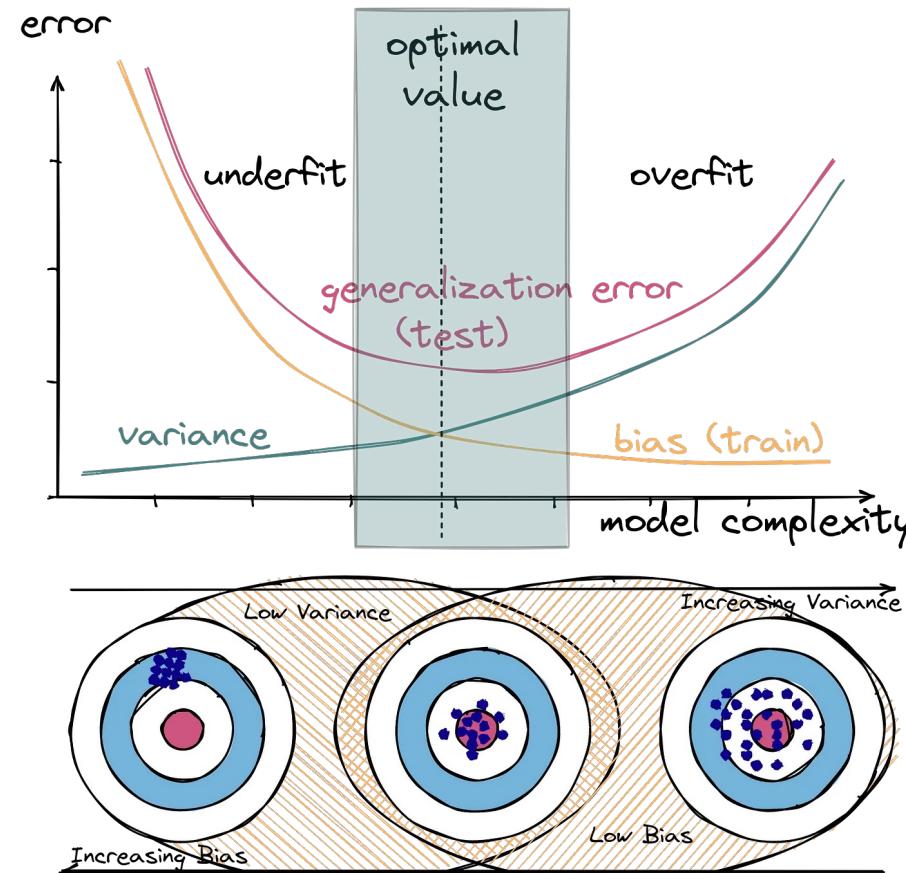
# BIAS-VARIANCE TRADEOFF

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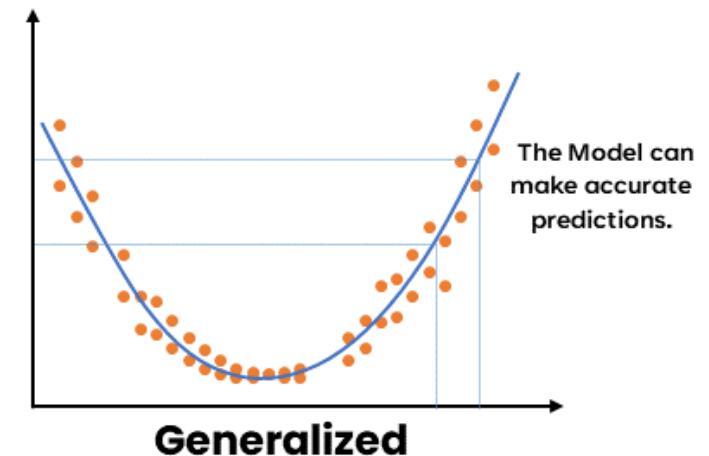
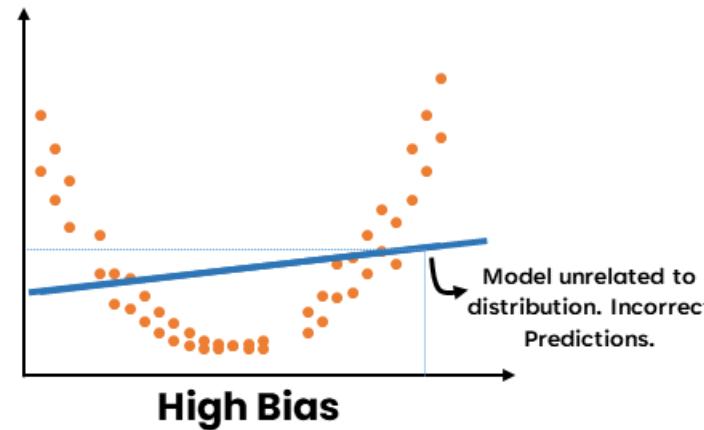
