

Stacking

| feature1 | feature2 | feature3 | prediction |
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Assuming that we have the
above training dataset (e.g.,
14 samples, 3 features)

Step 1: Split training data to n folds

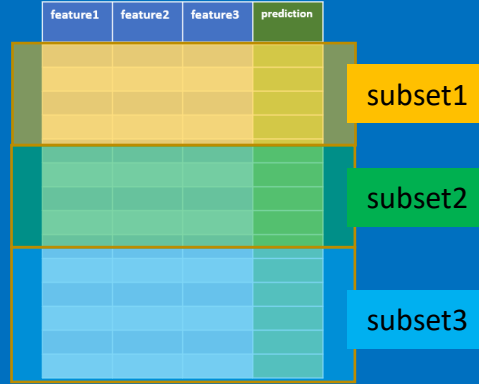
| feature1 | feature2 | feature3 | prediction |
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Assuming that we have the
above training dataset (e.g.,
14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

| feature1 | feature2 | feature3 | prediction |
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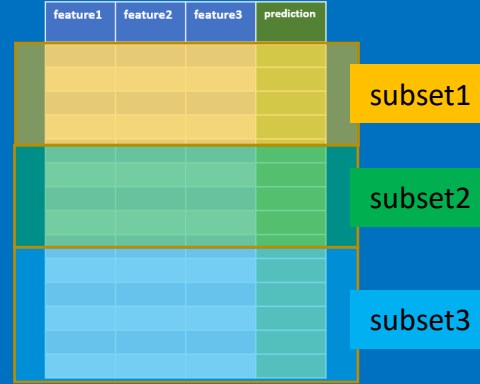


Assuming that we have the
above training dataset (e.g.,
14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

| feature1 | feature2 | feature3 | prediction |
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Fold 1:

- training data: subset1 subset2
- Testing data: subset3

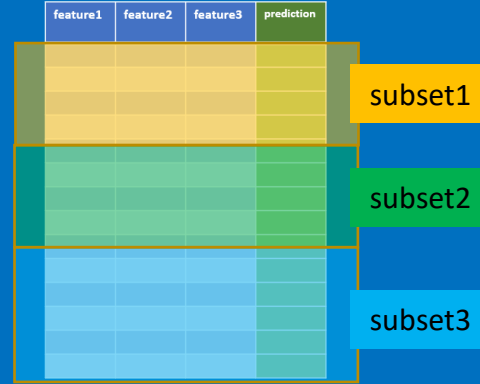
We can use 2 subsets for training and 1 subset for testing

Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

| feature1 | feature2 | feature3 | prediction |
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Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

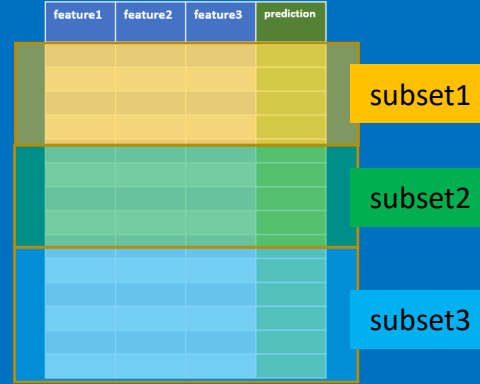
We can use 2 subsets for training and 1 subset for testing

Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

| feature1 | feature2 | feature3 | prediction |
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Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

Fold 3:

- training data: subset2 subset3
- Testing data: subset1

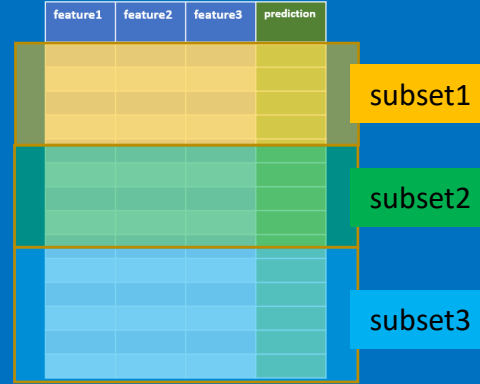
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Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

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| feature1 | feature2 | feature3 | prediction |
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Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

Fold 3:

