

# Cross-Validation

# Hyperparameter Tuning: Search

A search consist of:

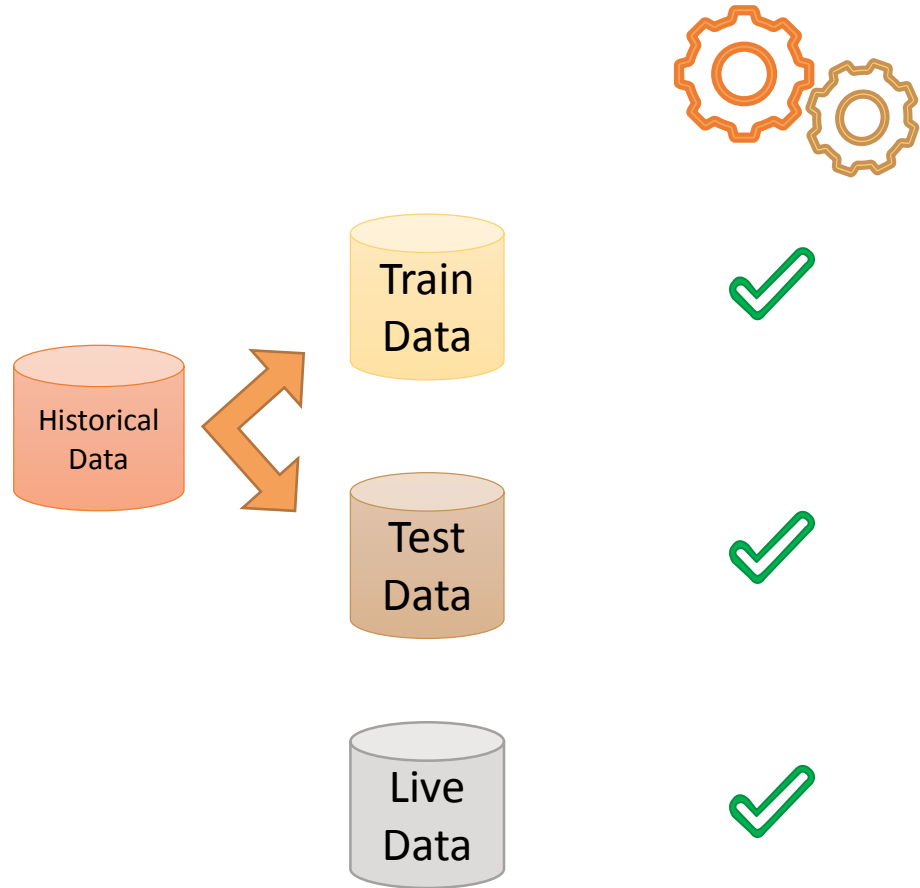
- Hyperparameter space **Parameter Grid**
- A method for sampling candidate hyperparameters
- A cross-validation scheme
- A performance metric to minimize (or maximize)

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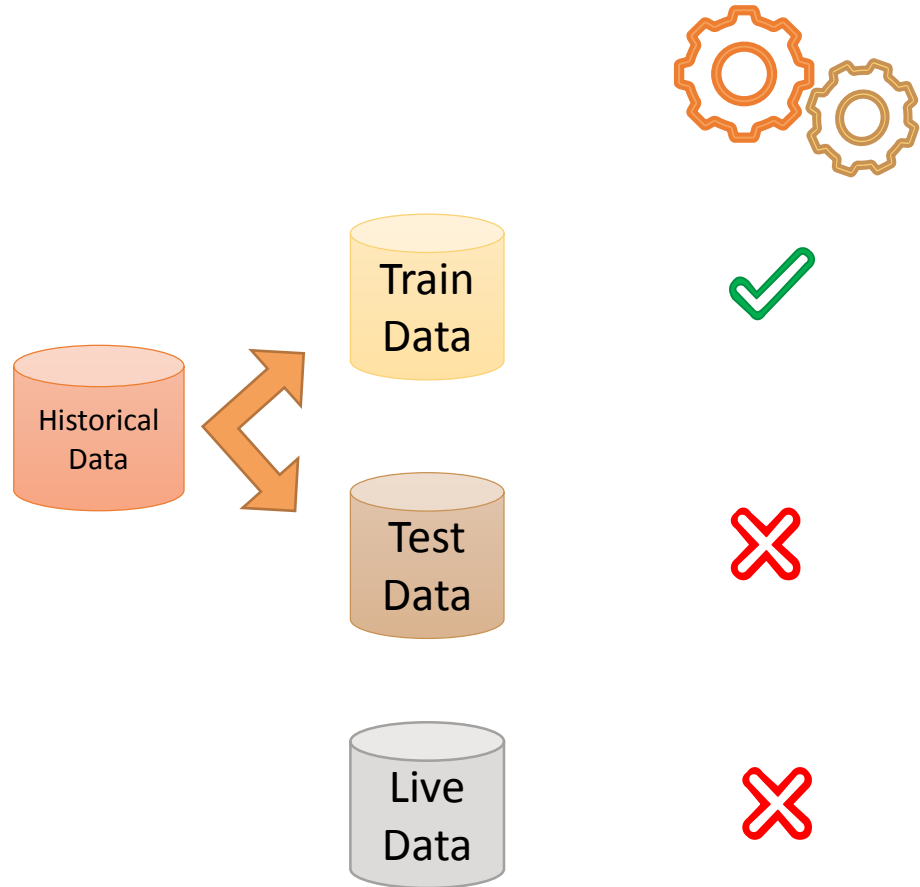
# Generalization vs Over-fitting



