

Naive Bayes Practice

$B = (\text{outlook} = \text{overcast}, \text{temp} = \text{Mild}, \text{humidity} = \text{Normal}, \text{wind} = \text{Strong})$

$A = \text{Play} = \text{No}$

Data set in slides 16 to 17  
if we create  $\rightarrow$  table.

we find  $P(A|B)$

in marginal probability

we see in which

involves one variable (Fail or Pass)

Then we see joint probability  
in which we see

intersection between two

variables (e.g. Two dice roll)

$(A \cap B)$

Then we see conditional  
probability of Random  
variable given some  
evidence

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

$$\nwarrow P(B)$$

$$\underbrace{P(A|B), P(B)}_{\text{we see in childhood}} = P(A \cap B)$$

we see in childhood

$$A \cap B = B \cap A$$

$$\text{So } P(B|A) P(A) = P(B|A)$$

Supervised learning because labelled data  
Classification because we have classes  
and discrete label.

$$P(A \cap B) = P(B \cap A)$$

$$P(A \cap B) / P(B) = P(B | A) / P(A)$$

Likelihood

Prior

$$P(A | B) = \frac{P(B | A) P(A)}{P(B)} \quad (1)$$

Posterior Evidence

So it's called Bayes Rule

Solve (Note: No and Yes is class)

$$\Rightarrow P(\text{Play} = \text{No} | \text{outlook} = \text{overcast}, \text{temp} = \text{Mild})$$

(11), humidity = Normal, wind = Strong)

$$\Rightarrow P(\text{Play} = \text{Yes}) \approx " \approx ?$$

: : : : )

Now For No. class

we put (11) in (1)

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

$$= P(\text{outlook} = \text{overcast}, \text{temp} = \text{Mild}, \text{humidity} = \text{Normal}, \\ \text{wind} = \text{Strong} | \text{Play} = \text{No}), P(\text{Play} = \text{No})$$

$$P(\text{outlook} = \text{overcast}, \text{temp} = \text{mild}, \text{humidity} = \text{Normal}, \\ \text{wind} = \text{Strong})$$

After Putting in  
Bayes Rule we go  
to on Naive Assumption.

Naive said Every feature  
have independent to each  
other, So, we compute  
given Probability separate feature  
with their class.

$$P(A|B) = P(\text{outlook}=\text{overcast} | \text{Play}=\text{No}) * \\ P(\text{temp}=\text{Mild} | \text{Play}=\text{No}) * P(\text{humidity}=\text{Normal} | \text{Play}=\text{No}) * P(\text{wind}=\text{Strong} | \text{Play}=\text{No}) * P(\text{wind}=\text{Weak} | \text{Play}=\text{Yes})$$

P(outlook=overcast, temp=Mild, humidity=Normal,  
wind=Strong)

We, compute tables  
separate independent feature  
with the class.

Then we put easily  
probabilities in  
formula and predict  
class.

outlook	Play=Yes	Play=No
Sunny	2/4	3/5
Overcast	4/4	1/5
Rain	3/4	2/5

so we see in question we have  
given outlook = overcast for

No class here is 0/5.

if we put 0/5 in formula  
then multiply with all  
and Total Ans going to

Zero. So we avoid to

zero we use laplace

smoothing with the all  
features whole presence  
in formula give.

If we use smoothing  
laplace with only 0/5

term then we break

the rule of probability

So, we computing laplace  
for all features given in formula

So go back and compute  
table of separate features.

temp	Play=Yes	Play=No
Hot	2/9	2/5
Mild	4/9	2/5
Cool	3/9	1/5

Humidity	Play=Yes	Play=No
High	3/9	4/5
Normal	6/9	1/5

Wind	Play=Yes	Play=No
Weak	6/9	2/5
Strong	3/9	3/5

No <sup>we</sup> See Laplace Smoothing  
for outlook feature for

No class

$$= \frac{0 + \lambda}{5 + K\lambda}$$

Here  $\lambda$  is assumption  
we assume  $\lambda = 1$

and  $K$  is ~~fixed~~  
~~and~~ different values in  
feature.