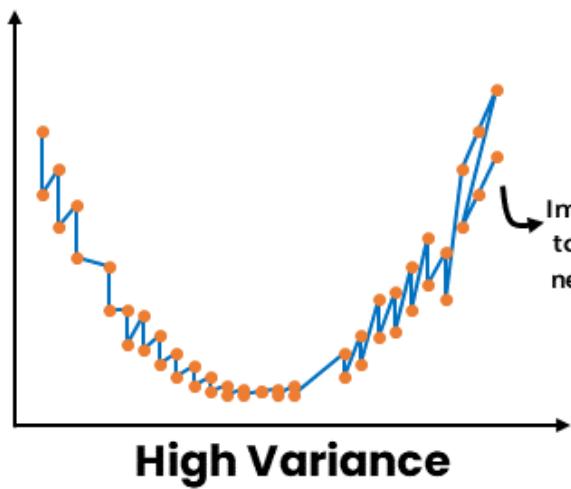


# BIAS-VARIANCE TRADEOFF

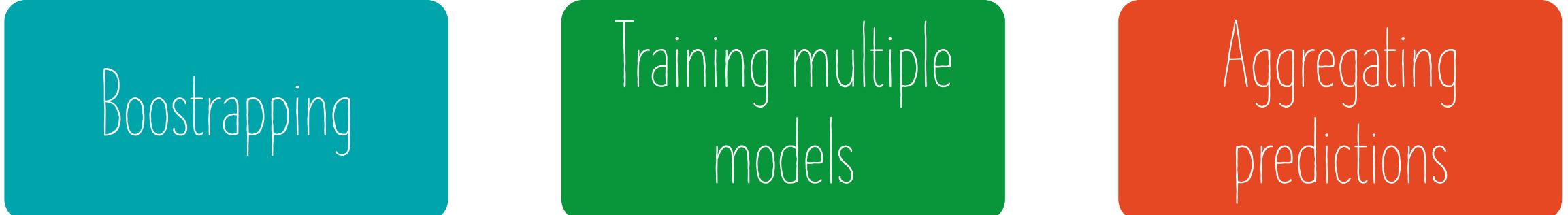
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# BIAS-VARIANCE TRADEOFF