**Generalization** is the ability of an algorithm to be effective across various inputs.

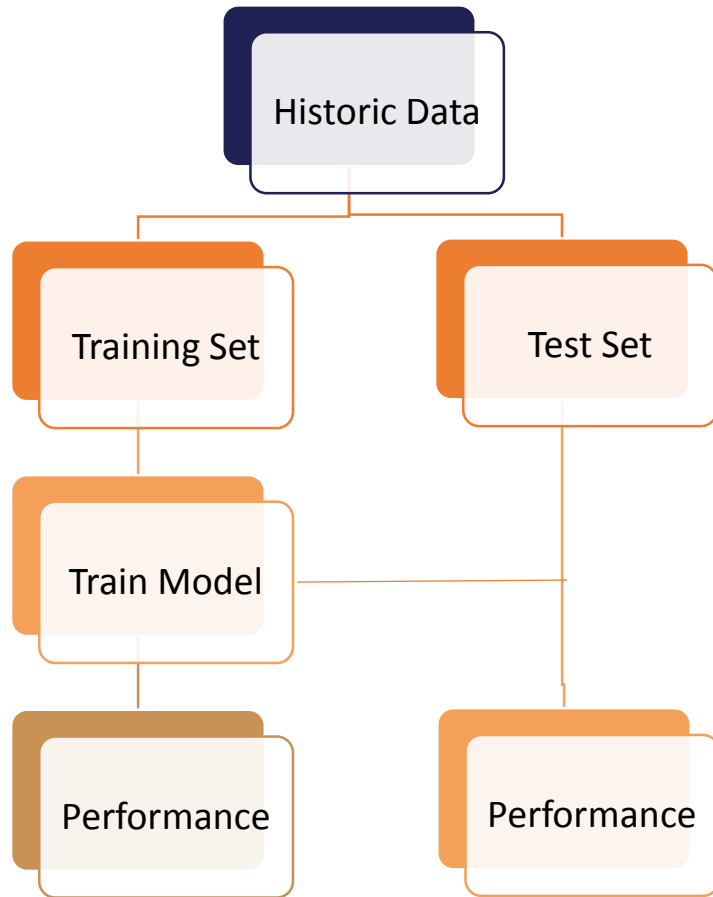
The performance of the machine learning model is constant across different **datasets** (with the same distribution of the training data).

# Generalization vs Over-fitting



When a model performs well on the train set, but not on new / naïve data, the model over-fits to the training data

