

Lecture 6: More Evaluation

Two reasons to evaluate:

- ① get measure of gen. performance
- ② model selection
 - choosing K for KNN
 - # covariates for OLS

Q: Can I use a test/train split to do this?
(equiv. X-validation)

A: Yes, but need to be careful.

Proper way to do this: split data into 3 sets

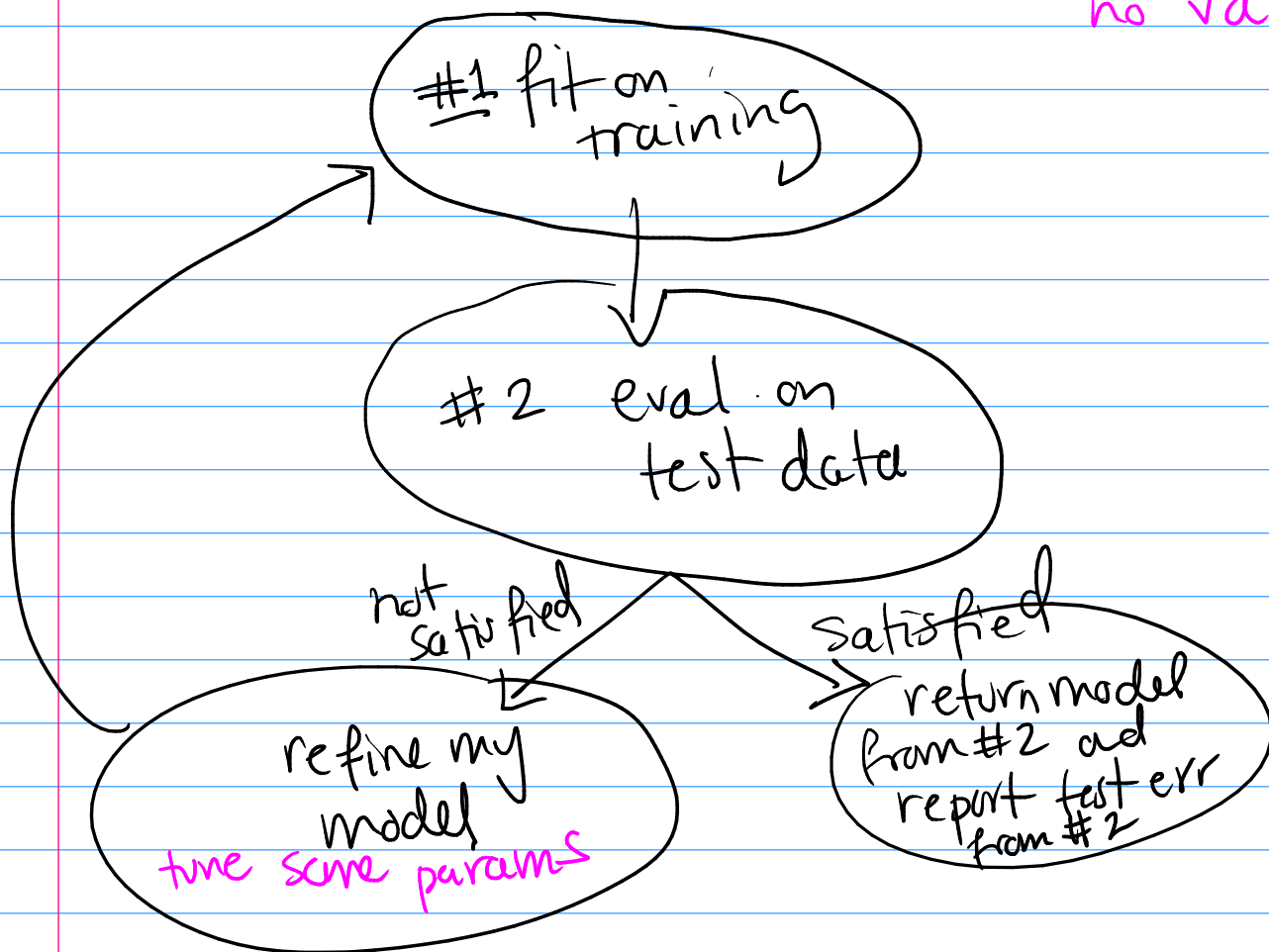
① training data : directly used to fit model
(e.g. min RSS over training)

② Validation data
used to select among my models
(e.g. choose K)

③ test data to estimate gen. perf. of final model

Why do I need sep. val / test?

