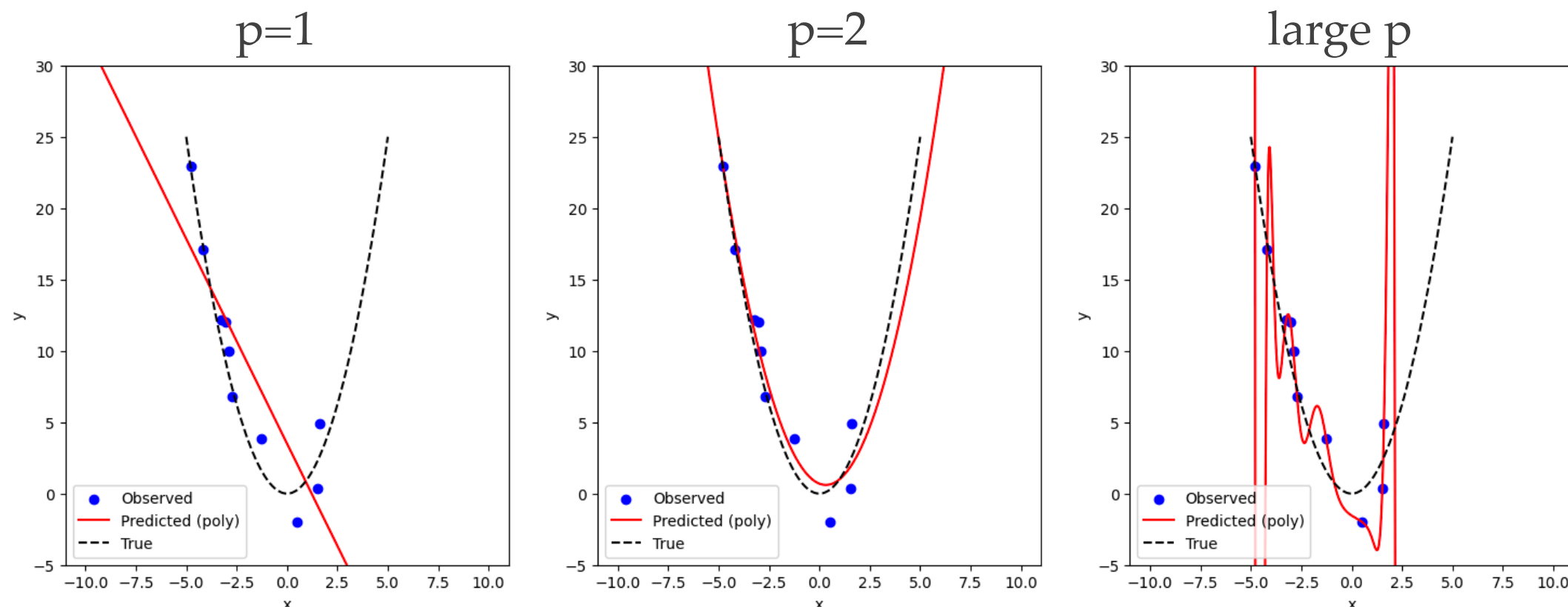


Training, Validation and Test Data

Itthi Chatnuntawech

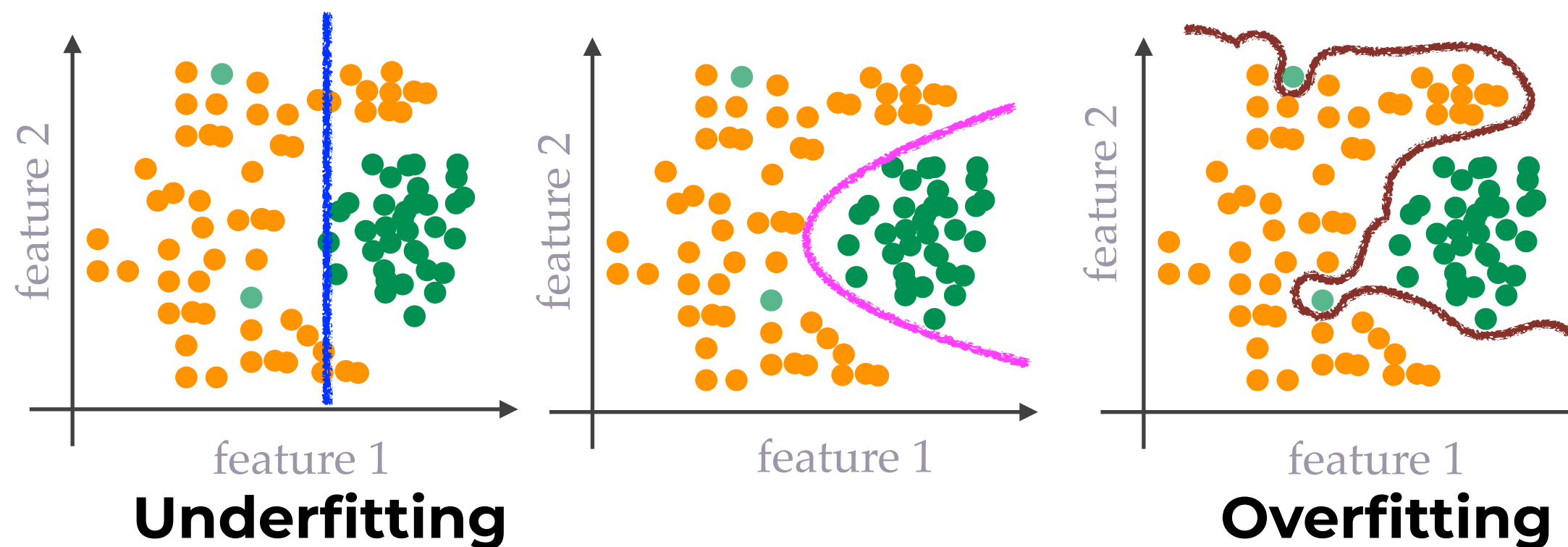
Underfitting and Overfitting

regression



How do we pick p?

classification



Validation data!

A Simple Pipeline & Training, Validation, and Test Data

1. Given a task, pick p for our polynomial Ex. $p = 1$
2. Split the data into three groups: training, validation, and test



3. Optimize the selected model using the training data
4. Evaluate the trained model using the validation data
5. Pick more p 's, optimize the models, and evaluate the trained models on the validation data Ex. $p = 2, 3, \dots, 15$
Ex. Pick the model with the lowest validation error (out of the 15 models)
6. Use the model with the lowest validation error as your final model
7. Evaluate the final model on the test data

Example: Training, Validation, and Test Data

Scenario: A time-limited, two-choice neuroscience exam will be held next year. We have come up with 4 strategies (i.e., 4 models) for acing the upcoming exam.

- AI #1: Always pick choice 1
- AI #2: Pick choice 1 for the first half of the exam and learn what to answer for the rest
- AI #3: Pick choice 2 for the first half of the exam and learn what to answer for the rest
- AI #4: Learn what to answer for all questions

☐ choice 1 ☐ choice 2



Steps

1. Use the training problems and exams to teach all the AI models.
2. Use the validation exams to see how the trained models perform.
3. Select the AI model that achieves the highest score on the validation exams to take the upcoming exam (test exam) for you

K-Fold Cross Validation

Collected Data

fold 1

fold 2

fold 3

fold 4

fold 5

Validation

Training

score 1

Training

Training

score 2

Training

Training

score 3

Training

Training

score 4

Training

score 5

5-fold CV
(k=5)

combined
score
(e.g., average)