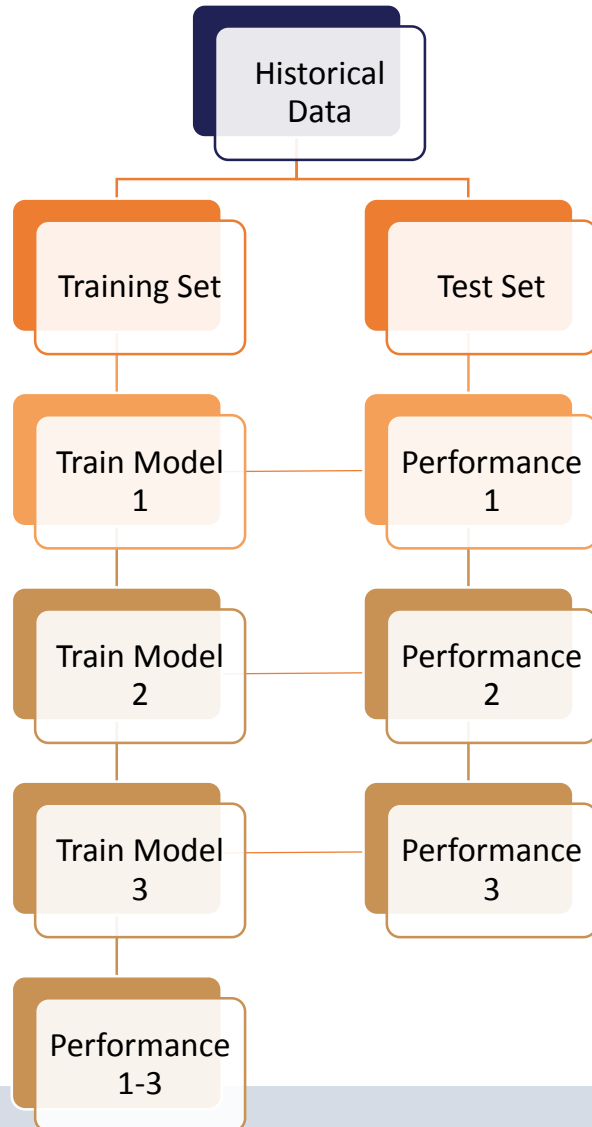
# Training a Machine Learning Model



To prevent over-fitting, it is common practice to:

- Separate the data into a train and a test set.
- Train the model in the train set
- Evaluate in the test set

