

# 기계학습원론 HW5

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모든 문제에서 naïve Bayesian classifier의 가정을 참고하여 class(yes/no)가 주어졌을 때, 각 Input들(Outlook과 같은 속성)은 서로 independent하다고 가정했습니다. 그리고 Temp 값은 숫자형 데이터로 Gaussian distribution을 따른다고 가정했습니다.

또한, 수동으로 계산이 힘든 점을 고려해서 yes/no 클래스 별 데이터의 Temp값의 평균, 표준편차와  $P(T=25|yes)$ ,  $P(T=25|no)$ ,  $P(T=20|yes)$ ,  $P(T=20|no)$ ,  $P(T=24|yes)$ ,  $P(T=24|no)$ 의 확률을 파이썬 프로그램을 통해 구했습니다.

그리고 S-wind, W-wind의 확률(1번 발생할 확률)은 수동으로 yes/no 클래스 별 S-wind의 개수/전체 wind의 개수, W-wind의 개수/전체 wind의 개수로 구했습니다.

```
Python > test.py > calc_mean_std
1  import math
2
3  def calc_mean_std(data):
4      n = len(data)
5      mean = sum(data) / n
6      variance = sum((x - mean) ** 2 for x in data) / (n-1)
7      std_dev = math.sqrt(variance)
8      return mean, std_dev
9
10 def calc_probability(x, mu, sigma):
11     exponent = math.exp(-((x - mu) ** 2) / (2 * sigma ** 2))
12     probability = (1 / (math.sqrt(2 * math.pi) * sigma)) * exponent
13     return probability
14
15 nodata = [30,31,13,25,20,18]
16 yesdata = [28,23,10,14,15,22,19,33]
17
18 yesmean, yesstd = calc_mean_std(yesdata)
19 nomean, nostd = calc_mean_std(nodata)
20
21 problem1y = calc_probability(25, yesmean, yesstd)
22 problem1n = calc_probability(25, nomean, nostd)
23 problem2y = calc_probability(20, yesmean, yesstd)
24 problem2n = calc_probability(20, nomean, nostd)
25 problem3y = calc_probability(24, yesmean, yesstd)
26 problem3n = calc_probability(24, nomean, nostd)
27
28 print("problem1 Temp yes probability : ", problem1y)
29 print("problem1 Temp no probability : ", problem1n)
30 print("problem2 Temp yes probability : ", problem2y)
31 print("problem2 Temp no probability : ", problem2n)
32 print("problem3 Temp yes probability : ", problem3y)
33 print("problem3 Temp no probability : ", problem3n)
```

문제 출력 디버그 콘솔 터미널 포트

+ cmd

```
C:\Users\kksh3\OneDrive\바탕 화면\VSCode\Python>python test.py
problem1 Temp yes probability : 0.043992812794088225
problem1 Temp no probability : 0.053750494404141744
problem2 Temp yes probability : 0.05227091344534292
problem2 Temp no probability : 0.051994101207002215
problem3 Temp yes probability : 0.04713386723608115
problem3 Temp no probability : 0.05556621965994455
```

1. Overcast, T=25, Normal, s-wind=3, w-wind=2 => yes

1. overcast, T=25, Normal, s-wind=3, w-wind=2 → yes과 no의 차이

$$\begin{aligned}
 k_1 &= p(\text{yes} | \text{overcast}, T=25, \text{Normal}, \text{SW}=3, \text{WW}=2) \text{ 라는 뜻이다} \\
 &= \frac{p(\text{overcast}, T=25, \text{Normal}, \text{SW}=3, \text{WW}=2 | \text{yes}) p(\text{yes})}{p(\text{overcast} | \text{yes}) p(T=25 | \text{yes}) p(\text{Normal} | \text{yes}) p(\text{SW}=3, \text{WW}=2 | \text{yes}) p(\text{yes})} \\
 &= \frac{p(\text{overcast}, T=25, \text{Normal}, \text{SW}=3, \text{WW}=2)}{p(\text{overcast} | \text{yes}) p(T=25 | \text{yes}) p(\text{Normal} | \text{yes}) p(\text{SW}=3, \text{WW}=2 | \text{yes}) p(\text{yes})}
 \end{aligned}$$

