




9. 信賴區間估計 Confidence Interval Estimation

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Agenda

- Confidence Interval for Population Proportion
- Proportion Test
- The z-test
- The t-test
- Comparing p-values from t and z
- Confidence Interval for the median

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3



Confidence Interval for Population Proportion

- 根據問卷或投票結果估計母體比例值的區間。
- 此為吾人在報章雜誌上，最常見之信賴區間的應用。
- 假設100位受訪者中，42位偏愛X品牌。
- 要估計的母體參數為何？

$$p = \frac{\text{Number who agree}}{\text{Size of population}}$$

- 合理的點估計式為何？

$$\hat{p} = \frac{\text{Number surveyed who agree}}{\text{size of survey}}$$

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4



Confidence Interval for Population Proportion (cont.)

- If the sampled answers are recorded as

$$X_i = \begin{cases} 1, & \text{if answer } i \text{ was "yes"} \\ 0, & \text{if answer } i \text{ was "no"} \end{cases}, \text{ for } i = 1, 2, \dots, n$$

- The point estimator of the population proportion, i.e. sample proportion, will be

$$\hat{p} = \frac{X_1 + X_2 + \dots + X_n}{n} = \bar{X}$$



Sampling Distribution

- \hat{p} has a known distribution, and if n is large enough we can say the following is approximately normal with mean 0 and variance 1:

$$z = \frac{\hat{p} - p}{\sqrt{p(1-p)}/\sqrt{n}} = \frac{\bar{x} - \mu}{s/\sqrt{n}}$$

- Z is in $(-1, 1)$ with probability approximately 0.68
- Z is in $(-2, 2)$ with probability approximately 0.95
- Z is in $(-3, 3)$ with probability approximately 0.998



Std. Error and Probability Interval

$$SE = \sqrt{p(1-p)/n}$$

$$P(-1 \leq \frac{p - \hat{p}}{SE} \leq 1) = 0.68$$

$$P(-2 \leq \frac{p - \hat{p}}{SE} \leq 2) = 0.95$$

$$P(-3 \leq \frac{p - \hat{p}}{SE} \leq 3) = 0.998$$

$$P(\hat{p} - 3SE \leq p \leq \hat{p} + 3SE) = 0.998$$

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7



qnorm

- p, mean=0, sd=1
- lower.tail=TRUE

```

R GUI
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R Console
> alpha=c(0.2,0.1,0.05,0.001)
> zstar=qnorm(1-alpha/2)
> zstar
[1] 1.281552 1.644854 1.959964 3.290527
>
  
```

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8



pnorm

- q , mean=0, sd=1
- lower.tail=TRUE

```

RGui
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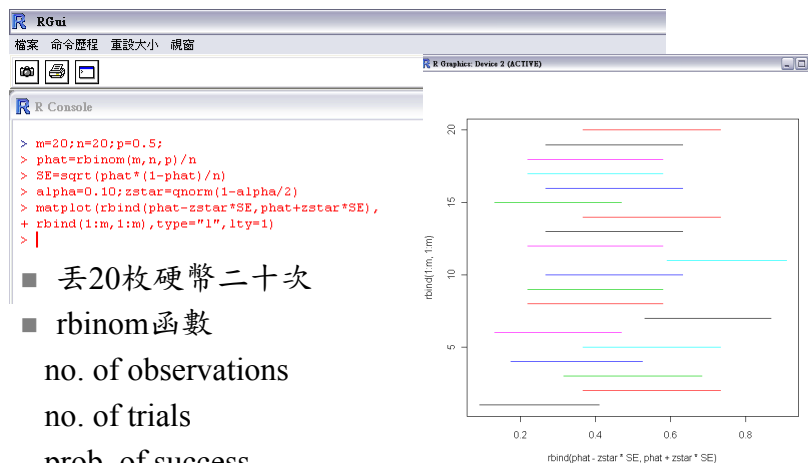
R Console
> 2*(1-pnorm(zstar))
[1] 0.200 0.100 0.050 0.001
>

```

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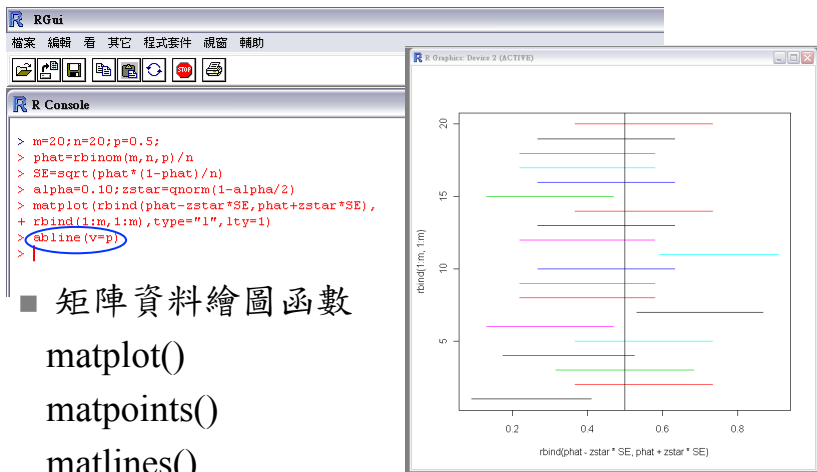
9