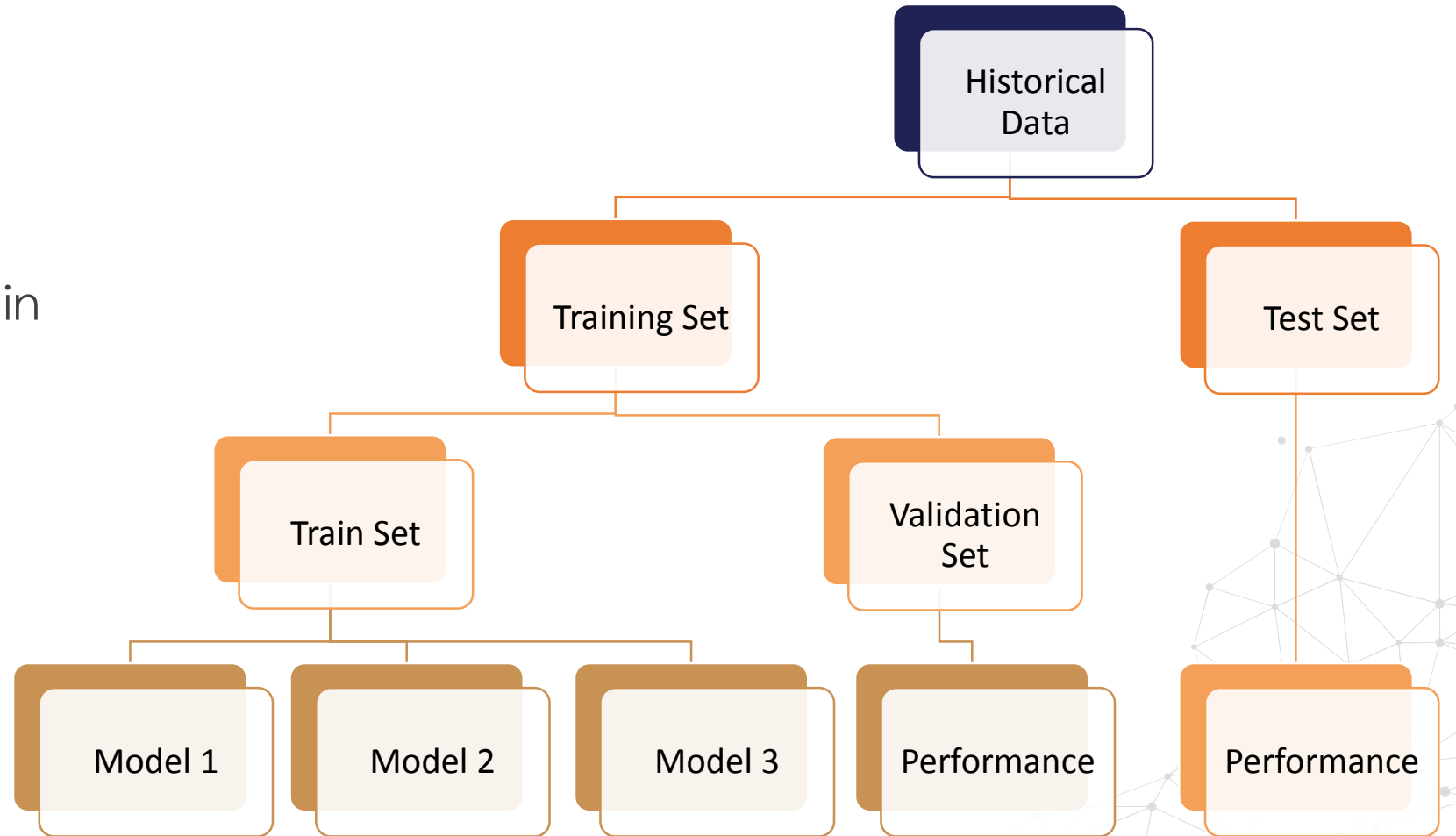
# Tuning Hyperparameters



- When evaluating different hyperparameter spaces there is a risk of overfitting on the test.
- We select the best model based on performance over test set
- Knowledge about the test set can “leak” into the model → lack or unknown generalization.
- Common mistake in Data Science Competitions

# Another Hold-Out Sample

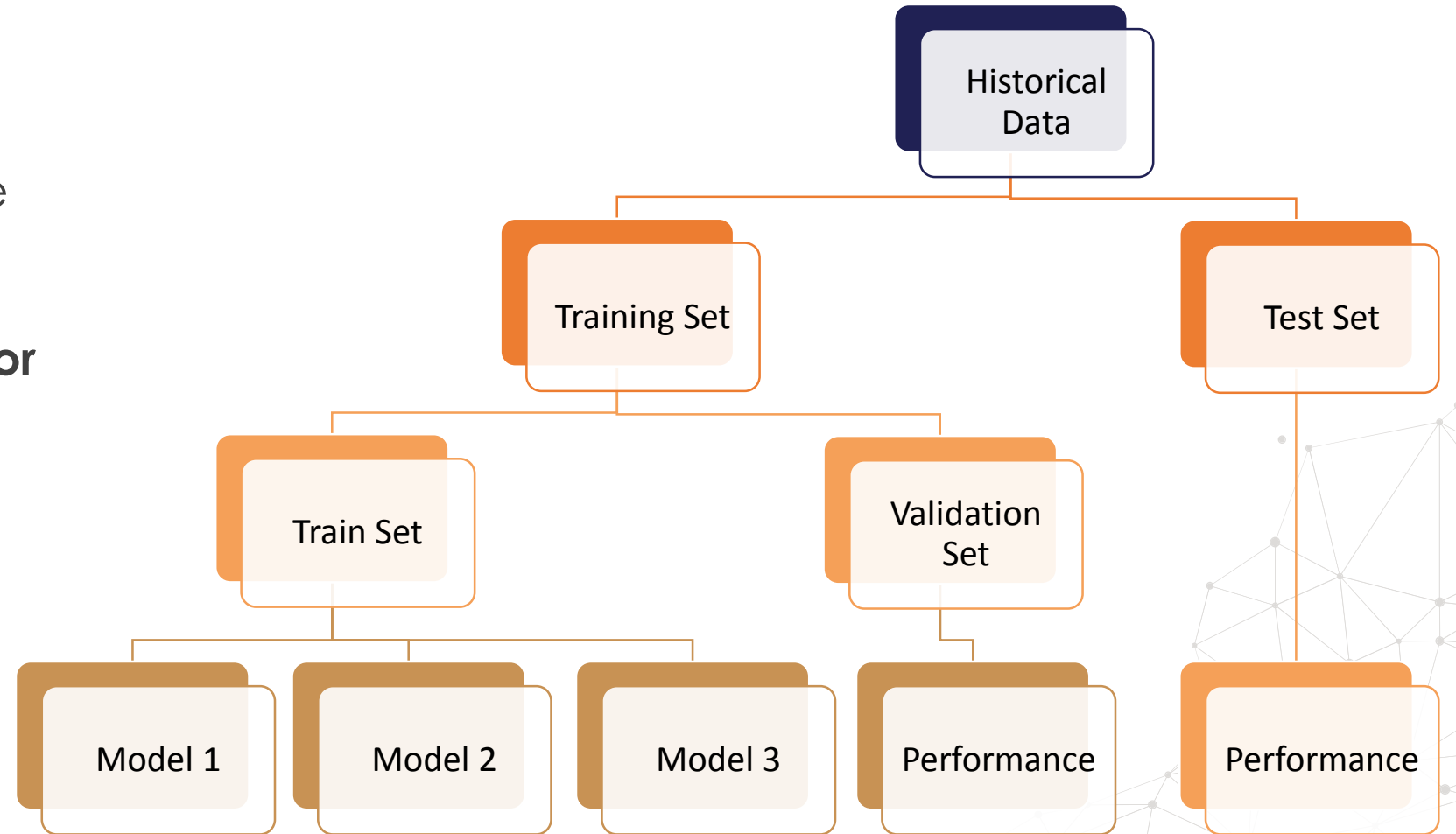
- Subsequently divide the train set in a train set and validation set
- Train model on most of train set
- Test Performance on validation Set
- Select best model
- Test best model's performance on test set