K-Fold Cross Validation

Collected Data

If $k = \#$ of samples, we get leave-one-out-cross validation (LOOCV)

fold 1

fold 2

fold 3

fold 4

fold 5

Validation

Training

score 1

Training

Training

score 2

Training

Training

score 3

Training

Training

score 4

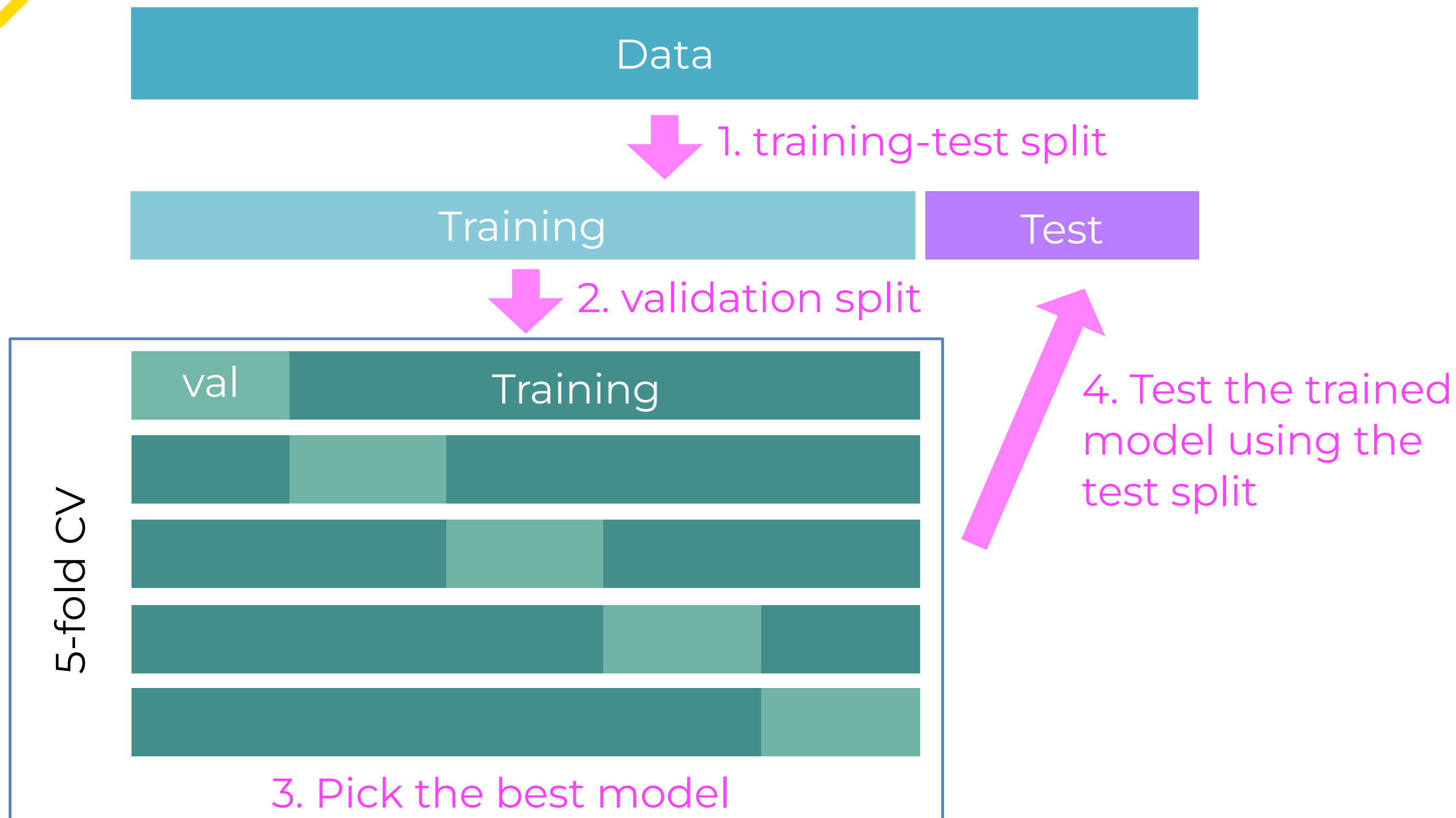
Training

score 5

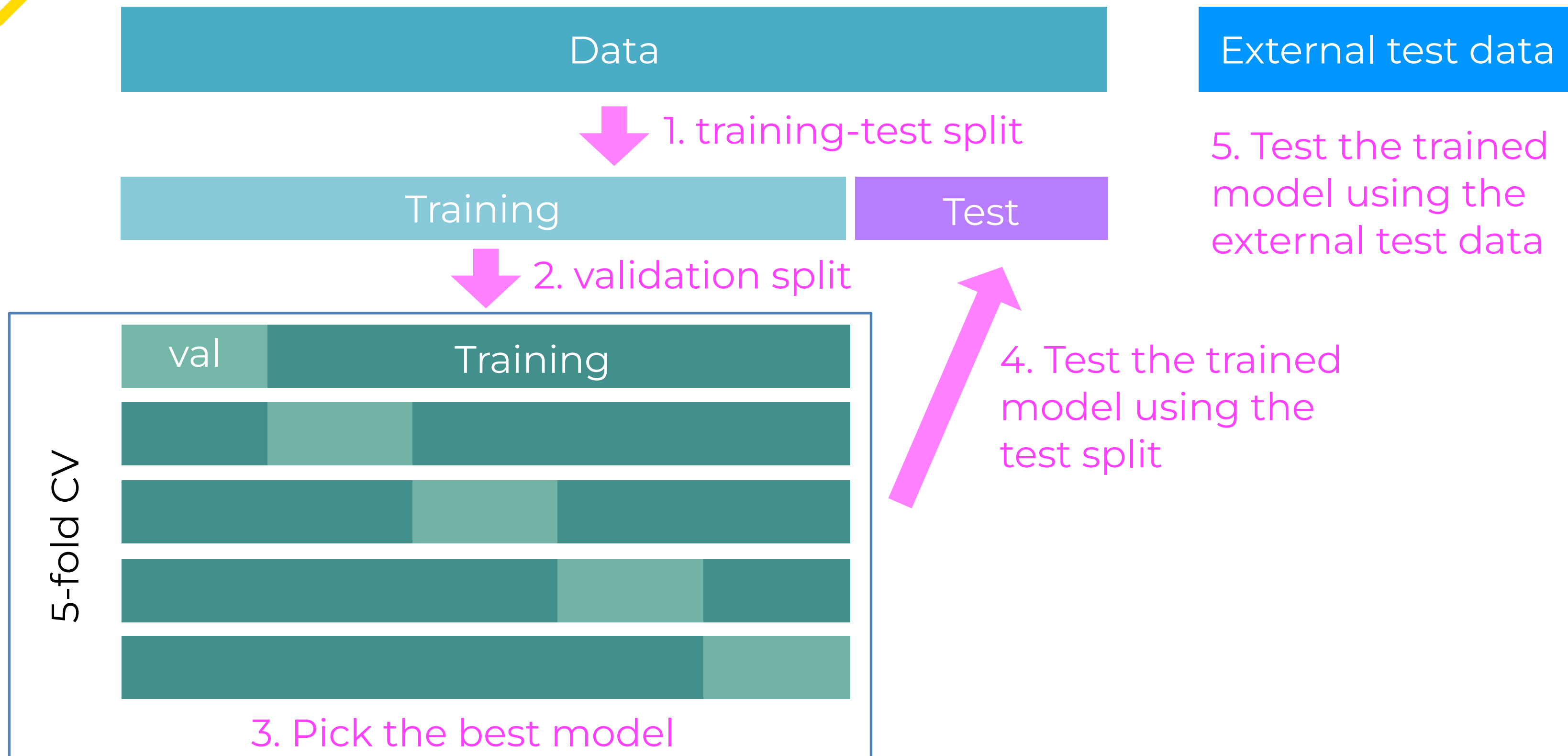
5-fold CV
($k=5$)

combined
score
(e.g., average)

A simple practical approach



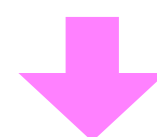
A simple practical approach



Stratified CV

class 1

class 2



a naive approach



fold 1 fold 2 fold 3 fold 4 fold 5

class 1

class 2



a stratified
approach



fold 1 fold 2 fold 3 fold 4 fold 5

Class imbalance

class 1

class 2



a stratified
approach



class 1

class 2



an approach that
customizes class ratio

