

tinyurl.com/edmlpr

↑ (Try refreshing the page)

Tutorials:

- 1st sheet up
- Meetings next week

(Groups MyEd + Learn,
may have to change some...)

- Answers released
end of next week

Hypothesis Forum

- Share links, code snippets

- Get code review

- Ask Questions

- Post Answers

help others
get feedback

code

Lecture theatres after today

Tuesdays 9am:

Appleton Tower LT5

Wednesdays 9am:

David Hume Tower LTs, LTA

Lecture theatres behind

Thursdays 9am: DHT itself

Appleton Tower LT5

Linear Regression Reminders

2019
L4 (3)

Model $f(\underline{x}) = \underline{w}^T \underline{\phi}(\underline{x})$

Can minimize

$$\underbrace{\sum_n (y^{(n)} - \underline{w}^T \underline{\phi}(x^{(n)}))^2}_{= (y - \Phi \underline{w})^T (y - \Phi \underline{w})} \text{ wrt } \underline{w}$$

$$\underline{\phi}(\underline{x}) = [\phi_1(\underline{x}) \quad \phi_2(\underline{x}) \quad \dots \quad \phi_k(\underline{x})]^T$$

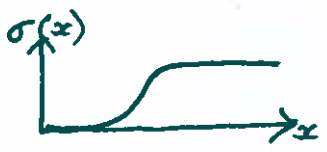
$\phi_k(\underline{x})$ any scalar function

- Monomial, eg $x_2, x_3 x_4^3, \dots$

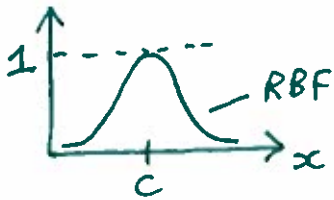
- RBF



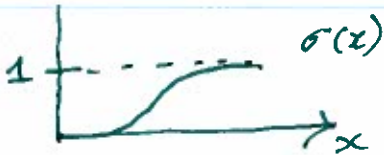
- Sigmoid



Why are large weights bad?