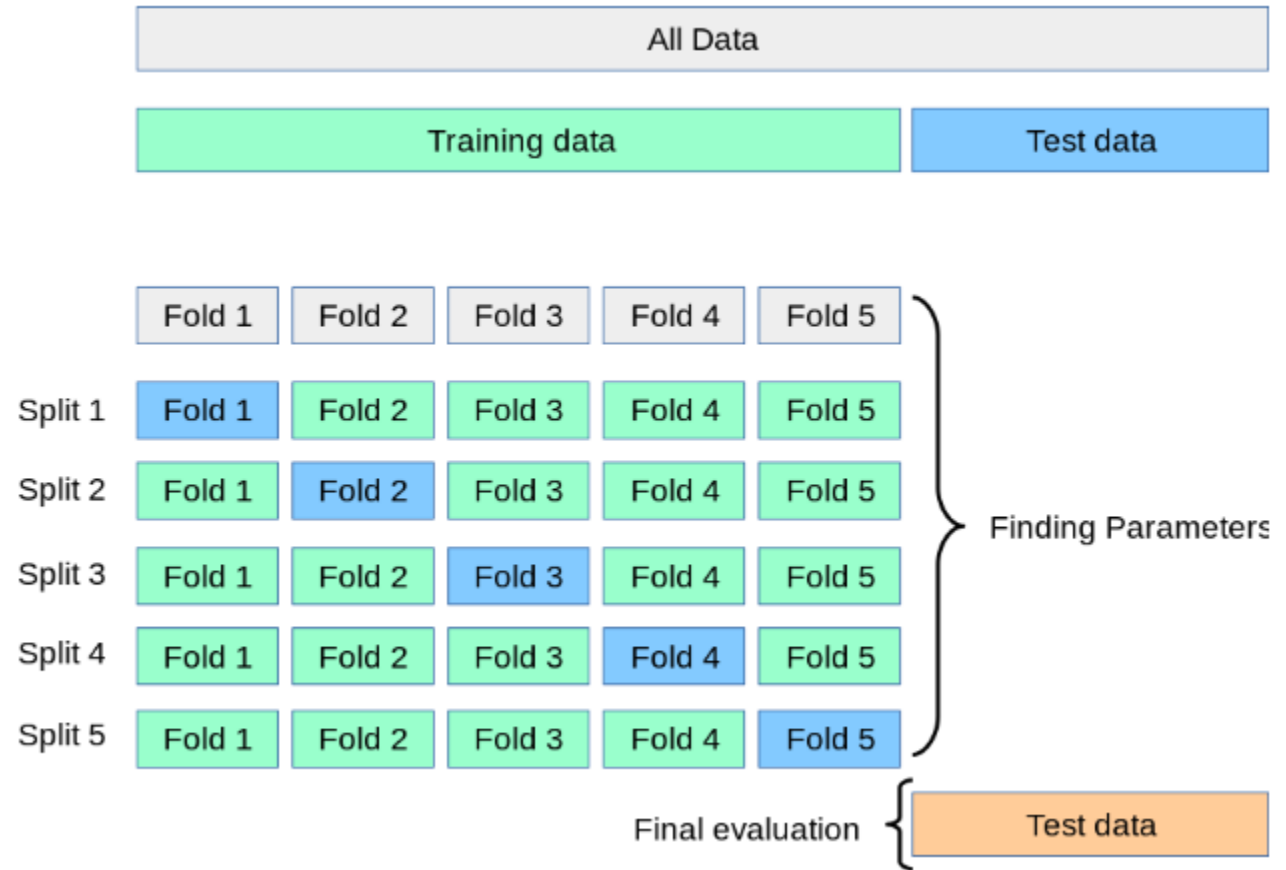
# Another Hold-Out Sample

- We could be left out with very little data to train the model
- We have no metric of **error**
- **Metric  $\pm$  error**