- training data: subset2 subset3
- Testing data: subset1

We can use 2 subsets for training and 1 subset for testing

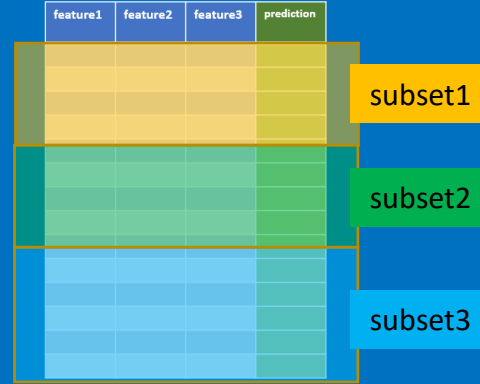
Step 2: train models and make prediction

Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

| feature1 | feature2 | feature3 | prediction |
|----------|----------|----------|------------|
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Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

Fold 3:

- training data: subset2 subset3
- Testing data: subset1

We can use 2 subsets for training and 1 subset for testing

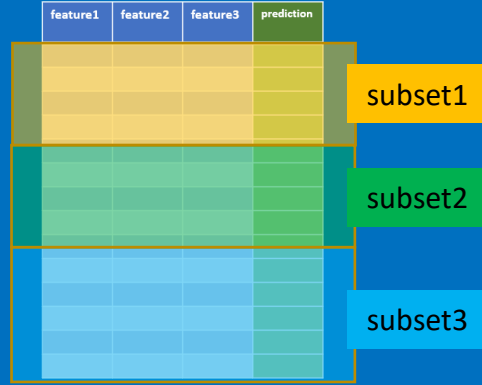
Step 2: train models and make prediction

For each fold, we have training data and testing data

Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

[illegible]

Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

Fold 3:

- training data:

| | |
|---------|---------|
| subset2 | subset3 |
| subset1 | |
- Testing data:

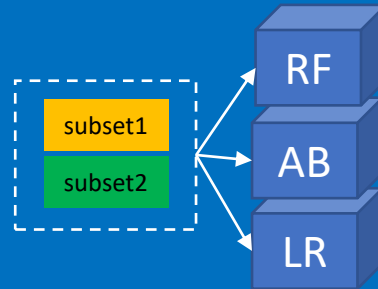
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We can use 2 subsets for training and 1 subset for testing

Step 2: train models and make prediction

For each fold, we have training data and testing data.

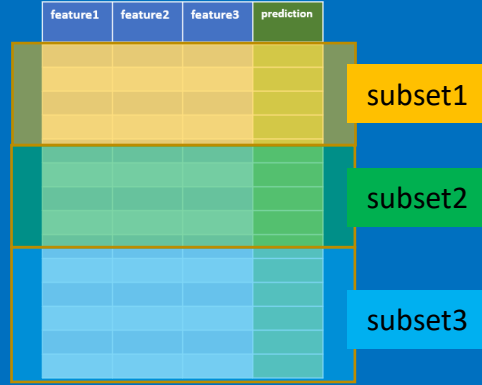
For example, for Fold1, we train 3 models: RF, AdaBoost and LR



Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

[illegible]

Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

Fold 3:

- training data:

| | |
|---------|---------|
| subset2 | subset3 |
| subset1 | |
- Testing data:

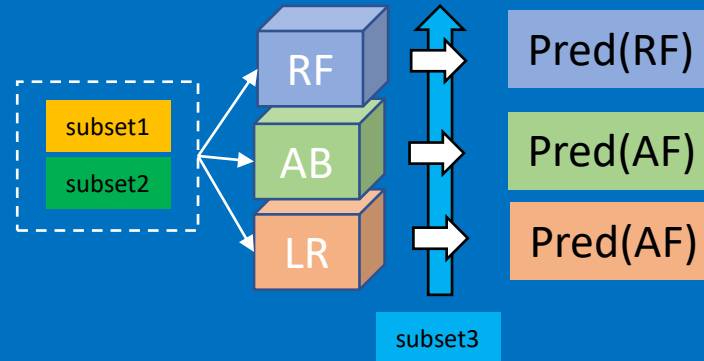
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We can use 2 subsets for training and 1 subset for testing

Step 2: train models and make prediction

For each fold, we have training data and testing data.