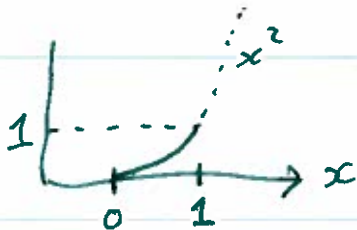


If \underline{w} are bounded
then function
is bounded

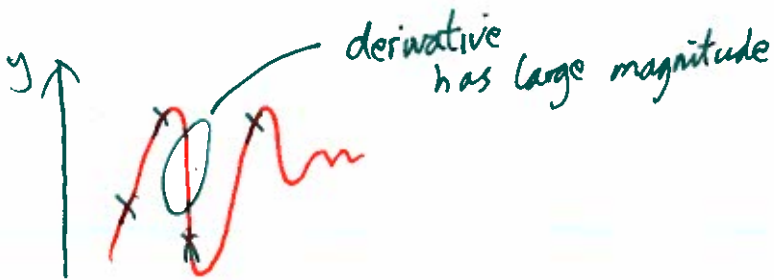


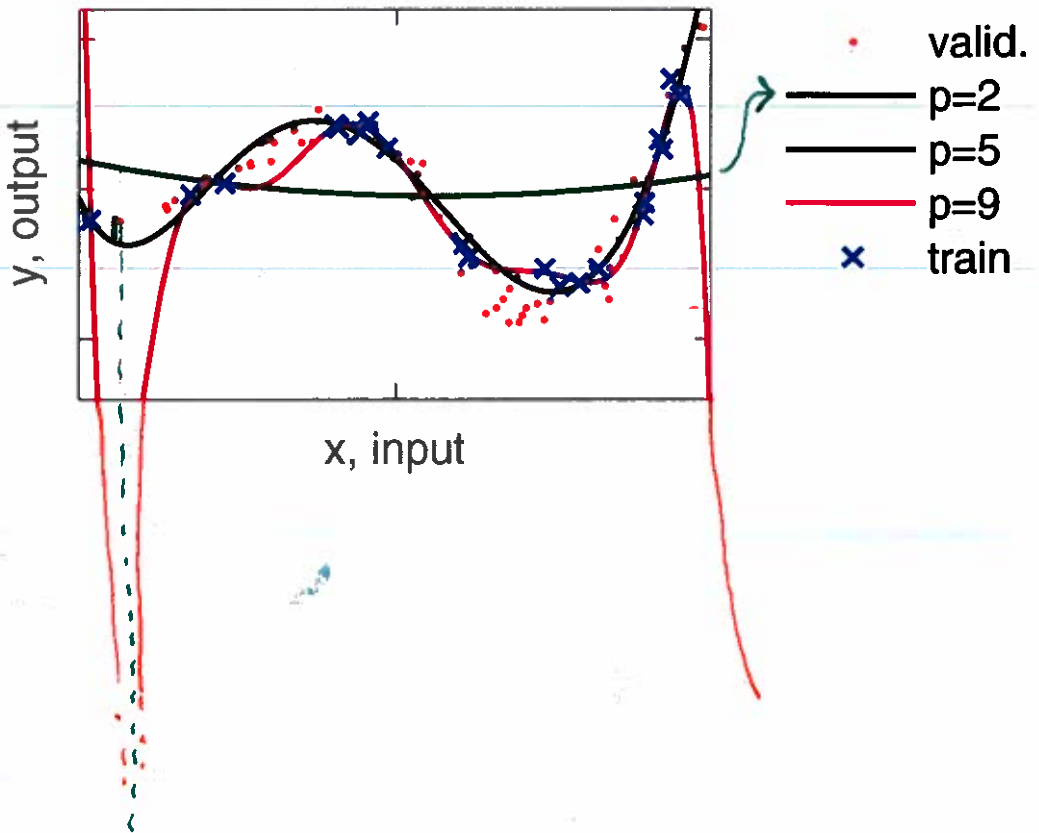
$$f(x; \underline{w}) = \sum_k w_k \phi_k(x)$$

$$\leq \sum_k |w_k| \underbrace{|\phi_k(x)|}_{\leq 1 \text{ often}}$$

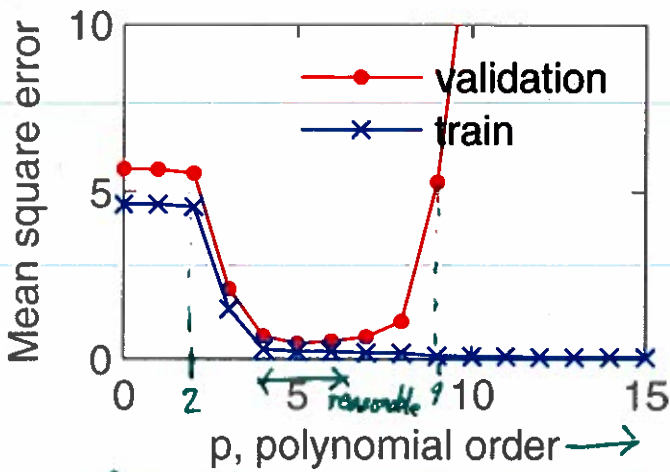


$$\leq \sum_k |w_k|$$





2019 L4 ⑤



← underfitting → overfitting

λ ← → 0

Generalization

$$E_{gen} = \mathbb{E}_{p(\underline{x}, y)} [L(y, f(\underline{x}))]$$

↑ Loss function
↑ Assuming there is some fixed distribution on future inputs & outputs

$$= \iint L(y, f(\underline{x})) p(\underline{x}, y) d\underline{x} dy$$

$$OR = \sum_{\underline{x}} \sum_y L(y, f(\underline{x})) p(\underline{x}, y)$$

Monte Carlo $\left\{ \begin{array}{l} \text{unbiased} \\ \text{approximation} \end{array} \right.$

$$\approx \frac{1}{M} \sum_{m=1}^M L(y^{(m)}, f(\underline{x}^{(m)}))$$

$$y^{(m)}, \underline{x}^{(m)} \sim p(\underline{x}, y)$$

Draw samples from a held out test set.

Data Splits

Training Set: used to fit w

Couldn't use (yet): to fit:

- Order polynomial
- # RBFs, # $\sigma(x)$
- Regularization constant, λ

Validation Set:

(Dev. set)

To "fit" λ , model choices

Test Set:

Use to report an estimate of generalization error.

Reading: Kaggle blog.