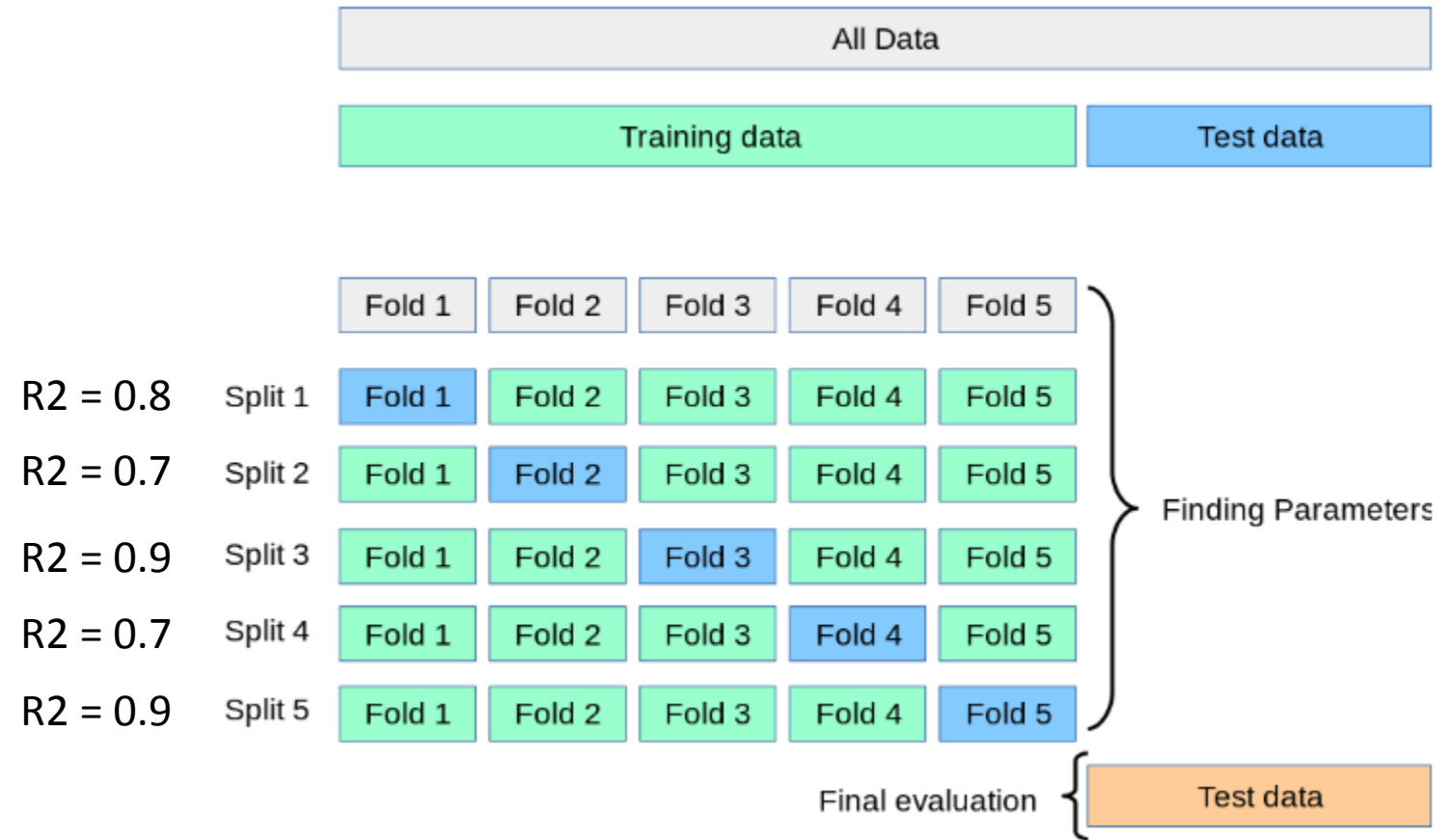
# Cross-Validation

- Train set divided into k folds
- Model trained in k-1 fold
- Model tested in the k<sup>th</sup> fold
- Repeat k times
- Final performance metric is the average
- Can determine an error



