

6. Describe the differences between a parametric and a non-parametric statistical learning approach. What are the advantages of a parametric approach to regression or classification (as opposed to a non-parametric approach)? What are its disadvantages?

有母數統計方法:假設母體為特定分配進行檢定。

無母數統計方法:所使用的統計量的抽樣分配通常與母體分配無關。

有母數統計方法大大簡化了估計 $f(x)$ 的問題。拿回歸跟分類問題來說,我們估計 $\beta_0, \beta_1, \dots, \beta_p$, 而不用估計整個 $f(x)$ 。而缺點是,假如我們選擇的模型如果與 f 真實的分配不符合,那麼我們的估計就會很差。

無母數統計方法沒有對 $f(x)$ 作任何的假設,根據 data 的形式,盡可能去接近數據點(例如:knn), 通過避免 f 的特定函數形式的假設,它有可能準確地為 f 提供更寬範圍的可能形狀。無母數方法存在一個主要缺點:由於它們不能減少將 f 估計為少量參數的問題,因此需要進行大量的觀測(遠遠超過參數方法通常需要的觀測值)。

7. The table below provides a training data set containing six observations, three predictors, and one qualitative response variable.

Obs.	X_1	X_2	X_3	Y
1	0	3	0	Red
2	2	0	0	Red
3	0	1	3	Red
4	0	1	2	Green
5	-1	0	1	Green
6	1	1	1	Red

Suppose we wish to use this data set to make a prediction for Y when $X_1 = X_2 = X_3 = 0$ using K -nearest neighbors.

- (a) Compute the Euclidean distance between each observation and the test point, $X_1 = X_2 = X_3 = 0$.

- (b) What is our prediction with $K = 1$? Why?
- (c) What is our prediction with $K = 3$? Why?
- (d) If the Bayes decision boundary in this problem is highly non-linear, then would we expect the *best* value for K to be large or small? Why?

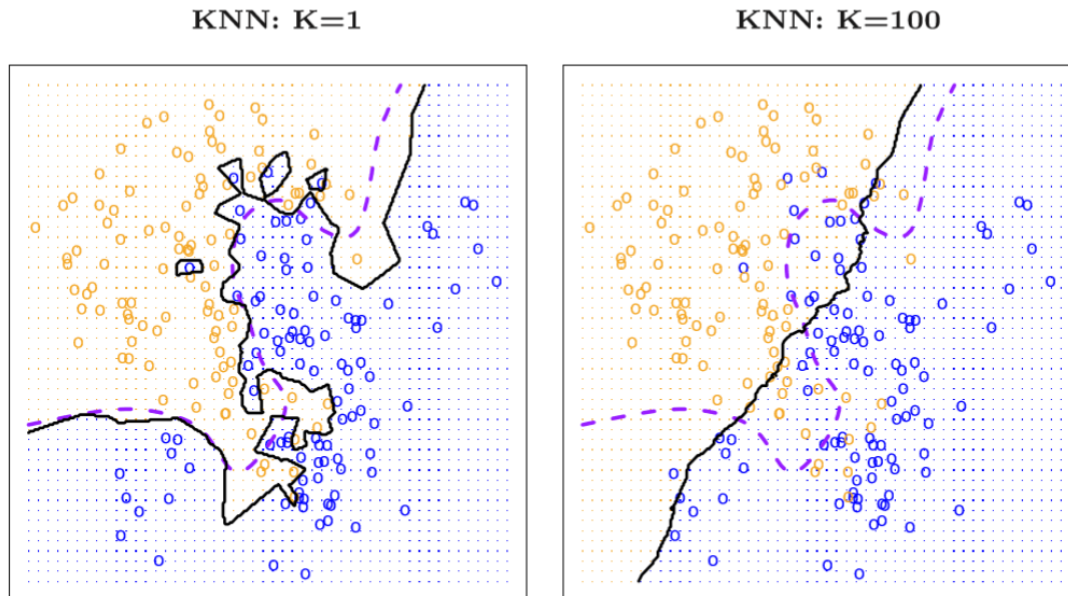
(a)

Obs.	X_1	X_2	X_3	Y	Distance
1	0	3	0	Red	3
2	2	0	0	Red	2
3	0	1	3	Red	3.16
4	0	1	2	Green	2.23
5	-1	0	1	Green	1.41
6	1	1	1	Red	1.73

(b) $k=1$ 時,我們的 Y 是 Green,因為第 5 個觀察值離(0,0,0)最近,它是 green

(C) $k=3$ 時,我們的 Y 是 Red,因為第 5,第 6,第 2 個觀察值離(0,0,0)最近,他們分別是 Green,red,red,然後取顏色多的,所以它是 y 是 red

(d)



K 值取小的比較好,k 值取小的 bias 會比較小,variance 會比較大,適合在非線性的資料。

1. Describe the null hypotheses to which the p-values given in Table 3.4 correspond. Explain what conclusions you can draw based on these p-values. Your explanation should be phrased in terms of **sales**, **TV**, **radio**, and **newspaper**, rather than in terms of the coefficients of the linear model.