For example, for Fold1, we train 3 models: RF, AdaBoost and LR

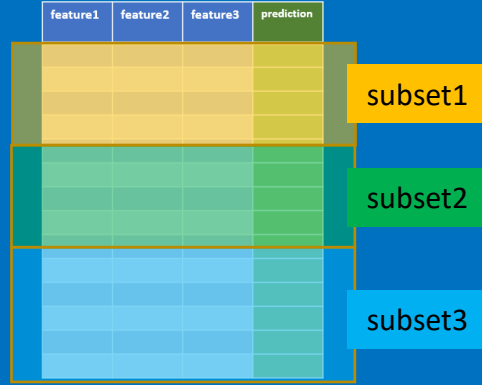


Then we apply testing data to the trained model and get the prediction

Assuming that we have the
above training dataset (e.g.,
14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

[illegible]

Fold 1:

- training data:

| | |
|---------|---------|
| subset1 | subset2 |
| subset3 | |
- Testing data:

| | |
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| subset3 | |
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Fold 2:

- training data:

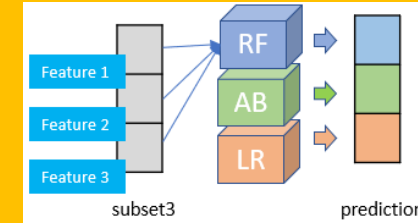
| | |
|---------|---------|
| subset1 | subset3 |
|---------|---------|
- Testing data:

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| subset2 | |
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Fold 3:

- training example, if subset3
- Testing have

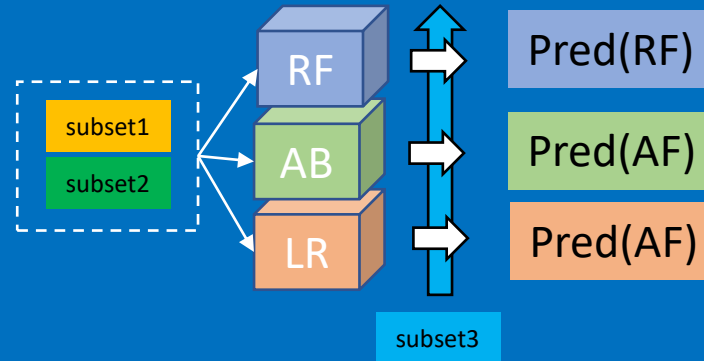
We can use 2 subsets for training and



Step 2: train models and make prediction

For each fold, we have training data and

For example, for Fold1, we train 3 mo

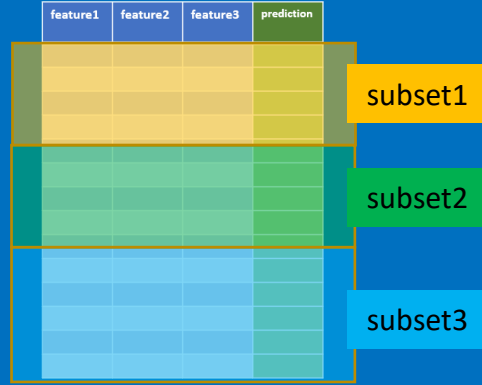


Then we apply testing data to the trained model and get the prediction

Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset

[illegible]

Fold 1:

- training data:

| | |
|---------|---------|
| subset1 | subset2 |
| subset3 | |
- Testing data:

| | |
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| subset3 | |
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Fold 2:

- training data:

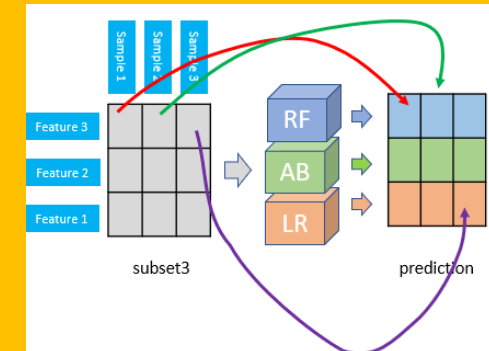
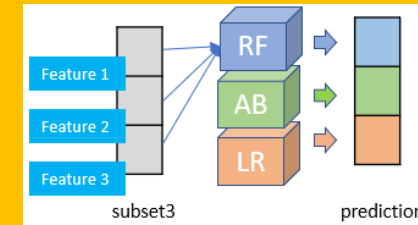
| | |
|---------|---------|
| subset1 | subset3 |
|---------|---------|
- Testing data:

| | |
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| subset2 | |
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Fold 3:

- training example, if subset3
- Testing have

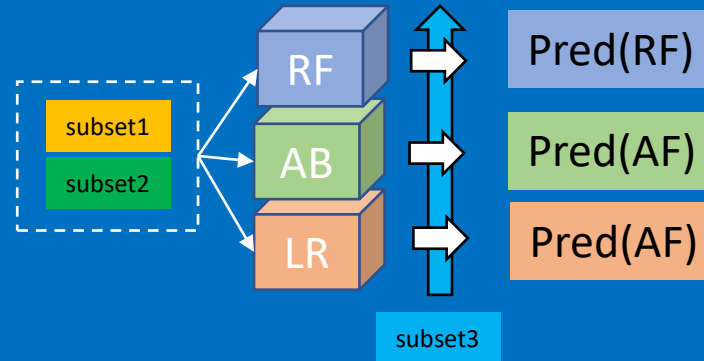
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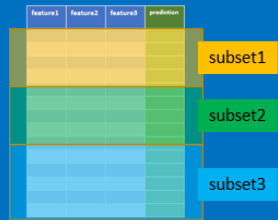


Then we apply testing data to the trained model and get the prediction

Assuming that we have the above training dataset (e.g., 14 samples, 3 features)

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset



Fold 1:

- training data: subset1 subset2
- Testing data: subset3

We can use 2 subsets for training and

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

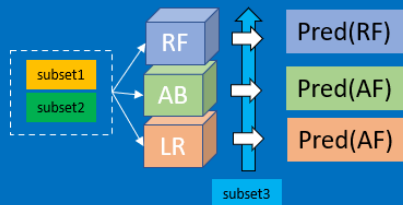
Fold 3:

- training data: subset2 subset3
- Testing data: subset1

Step 2: train models and make prediction

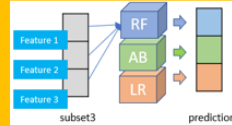
For each fold, we have training data and testing data

For example, for Fold1, we train 3 models

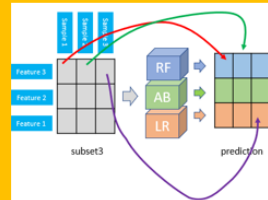


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Note that the predictions here are a matrix, for example, if subset3 only have one sample, then we have

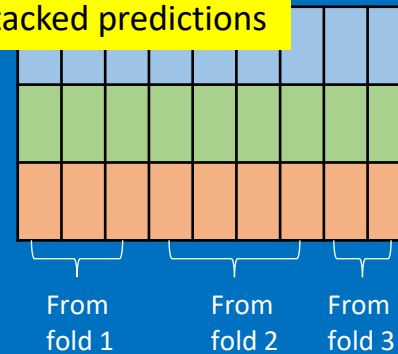


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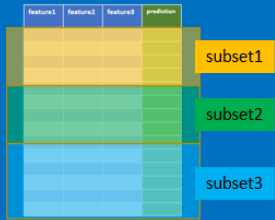
Step 3: we go through “step 2” for the rest fold2 and fold3, and we “stack” the predictions together

stacked predictions



Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset



Fold 1:

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- Testing data: subset3

We can use 2 subsets for training and

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

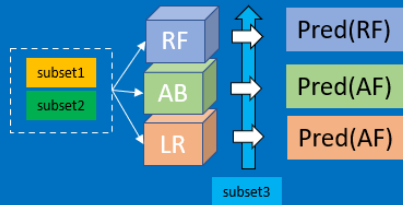
Fold 3:

- training data: subset2 subset3
- Testing data: subset1

Step 2: train models and make prediction

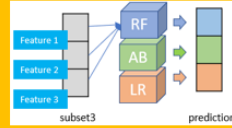
For each fold, we have training data and testing data

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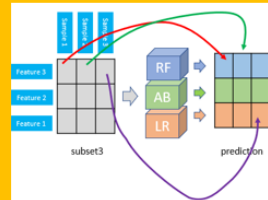


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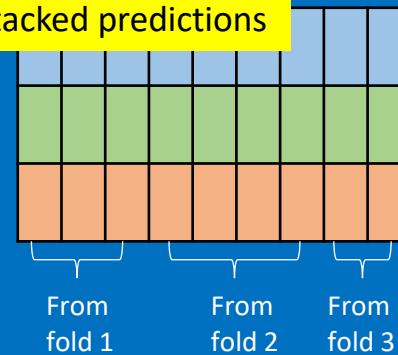