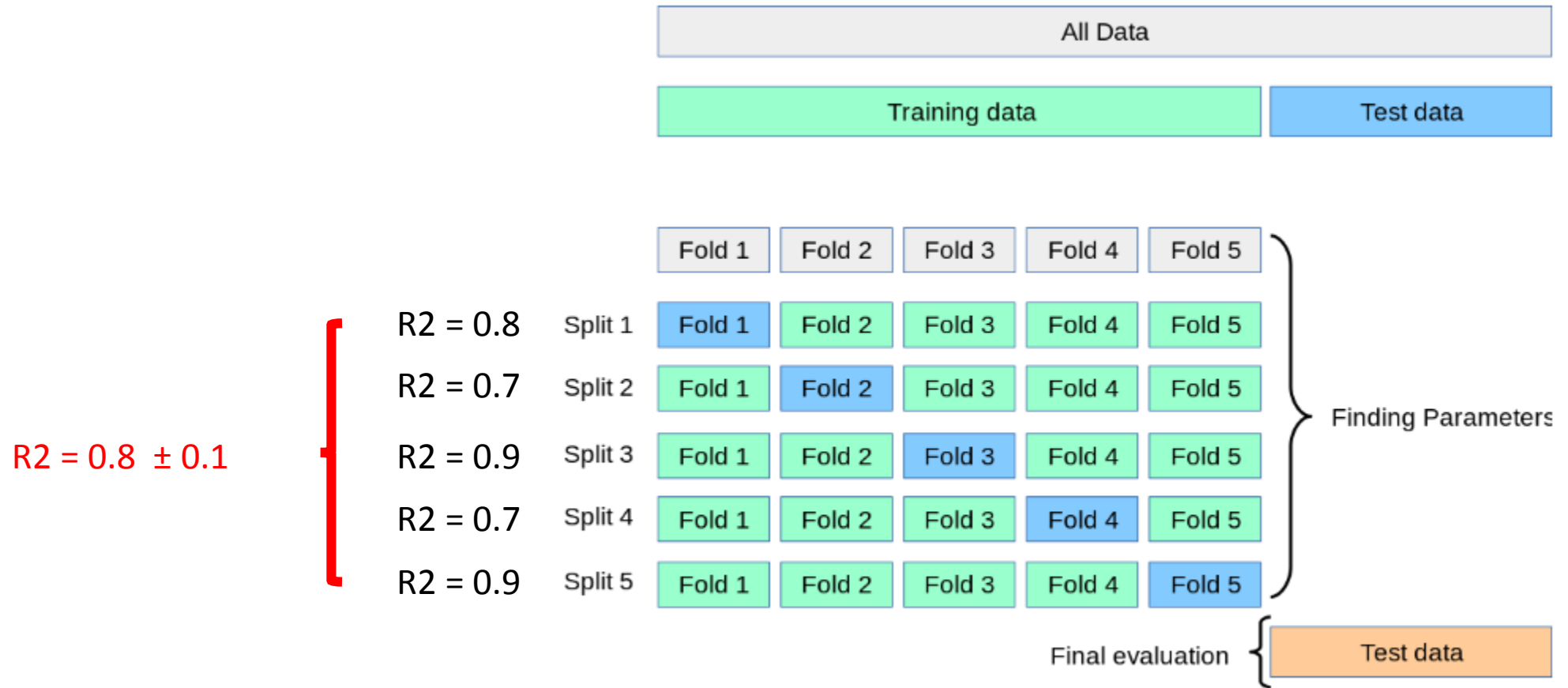
[https://scikit-learn.org/stable/modules/cross\\_validation.html](https://scikit-learn.org/stable/modules/cross_validation.html)