$$\Rightarrow p(\text{yes}) = \frac{8}{14}$$

$$p(\text{overcast} | \text{yes}) = \frac{3}{8}$$

$$p(T=25 | \text{yes}) = 0.044 \quad \leftarrow \text{소수점 3자리까지 표현}$$

$$p(\text{Normal} | \text{yes}) = \frac{6}{8}$$

$$p(\text{SW}=3, \text{WW}=2 | \text{yes}) = 5 \left( 3 \times \left( \frac{15}{35} \right)^3 \times \left( \frac{20}{35} \right)^2 \right)$$

$$p(\text{overcast}, T=25, \text{Normal}, \text{SW}=3, \text{WW}=2) = \alpha \text{라고 가정 (분모)}$$

$$\therefore k_1 = \frac{0.0018}{\alpha}$$

wind의 확률

	SW	WW
No	16/31	15/31
Yes	15/35	20/35

$k_2 = p(\text{no} | \text{overcast}, T=25, \text{Normal}, \text{SW}=3, \text{WW}=2) \text{ 라는 뜻이다}$

$$= \frac{p(\text{overcast}, T=25, \text{Normal}, \text{SW}=3, \text{WW}=2 | \text{no}) p(\text{no})}{p(\text{overcast} | \text{no}) p(T=25 | \text{no}) p(\text{Normal} | \text{no}) p(\text{SW}=3, \text{WW}=2 | \text{no}) p(\text{no})}$$

$$= \frac{p(\text{overcast}, T=25, \text{Normal}, \text{SW}=3, \text{WW}=2)}{p(\text{overcast} | \text{no}) p(T=25 | \text{no}) p(\text{Normal} | \text{no}) p(\text{SW}=3, \text{WW}=2 | \text{no}) p(\text{no})}$$

$$p(\text{no}) = \frac{6}{14} \quad p(\text{overcast} | \text{no}) = \frac{1}{6} \quad p(T=25 | \text{no}) = 0.054 \quad p(\text{Normal} | \text{no}) = \frac{1}{6}$$

$$p(\text{SW}=3, \text{WW}=2 | \text{no}) = 5 \left( 3 \times \left( \frac{16}{31} \right)^3 \times \left( \frac{15}{31} \right)^2 \right), \text{ 분모} = \alpha \text{ (yes의 경우와 같음)}$$

$$\therefore k_2 = \frac{0.000207}{\alpha}$$

$\therefore k_1 > k_2$  이므로 yes로 분류됨!

2. Rain, T=20, High, s-wind=0, w-wind=3 => no

2. Rain, T=20, High, SW=0, WW=3

1번문제와 같은 과정을 통해  $k_1$  (yes일때 확률),  $k_2$  (no일때 확률)을

구해 비교해보겠습니다.

$$k_1 = \frac{p(\text{yes}) p(\text{Rain}|\text{yes}) p(T=20|\text{yes}) p(\text{High}|\text{yes}) p(\text{sw}=0, \text{ww}=3|\text{yes})}{p(\text{Rain}, T=20, \text{High}, \text{sw}=0, \text{ww}=3)}$$

$$p(\text{Rain}, T=20, \text{High}, \text{sw}=0, \text{ww}=3) = \alpha \text{가정}$$

$$p(\text{yes}) = \frac{8}{14}$$

$$p(\text{Rain}|\text{yes}) = \frac{3}{8}$$

$$p(T=20|\text{yes}) = 0.052$$

$$p(\text{High}|\text{yes}) = \frac{3}{8}$$

$$p(\text{sw}=0, \text{ww}=3|\text{yes}) = {}_3C_3 \times \left(\frac{20}{35}\right)^3 \Rightarrow k_1 = \frac{0.000519..}{\alpha}$$