Ex. model building process w/ just a train/test no val.



Need to avoid: can't let my MBP see or be influenced by test data

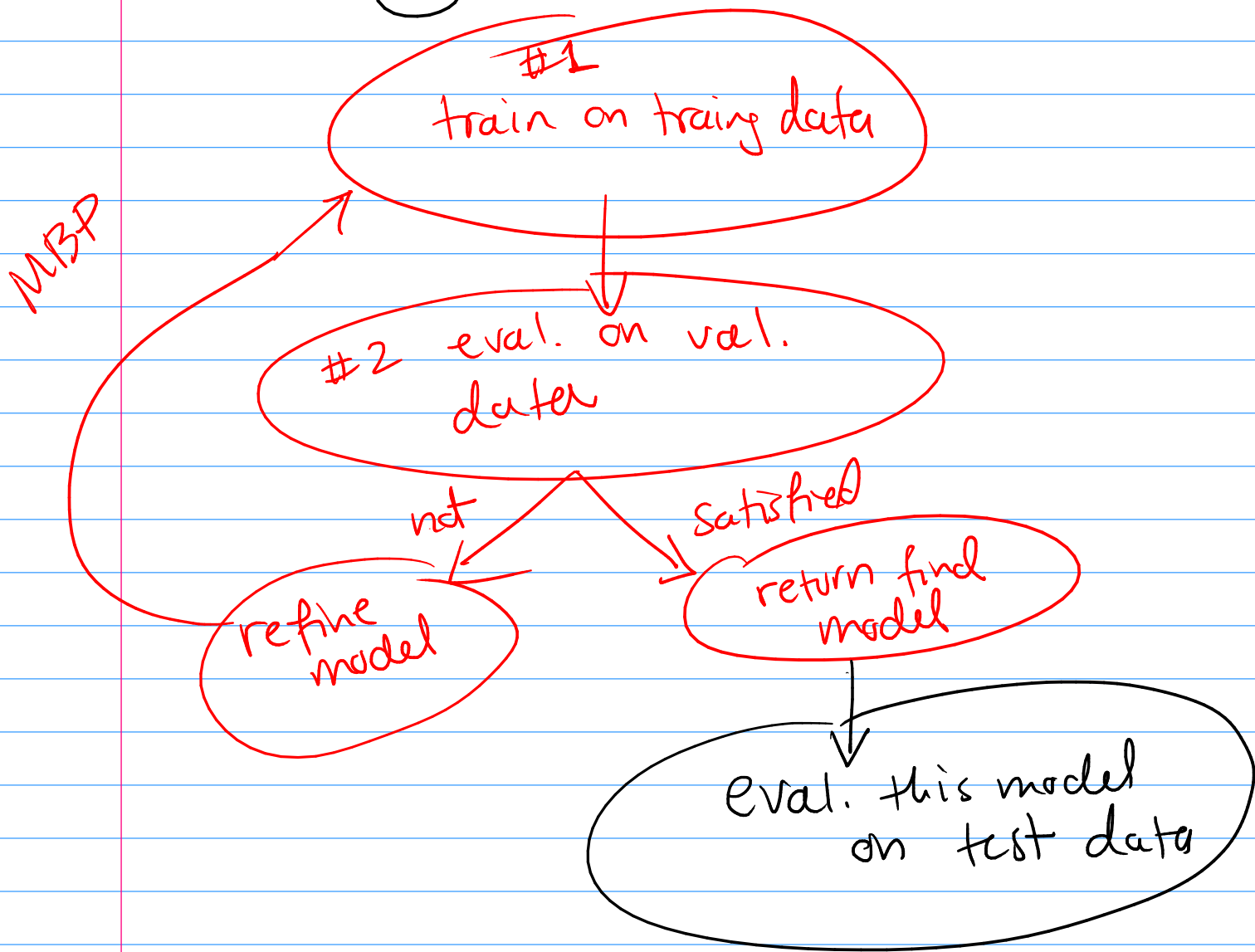
Q: Does my MBP see the test data?