# Cross-Validation



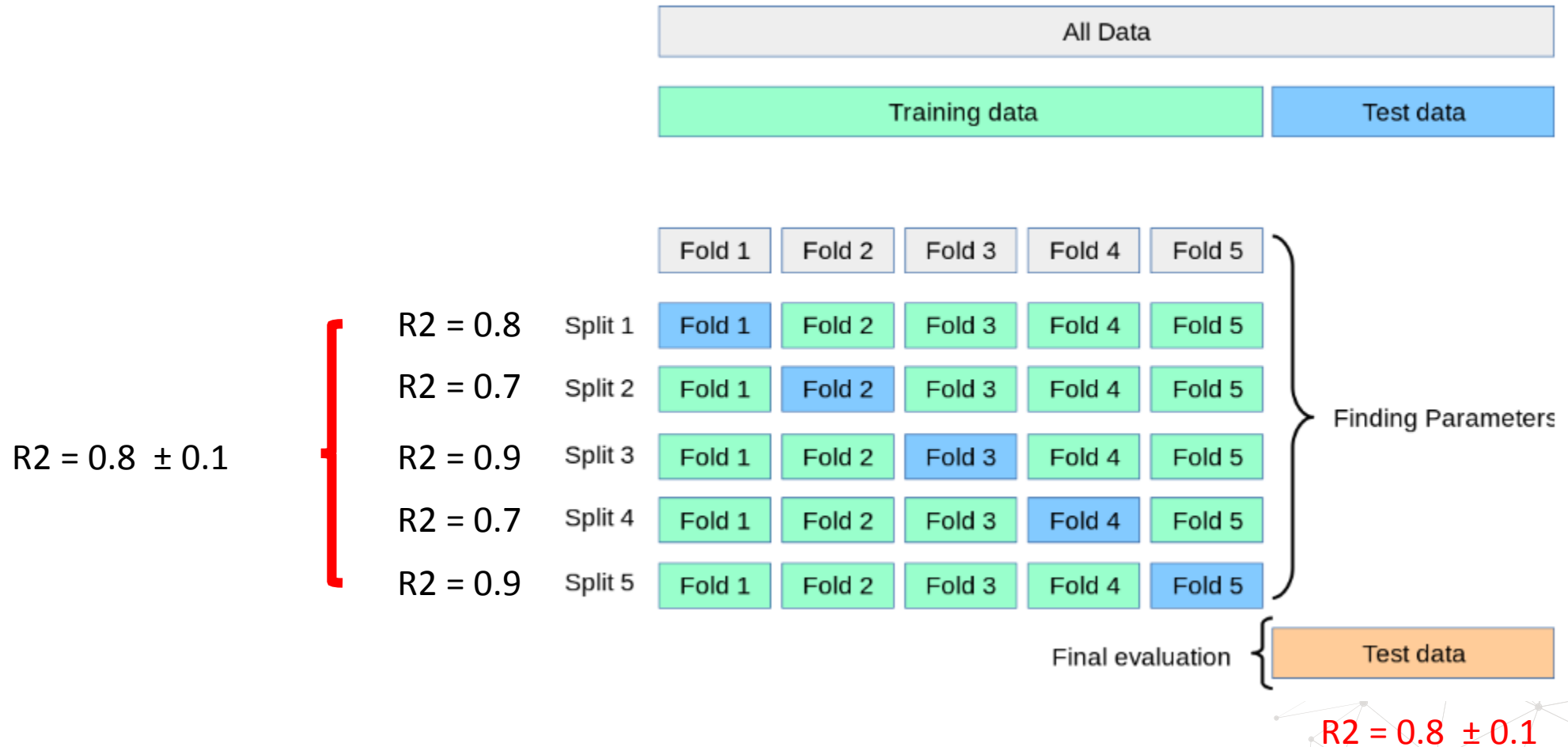
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# Hyperparams tuning with Cross-Val

Hyperparams Space 1



Hyperparams Space 2

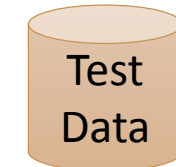


Hyperparams Space 3



|         |        |        |        |        |        |
|---------|--------|--------|--------|--------|--------|
| Split 1 | Fold 1 | Fold 2 | Fold 3 | Fold 4 | Fold 5 |
| Split 2 | Fold 1 | Fold 2 | Fold 3 | Fold 4 | Fold 5 |
| Split 3 | Fold 1 | Fold 2 | Fold 3 | Fold 4 | Fold 5 |
| Split 4 | Fold 1 | Fold 2 | Fold 3 | Fold 4 | Fold 5 |
| Split 5 | Fold 1 | Fold 2 | Fold 3 | Fold 4 | Fold 5 |

Best  
Hyperparams  
Space





# Cross-Validation

- K-Fold
- Leave One Out (LOOCV)
- Leave P Out (LPOCV)
- Repeated K-Fold
- Stratified Cross-Validation
- Group Cross-Validation
- Nested Cross-Validation



# THANK YOU

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