

Laplace Smoothing

$$P(A|B) = \frac{P(B|A) P(A)}{P(B)}$$

$P(B)$

$$P(C=1 | w_i) \propto \frac{P(w_i | C=1)}{P(C=1)}$$

"let's get together for drinks!"

$$P(W_i | C=1) =$$

$$P(\text{lets, get, together..} | C=1) =$$

$$\Rightarrow P(\text{lets} | C=1) \cdot P(\text{get} | C=1)$$

$$\cdot P(\text{together} | C=1)$$

$$P(\text{lets} | C=1) = \frac{0}{1000}$$

(C=1)
In Span words
there are 1000
words

$$P(\text{get} | C=1) = \frac{10}{1000}$$

$$\rightarrow P(\text{together..} | C=1) = \frac{2}{1000}$$

$$\left(\frac{0}{1000}\right) \left(\frac{10}{1000}\right) \left(\frac{2}{1000}\right) \quad p(c=1|c=1)$$

K

$$p(c=1|w_i) = d$$

$$p(c=1|w_i) = \frac{\text{Count of word } w_i + 1}{\text{total words in class} + K} \quad (\# \text{ of } c)$$

$$K=1$$

$$\frac{0+1}{1000+(1)(2)} = \left(\frac{1}{1002}\right) \left(\frac{12}{1002}\right) \left(\frac{4}{1002}\right)$$

: -

'publication pending payment'.

$$P(C=1 | w_i)$$

$$P(w_i | C=1) = P(\text{publication} | C=1),$$

$$P(\text{pending} | C=1) = P(\text{payment} | C=1)$$

$$\left(\frac{30}{1000} \right)$$

$$\left(\frac{100}{1000} \right)$$

$$\left(\frac{0}{1000} \right)$$

Decision Trees

- divide & conquer
- will an attack be a bombing or an assassination?

Region = 1, Day = 1

Weapon = Fire arm

Attack type ?

Trans

<u>Region</u>	<u>Day</u>	<u>Weapon</u>	<u>Attack</u>
1	1	F	Assn
2	2	B	Assn
1	3	F	Born
1	1	F	Assn
2	2	F	Assn
1	1	B	Born
2	2	B	Assn

S_1 (Region, Day)
 S_2 (Day, Weapon)
 S_3 (Region, Day)

5 Assn / 2

5 Ash / 2 Bom

Region

input subset

2/2 (1)

(2) 3/0 Ash

Day

Decision Tree Classifier

2/1

0/1

1

3

Bom

Weapon

F 2/0

Ash

B d/1

Bom

Region = 1

Day = 1

Weapon = F

predicted

Attach

Ash

Problems w/ Decision Trees

↳ overfitting - saved by pruning

Random Forest Algorithm

- randomly select subsets of the training data and...
- subsets of the features,
- grow trees for each subset
- use the majority vote to make class

Random

S_1

Region



Bom

Assn Assn

Assn

Fur as

S_2

Weapon



Bom

Bom Assn Assn

Bom

Region 1 - Test
Pun
Weapon F

S_3

Day



Assn

Bom

Assn

Bom

Vote? $P(\text{Assn} | \text{Trees}) = \frac{2}{3}$



$$P(\text{Ban} | \text{Trees}) = \frac{1}{3}$$

Assn wins majority
vote

→ Parameters

① Depth

② max trees