In outlook we have only  
Three values comes ~~sum~~

$$(\text{Sunny}, \text{Overcast}, \text{Rain}) = 3$$

$$= \frac{0 + 1}{5 + 3(1)} = \frac{1}{8}$$

Little Note about Laplace  
we Play Win = label class  
feature.

$$P(\text{Play} = \text{No}) = \frac{5}{14} \text{ After Laplace}$$

$$\frac{5+1}{14+2(1)} = \frac{6}{16}$$

$$P(\text{Play} = \text{Yes}) = \frac{9}{14} \text{ After Laplace}$$

$$\frac{9+1}{14+2(1)} = \frac{10}{16}$$

without Smoothing

$$= \frac{5}{14} + \frac{9}{14}$$

$$= \frac{14}{14} = 1$$

with Smoothing

$$= \frac{6}{16} + \frac{10}{16}$$

$$= \frac{16}{16} = 1$$

~~Smoothing and without smoothing~~  
Ans is 1 of Label  
class. So, we don't break  
rule we are good.

go back and find ~~P~~  
Smoothing of temp feature  
according formula -

$$P(\text{temp=mild} | \text{play}=\text{No}) = \frac{2+1}{5+3(1)} = \frac{3}{8}$$

$$P(\text{humidity=Normal} | \text{play}=\text{No}) = \frac{1+1}{5+2(1)}$$

$$= \frac{2}{7}$$

$$P(\text{wind=strong} | \text{play}=\text{No}) = \frac{3+1}{5+2(1)}$$

$$= \frac{4}{7}$$

go back - IV

$$P(A|B) = P(\text{Outlook} = \text{overcast} | \text{Play} = \text{No}) * P(\text{temp} = \text{Mild} \\ * P(\text{Play} = \text{No}) * P(\text{humidity} = \text{Normal} | \text{Play} = \text{No}) \\ * P(\text{Wind} = \text{Strong} | \text{Play} = \text{No}) P(\text{Play} = \text{No})$$

→  $P(B)$   $\because$  if we compute

Put values in.

MLE we  
Solve only this

$$= \frac{1}{8} * \frac{3}{8} * \frac{2}{7} * \frac{4}{7} * \left( \frac{6}{16} \right)$$

(first we ignore denominators we compute upper term first)

$$\frac{0.125 * 0.375 * 0.2857 * 0.57 * 0.375}{0.024 + 0.0028}$$

$$= \frac{0.0028}{0.0268} = 0.1094$$

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denominators fill after compute  
the Ans of play=Yes class

because denominator is  
Sum <sup>Ans</sup> of all classes.

So play = Yes

$$P(A|B) = P(\text{outlook} = \text{overcast} | \text{play} = \text{Yes}) * \\ \underbrace{\{ P(\text{temp} = \text{Mild} | \text{play} = \text{Yes}) * \\ P(\text{Humidity} = \text{Normal} | \text{play} = \text{Yes}) * \\ P(\text{Wind} = \text{Strong} | \text{play} = \text{Yes}) \}}_{P(\text{play} = \text{Yes})} \\ \rightarrow P(B)$$

Firstly Computing smoothing  
of features according  
to Yes class

$$P(\text{outlook} = \text{overcast} | \text{play} = \text{Yes}) \\ = \frac{4 + 1}{9 + 3(1)} = \frac{5}{12}$$

$$P(\text{temp} = \text{Mild} | \text{play} = \text{Yes})$$

$$= \frac{4 + 1}{9 + 3(1)} = \frac{5}{12}$$

$$P(\text{humidity} = \text{Normal} | \text{play} = \text{Yes})$$

$$= \frac{6 + 1}{9 + 2(1)} = \frac{7}{11}$$

$$P(\text{wind} = \text{Strong} | \text{Play} = \text{Yes})$$

$$= \frac{3 + 1}{9 + 2(1)} = \frac{4}{11}$$

Put values in — (v) NIF MAP

$$= \frac{\frac{5}{12} \times \frac{5}{12} \times \frac{7}{11} \times \frac{4}{11} \times \frac{10}{16}}{0.024 + 0.0028}$$

$$= \frac{0.41 \times 0.41 \times 0.63 \times 0.363 \times 0.625}{0.0268}$$

$$= \frac{0.024}{0.0268} = \underline{\underline{0.8955}}$$

So, over  $P(A|B)$  — Play = Yes

Because 0.89 probability of Yes and 0.10 for No

Solve Done Naive Bayes  
with Laplace Smoothing

Intelligent