# HOW BAGGING WORKS



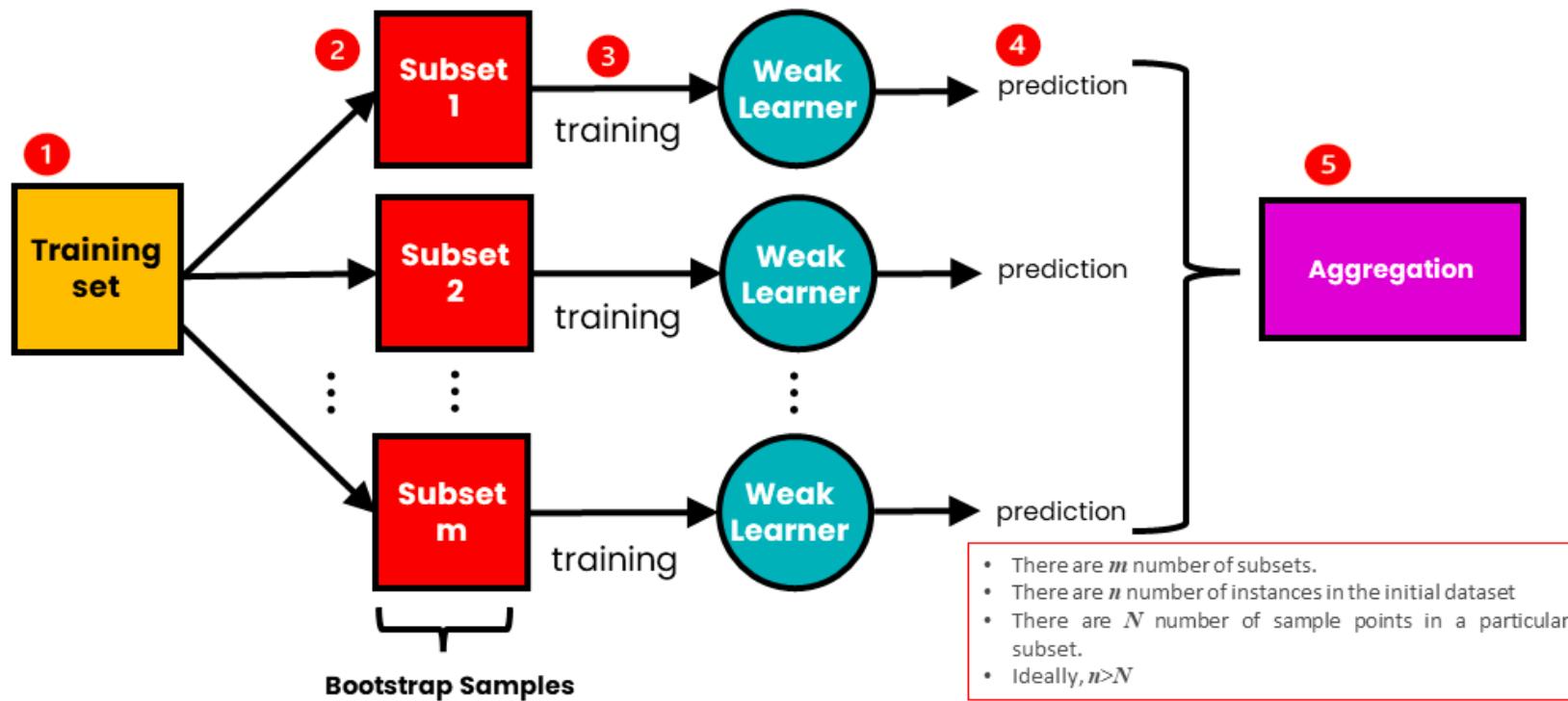
Bootstrapping

Training multiple  
models

Aggregating  
predictions

# HOW BAGGING WORKS

## The Process of Bagging (Bootstrap Aggregation)



# HOW BAGGING WORKS



Single Dataset



Single Dataset



# DISCUSSION ABOUT BAGGING

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- What bootstrapping?
- Why bagging reduce variance?
- Why bagging is robust to overfitting?
- Important mathematical theory
- Important condition for base models
- When to say that our base models have low correlation?



# DISCUSSION ABOUT BAGGING

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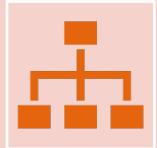
- Suitable n\_models for bagging
- Suitable n\_samples for creating base models
- Suitable n\_features for creating base models
- Keep balance between diversity and performance
- What will happen to bagging if concept drift occurs?

A stack of several books is shown, with a pair of dark-rimmed glasses resting on top of them. The books have various colored spines and covers, including blue, red, and white. The glasses are positioned centrally, with their lenses reflecting some of the surrounding environment.