	Coefficient	Std. error	t-statistic	p-value
Intercept	2.939	0.3119	9.42	< 0.0001
TV	0.046	0.0014	32.81	< 0.0001
radio	0.189	0.0086	21.89	< 0.0001
newspaper	-0.001	0.0059	-0.18	0.8599

TABLE 3.4. For the **Advertising** data, least squares coefficient estimates of the multiple linear regression of number of units sold on radio, TV, and newspaper advertising budgets.

由圖表可看出:TV,radio,的 p-value 顯著拒絕 $H_0: \beta_i=0$,可認為 TV 跟 radio 對於 sales 是有影響。而 newspaper 的 p-value 不顯著拒絕 $H_0: \beta_i=0$,所以我們沒有顯著證據證明 newspaper 對於 sales 有影響。

3. Suppose we have a data set with five predictors, $X_1 = \text{GPA}$, $X_2 = \text{IQ}$, $X_3 = \text{Gender}$ (1 for Female and 0 for Male), $X_4 = \text{Interaction between GPA and IQ}$, and $X_5 = \text{Interaction between GPA and Gender}$. The response is starting salary after graduation (in thousands of dollars). Suppose we use least squares to fit the model, and get $\hat{\beta}_0 = 50$, $\hat{\beta}_1 = 20$, $\hat{\beta}_2 = 0.07$, $\hat{\beta}_3 = 35$, $\hat{\beta}_4 = 0.01$, $\hat{\beta}_5 = -10$.

- (a) Which answer is correct, and why?
- For a fixed value of IQ and GPA, males earn more on average than females.
 - For a fixed value of IQ and GPA, females earn more on average than males.
 - For a fixed value of IQ and GPA, males earn more on average than females provided that the GPA is high enough.
 - For a fixed value of IQ and GPA, females earn more on average than males provided that the GPA is high enough.
- (b) Predict the salary of a female with IQ of 110 and a GPA of 4.0.
- (c) True or false: Since the coefficient for the GPA/IQ interaction term is very small, there is very little evidence of an interaction effect. Justify your answer.

$$\hat{y} = 50 + 20\text{GPA} + 0.07\text{IQ} + 35\text{Gender} + 0.01\text{GPA} \times \text{IQ} - 10\text{GPA} \times \text{Gender}$$

(a)iii.是正確答案

(b) $\hat{y} = 85 + 40 + 7.7 + 4.4 = 137.1$

(c) false,我們應該去檢定 $H_0:\beta_4=0$ 去看 P-value 才能決定。

8. This question involves the use of simple linear regression on the Auto data set.
- (a) Use the `lm()` function to perform a simple linear regression with `mpg` as the response and `horsepower` as the predictor. Use the `summary()` function to print the results. Comment on the output. For example:
- i. Is there a relationship between the predictor and the response?

```
library(ISLR)

## Warning: package 'ISLR' was built under R version 3.4.4

data(Auto)
lm.fit=lm(mpg ~ horsepower, data=Auto)
summary(lm.fit)

##
## Call:
## lm(formula = mpg ~ horsepower, data = Auto)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -13.5710  -3.2592  -0.3435   2.7630  16.9240
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  39.935861    0.717499   55.66  <2e-16 ***
## horsepower   -0.157845    0.006446  -24.49  <2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 4.906 on 390 degrees of freedom
## Multiple R-squared:  0.6059, Adjusted R-squared:  0.6049
## F-statistic: 599.7 on 1 and 390 DF, p-value: < 2.2e-16
```

p-value : <2e-16 ,我們可以顯著認為 **horsepower** 跟 **mpg** 有關係

- ii. How strong is the relationship between the predictor and the response?