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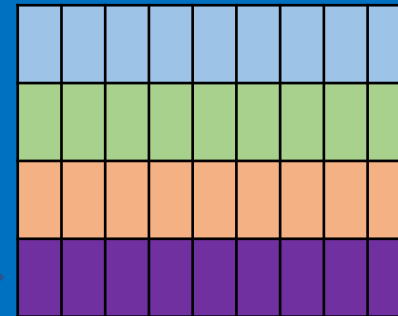


Step 3: we go through “step 2” for the rest fold2 and fold3, and we “stack” the predictions together

stacked predictions



Step 4: Then we attach the “truth” from the testing dataset to the predictions



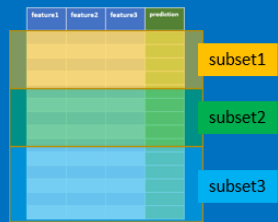
Prediction from RF

Prediction from AB

Prediction from LR

Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset



Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

Fold 3:

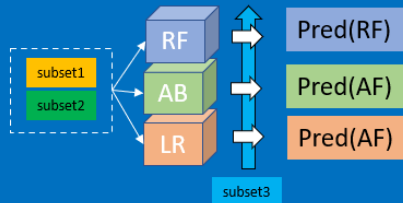
- training data: subset2 subset3
- Testing data: subset1

We can use 2 subsets for training and 1 subset for testing

Step 2: train models and make prediction

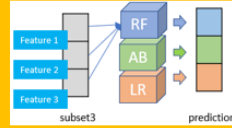
For each fold, we have training data and testing data

For example, for Fold1, we train 3 models

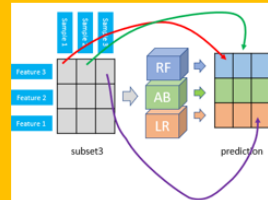


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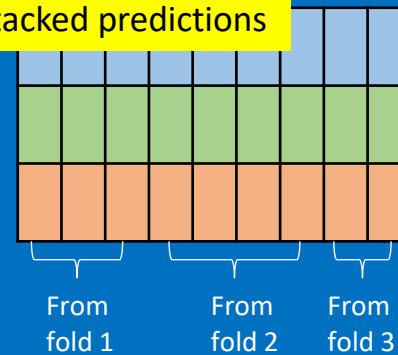


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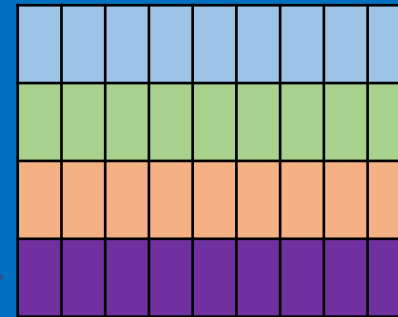
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stacked predictions



Step 4: Then we attach the “truth” from the testing dataset to the predictions

truth →



Prediction from RF
Prediction from AB
Prediction from LR

Three features correspond to three models: RF, AB and LR

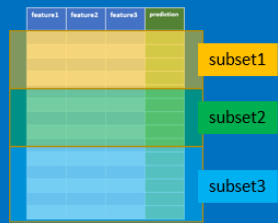
“truth”

Different samples



Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset



Fold 1:

- training data: subset1 subset2
- Testing data: subset3

We can use 2 subsets for training and

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

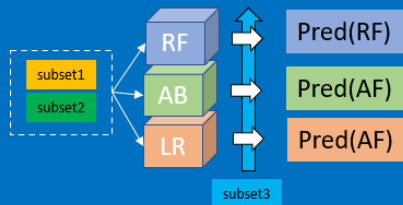
Fold 3:

- training data: subset2 subset3
- Testing data: subset1

Step 2: train models and make prediction

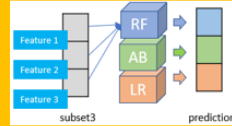
For each fold, we have training data and testing data