# BAGGING WITH SUPERVISED LEARNING

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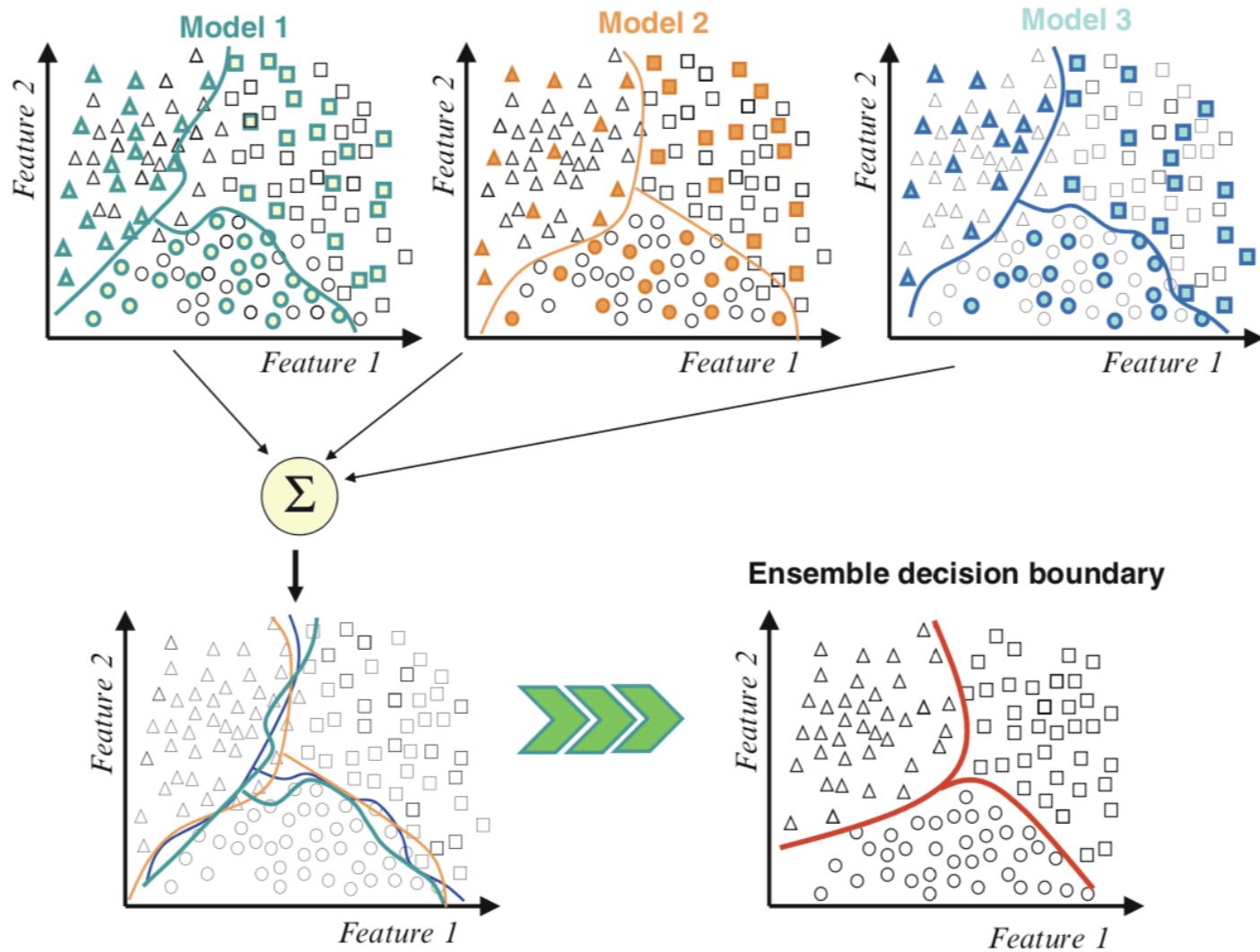
# BAGGING WITH SUPERVISED LEARNING