$$k_2 = \frac{p(\text{no}) p(\text{Rain}|\text{no}) p(T=20|\text{no}) p(\text{High}|\text{no}) p(\text{sw}=0, \text{ww}=3|\text{no})}{p(\text{Rain}, T=20, \text{High}, \text{sw}=0, \text{ww}=3)}$$

$$p(\text{Rain}, T=20, \text{High}, \text{sw}=0, \text{ww}=3) = \alpha \text{가정}$$

$$p(\text{no}) = \frac{6}{14}$$

$$p(\text{Rain}|\text{no}) = \frac{2}{6}$$

$$p(T=20|\text{no}) = 0.052$$

$$p(\text{High}|\text{no}) = \frac{5}{6}$$

$$p(\text{sw}=0, \text{ww}=3|\text{no}) = {}_3C_3 \times \left(\frac{15}{31}\right)^3$$

$$\Rightarrow k_2 = \frac{0.000701..}{\alpha}$$

$\therefore k_1 < k_2$  이므로 no로 분류됨!

{wind의 확률}

	sw	ww
No	$\frac{16}{31}$	$\frac{15}{31}$
Yes	$\frac{15}{35}$	$\frac{20}{35}$

3. Sunny, T=24, Normal, s-wind=4, w-wind=4 => yes

3. Sunny, T=24, Normal, SW=4, WW=4

1번문제와 같은 과정을 통해  $k_1$  (yes일때 확률),  $k_2$  (no일때 확률)를 구해 비교해보겠습니다.

$$k_1 = \frac{P(\text{yes}) P(\text{sunny} | \text{yes}) P(T=24 | \text{yes}) P(\text{Normal} | \text{yes}) P(\text{sw}=4, \text{ww}=4 | \text{yes})}{P(\text{sunny}, T=24, \text{Normal}, \text{sw}=4, \text{ww}=4)}$$

$$P(\text{sunny}, T=24, \text{Normal}, \text{sw}=4, \text{ww}=4) = \alpha \text{가정}$$

$$P(\text{yes}) = \frac{8}{14}$$

$$P(\text{sunny} | \text{yes}) = \frac{2}{8}$$

$$P(T=24 | \text{yes}) = 0.047$$

$$P(\text{Normal} | \text{yes}) = \frac{6}{8}$$

$$P(\text{sw}=4, \text{ww}=4 | \text{yes}) = \frac{1}{8} \times \left(\frac{15}{35}\right)^4 \times \left(\frac{20}{35}\right)^4 \Rightarrow k_1 = \frac{0.00126 \dots}{\alpha}$$

wind의 확률		
	sw	ww
No	$\frac{16}{31}$	$\frac{15}{31}$
Yes	$\frac{15}{35}$	$\frac{20}{35}$

$$k_2 = \frac{P(\text{no}) P(\text{sunny} | \text{no}) P(T=24 | \text{no}) P(\text{Normal} | \text{no}) P(\text{sw}=4, \text{ww}=4 | \text{no})}{P(\text{sunny}, T=24, \text{Normal}, \text{sw}=4, \text{ww}=4)}$$

$$P(\text{sunny}, T=24, \text{Normal}, \text{sw}=4, \text{ww}=4) = \alpha \text{가정}$$

$$P(\text{no}) = \frac{6}{14}$$

$$P(\text{sunny} | \text{no}) = \frac{3}{6}$$

$$P(T=24 | \text{no}) = 0.056$$

$$P(\text{Normal} | \text{no}) = \frac{1}{6}$$

$$P(\text{sw}=4, \text{ww}=4 | \text{no}) = \frac{1}{8} \times \left(\frac{16}{31}\right)^4 \times \left(\frac{15}{31}\right)^4$$

$$\Rightarrow k_2 = \frac{0.00036 \dots}{\alpha}$$

$\therefore k_1 > k_2$  이므로 yes로 분류!