For example, for Fold1, we train 3 models

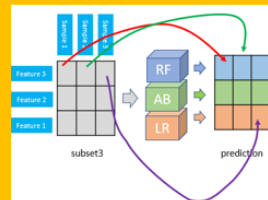


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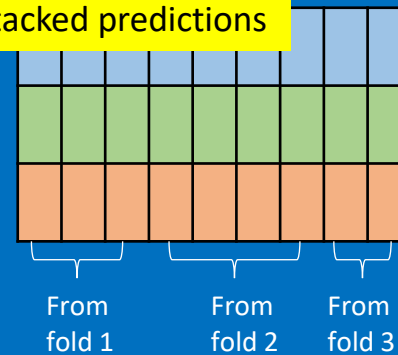


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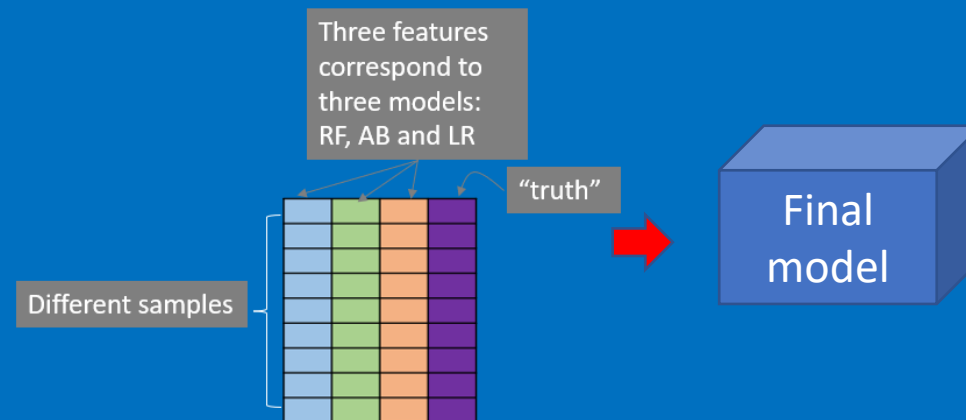
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stacked predictions



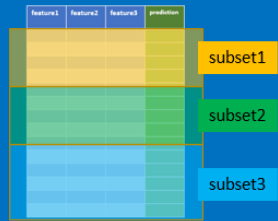
Step 4: Then we attach the “truth” from the testing dataset to the predictions

Step 5: We can use another model to “train” this new dataset



Step 1: Split training data to k folds

In this case let's assume $k=3$, so the training data will be split to 3 subset



Fold 1:

- training data: subset1 subset2
- Testing data: subset3

Fold 2:

- training data: subset1 subset3
- Testing data: subset2

Fold 3:

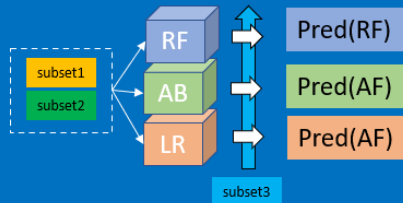
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We can use 2 subsets for training and

Step 2: train models and make prediction

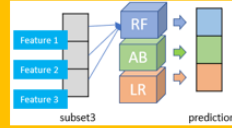
For each fold, we have training data and testing data

For example, for Fold1, we train 3 models

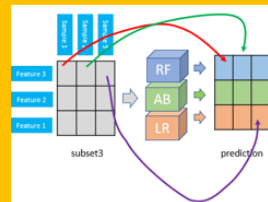


Then we apply testing data to the trained models and get the prediction

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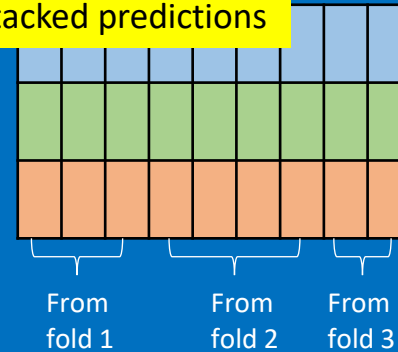


if subset3 have 3 sample, then we have the prediction as



Step 3: we go through “step 2” for the rest fold2 and fold3, and we “stack” the predictions together

stacked predictions



Step 4: Then we attach the “truth” from the testing dataset to the predictions

Step 5: We can use another model to “train” this new dataset

So if we have new testing data,

- first it will go through RF, AB and LR as usual
- Then we will have a prediction containing three individual predictions
- These 3 predictions will be treated as a completely new dataset, and being used in the “final” model to make the “final prediction”