R-squared : 0.6059 代表用這個回歸模型 **mpg** 可以被 **horsepower** 解釋的變異有 **60.59%**

- iii. Is the relationship between the predictor and the response positive or negative?

horsepower 的係數是-0.157845,所以 predictor 和 response 的關係是負的

iv. What is the predicted mpg associated with a horsepower of 98? What are the associated 95% confidence and prediction intervals?

```
predict(lm.fit, data.frame(horsepower = 98), interval = "prediction")

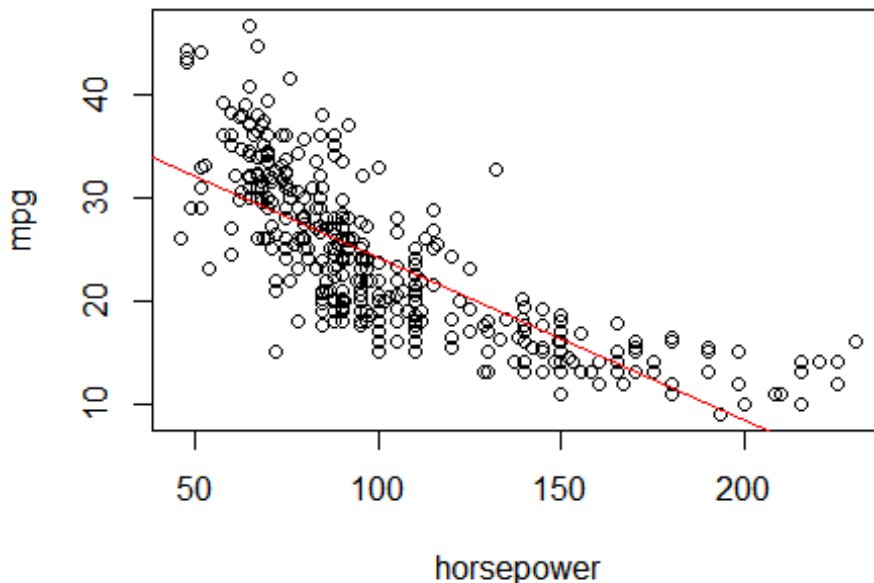
##          fit          lwr          upr
## 1 24.46708 14.8094 34.12476

predict(lm.fit, data.frame(horsepower = 98), interval = "confidence")

##          fit          lwr          upr
## 1 24.46708 23.97308 24.96108
```

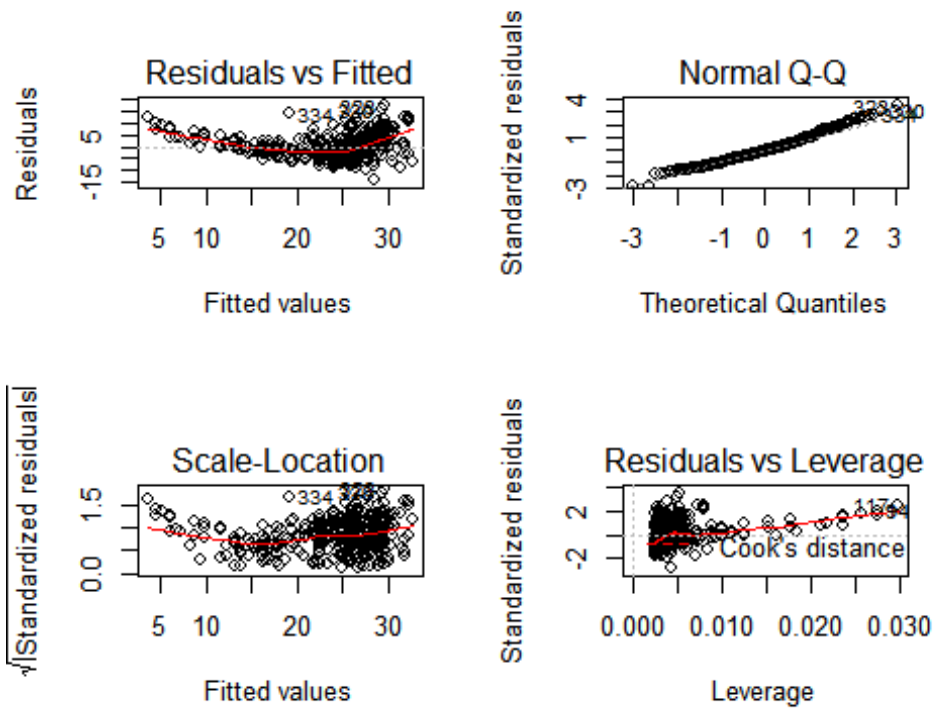
(b) Plot the response and the predictor. Use the abline() function to display the least squares regression line.

```
attach(Auto)
plot(horsepower,mpg)
abline(lm.fit,col="red")
```



(c) Use the plot() function to produce diagnostic plots of the least squares regression fit. Comment on any problems you see with the fit

```
par(mfrow=c(2,2))
plot(lm.fit)
```



(1)從 Residuals vs Fitted 圖中可以看出 predictors 和 response 有一點非線性的趨勢 (2)從 Normal Q-Q 圖中得知殘差大致符合標準常態分佈 (3)從 Scale-Location 圖中大致得知取線周圍的點應該隨機分布,而圖中有一些點有微 outliers 的趨勢