Classification



Regression

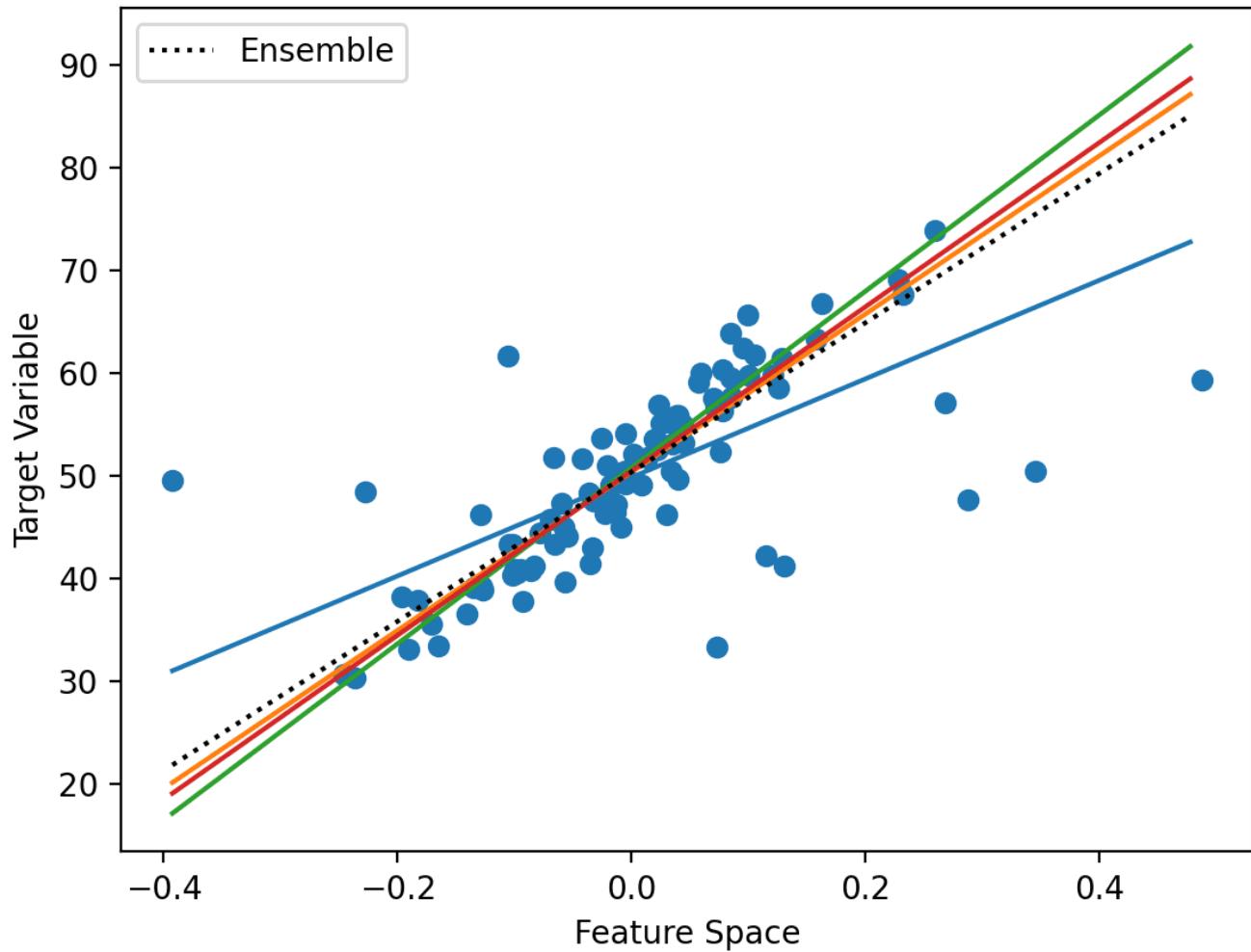


# BAGGING WITH SL

## - CLASSIFICATION

# BAGGING WITH SL

## - REGRESSION





# BAGGING WITH UNSUPERVISED LEARNING

# BAGGING WITH UNSUPERVISED LEARNING



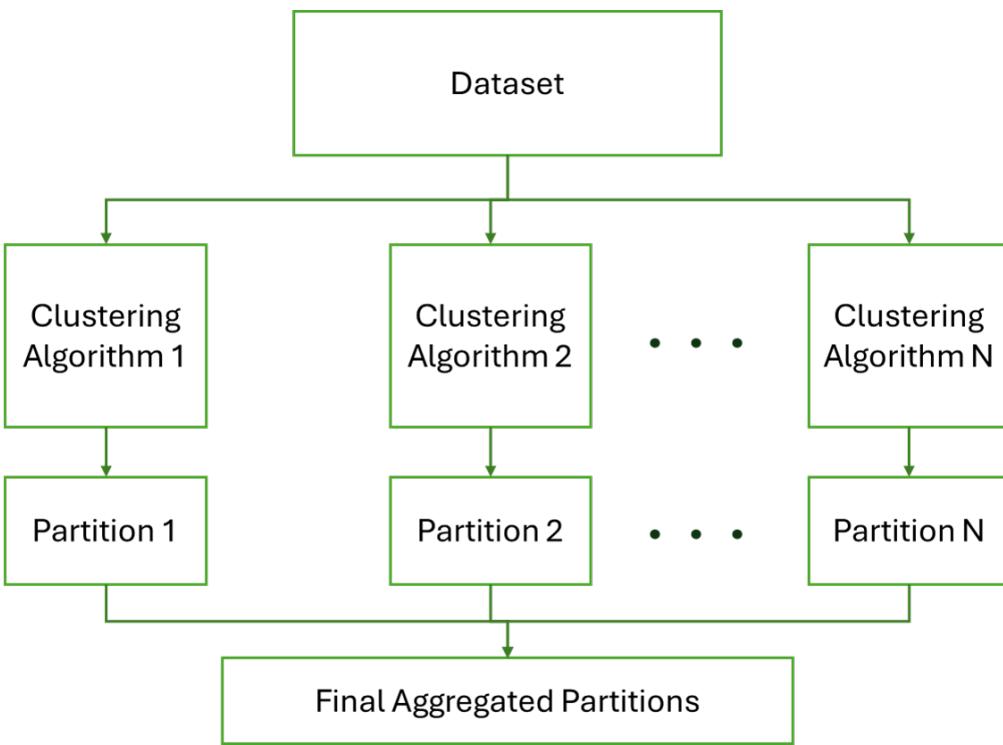
Clustering



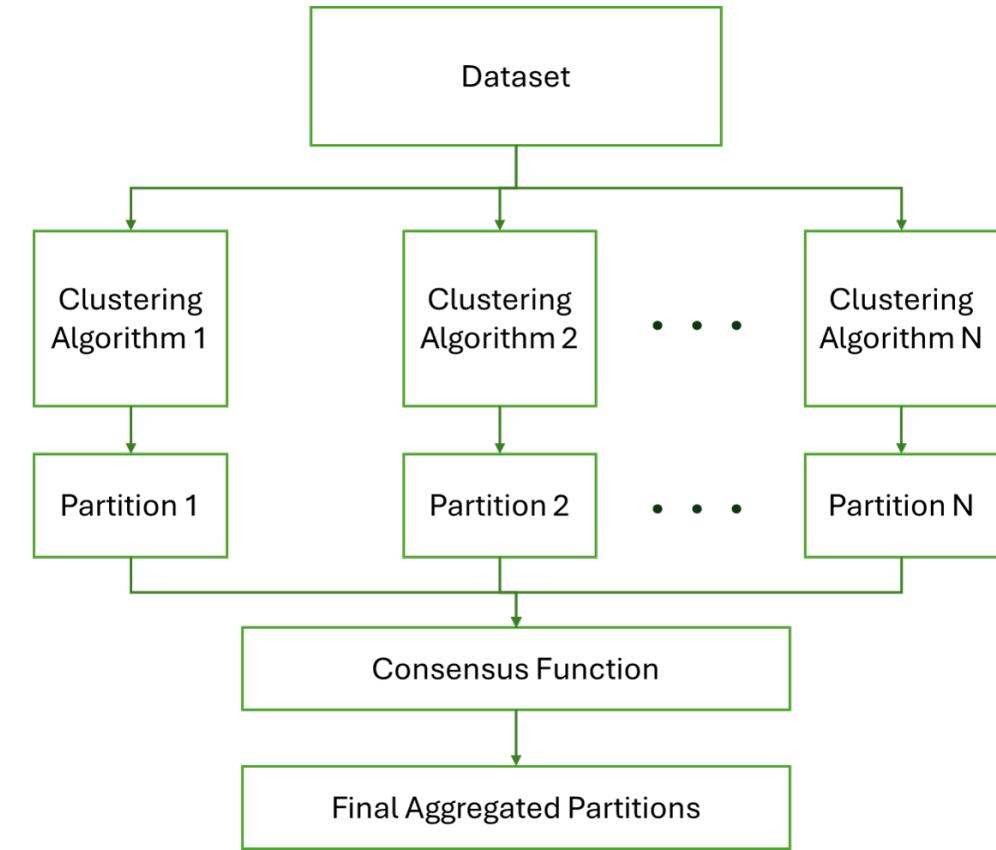
Dimensionality reduction