A: Yes, basically hard-fitting my model.
The refinement is directly influenced by test err.

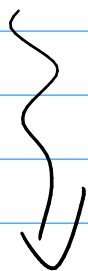
Still need a true "hold-out" data set.

Consequently split into 3:

- ① train
- ② val.
- ③ test.



Ex. choosing K for KNN



Split data into train/test/val

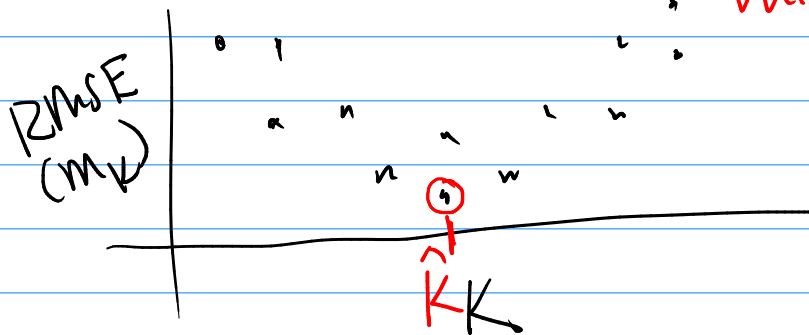
For K in K -seq

- ① train on training using K neighbors
- ② eval on val.

$$m_K = \text{RMSE of val preds}$$

END

$$\hat{K} = \underset{K}{\operatorname{argmin}} m_K = \text{choose val } K \text{ that has min val. err.}$$



THEN fit KNN using \hat{K} and all of the train/val. data and eval. this on test data.

↳ gives some est. of err for this MBP

Q: Can I do this in a X-val. way?
Yes, called nested x-val.

Split data into I folds

For $i=1, \dots, I$

→ hold out fold i for testing

→ use rest for train/val

→ split train/val into J folds

For $j=1, \dots, J$

→ hold out j th fold for val.

→ use rest for train

Fit my model

For K to K_{\max}

→ fit KNN on train w/ K neighbors

→ evl. on val.

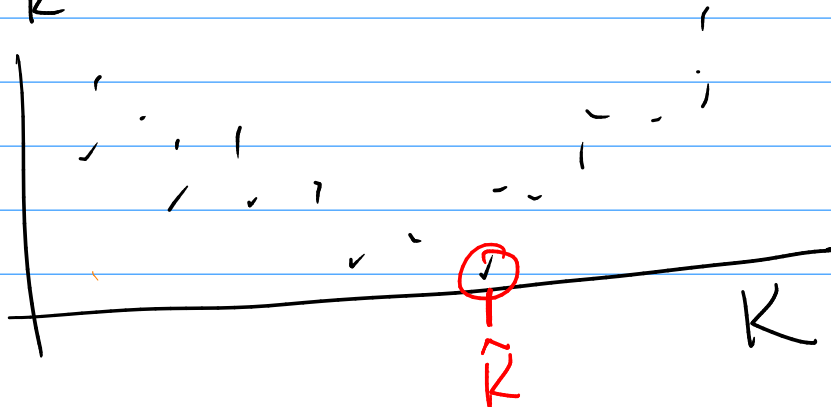
→ $m_{jk} = \text{RMSE}$

END

END

→ $m_k = \text{mean}(m_{jk})$

x-val.
val.
err



→ $\hat{k} = \underset{k}{\operatorname{argmin}} m_k$

MBP → fit using \hat{k} on all my combined train/val.

→ eval on test data $\rightsquigarrow M_i$

END

End up w/ M_1, \dots, M_I

maybe report $\operatorname{mean}(M_i)$

↑ Best. of gen-perf.
for my MBP