# BAGGING WITH UL - CLUSTERING

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Same K

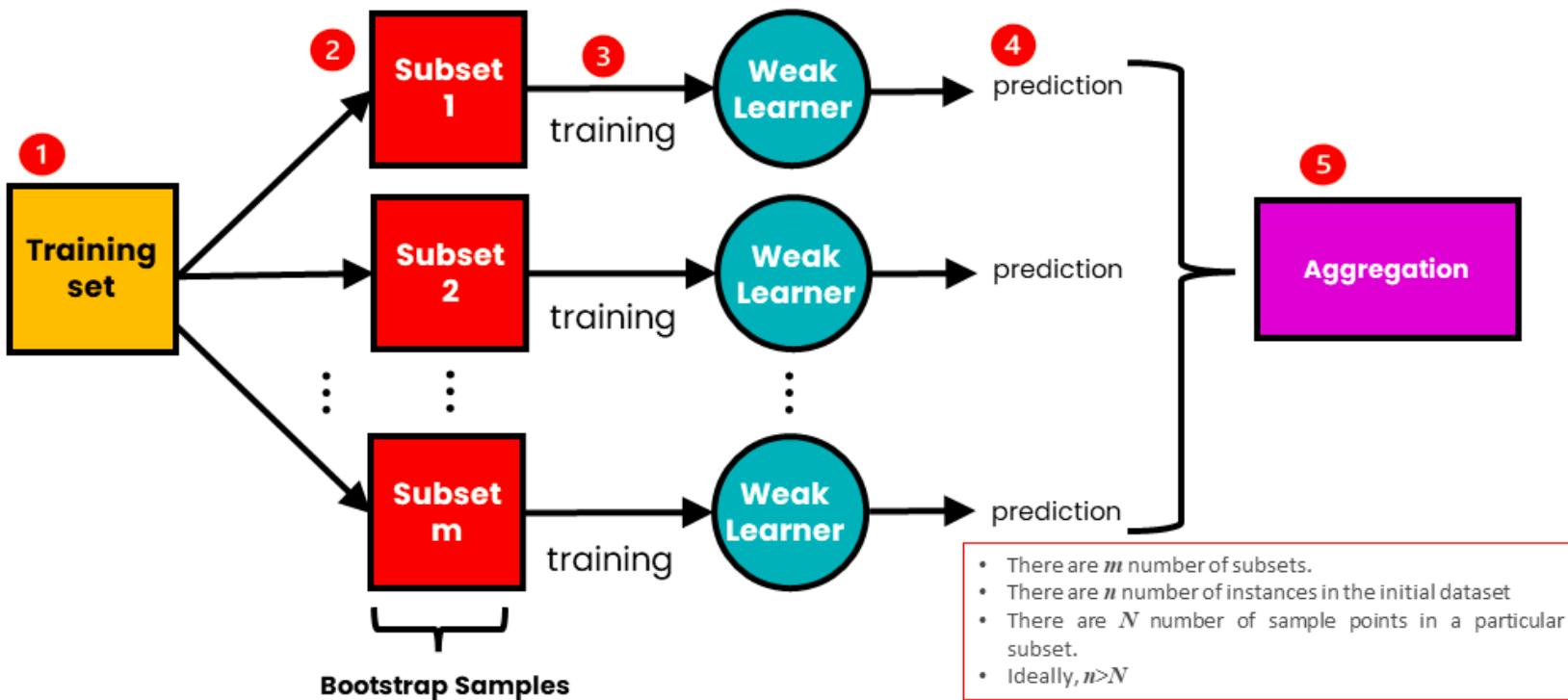


Different K

# BAGGING WITH UL - DIMENESIONALITY REDUCTION

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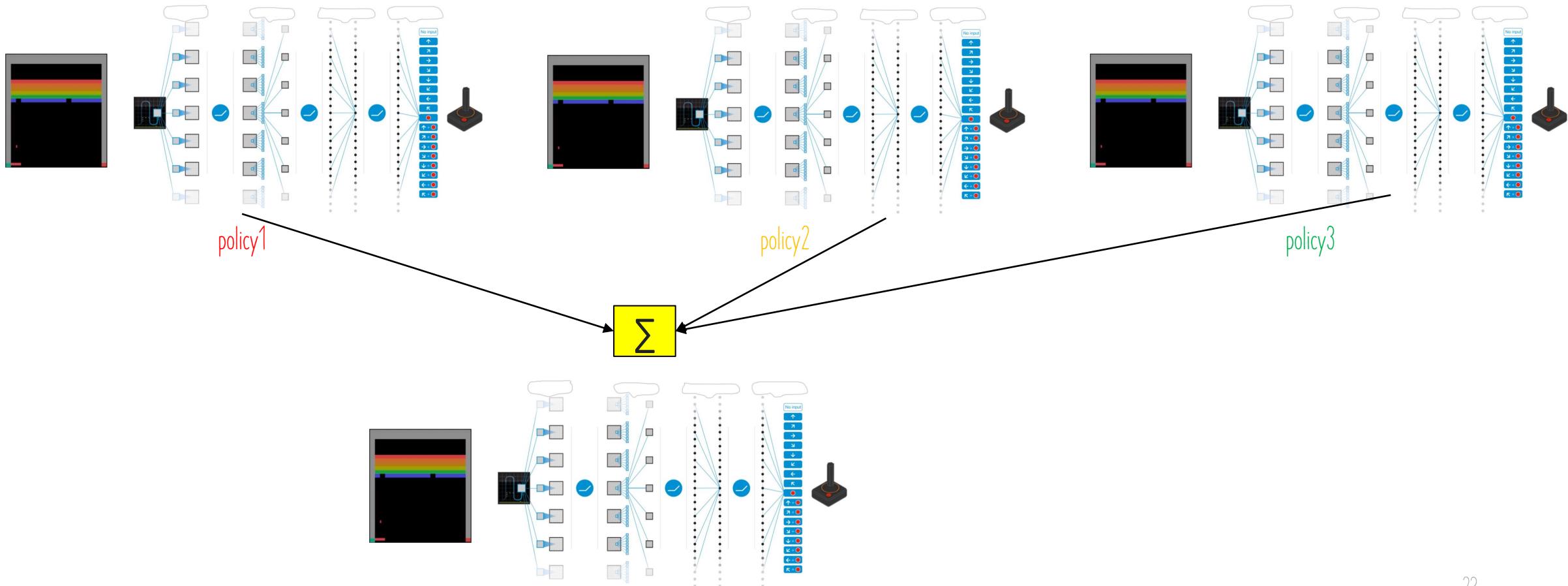
## The Process of Bagging (Bootstrap Aggregation)



# BAGGING WITH REINFORCEMENT LEARNING

# BAGGING WITH REINFORCEMENT LEARNING

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# CODE

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- Bagging - SL.ipynb
- Bagging - UL.ipynb
- Bagging - RL.ipynb

# QUESTION & ANSWER



# REFERENCE

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- <https://www.cs.cornell.edu/courses/cs4780/2018fa/lectures/lecturenote12.html>
- <https://medium.com/@ivanreznikov/stop-using-the-same-image-in-bias-variance-trade-off-explanation-691997a94a54>
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- <https://medium.com/@ivanreznikov/stop-using-the-same-image-in-bias-variance-trade-off-explanation-691997a94a54>
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