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10



The R GUI window shows the R Console with the following code:


```
> n=20; n2=20; p=0.5;
> phat=rbinom(m,n,p)/n
> SE=sqrt(phat*(1-phat)/n)
> alpha=0.10; zstar=qnorm(1-alpha/2)
> matplot(rbind(phat-zstar*SE, phat+zstar*SE),
+ rbind(1:m, 1:m), type="l", lty=1)
> abline(v=p)
>
```

The R Graphics Device 2 (ACTIVE) window displays a plot of the simulated binomial distribution. The x-axis is labeled $\text{rbind}(phat - zstar * SE, phat + zstar * SE)$ and ranges from 0.2 to 0.8. The y-axis is labeled $\text{rbind}(1:m, 1:m)$ and ranges from 0 to 20. The plot shows 20 horizontal line segments, each representing a simulated binomial distribution. A vertical line at $p=0.5$ is drawn, and the segments are centered around this line.

■ 矩陣資料繪圖函數

- `matplot()`
- `matpoints()`
- `matlines()`

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Many other tests follow a similar procedure

- One finds a good statistic that involves the unknown parameter (called as a *pivotal quantity*).
- One uses the known (sampling) distribution of the statistic (i.e. pivotal quantity) to make a probabilistic statement.
- One unwraps things to form a confidence interval.
- It is often of the form the statistic (an unbiased point estimator) plus or minus a multiple of the standard error.

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母體比例值檢定

- 檢驗標的是比例值的型態，例如生育率、市場佔有率、留學生比例…等，比例值檢定是由抽樣所得到的樣本比例值去推斷『關於母體比例值的聲明』是否屬實。



藥廠例子

R Console

```
> prop.test(800,1000)

1-sample proportions test with continuity correction

data: 800 out of 1000, null probability 0.5
X-squared = 358.801, df = 1, p-value < 2.2e-16
alternative hypothesis: true p is not equal to 0.5
95 percent confidence interval:
 0.7735599 0.8240979
sample estimates:
p
0.8
```



100人中有42人偏愛品牌X

R Console

```
> utils::menuInstallLocal()
updating HTML package descriptions
> prop.test(42,100)

1-sample proportions test with continuity correction

data: 42 out of 100, null probability 0.5
X-squared = 2.25, df = 1, p-value = 0.1336
alternative hypothesis: true p is not equal to 0.5
95 percent confidence interval:
 0.3233236 0.5228954
sample estimates:
p
0.42
```




改變信賴水準

R Console

```
> prop.test(42,100,conf.level=0.90)

1-sample proportions test with continuity correction

data: 42 out of 100, null probability 0.5
X-squared = 2.25, df = 1, p-value = 0.1336
alternative hypothesis: true p is not equal to 0.5
90 percent confidence interval:
 0.3372368 0.5072341
sample estimates:
      p 
0.42
```



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z-test Statistic

- Statistic $\frac{\bar{X} - \mu}{\sigma/\sqrt{n}}$ is normally distributed, if
 - σ is known, and the X_i 's are normally distributed.
 - σ is known, and n is large enough to apply the CLT.



CLT

- 若 $n \rightarrow \infty$ ，則抽樣分配會近似常態分配
($n > 30 \rightarrow$ CLT 即成立)
- 1. $\bar{X} \sim N(\mu, \frac{\sigma^2}{n})$ or $\frac{\bar{X} - \mu}{\sigma/\sqrt{n}} \sim N(0,1)$
- 2. $\sum_{i=1}^n X_i \sim N(n\mu, n\sigma^2)$ or $\frac{\sum X_i - n\mu}{\sqrt{n\sigma^2}} \sim N(0,1)$



體重資料範例

- Suppose a person weighs himself on a regular basis and finds his weight to be
175 176 173 175 174 173 173
176 173 179
- Suppose that $\sigma = 1.5$ and the error in weighing is normally distributed.



自行撰寫 z 檢定函數

- 函數名 simple.z.test
- 輸入
 - 資料向量
 - 母體標準差
 - 顯著水準
- 輸出信賴區間
- 注意!{ }

```

RGui - [R Console]
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[Icons]

> x=c(175,176,173,175,174,173,173,176,173,179)
> simple.z.test = function(x,sigma,conf.level=0.95) {
+ n = length(x);xbar=mean(x)
+ alpha = 1 - conf.level
+ zstar = qnorm(1-alpha/2)
+ SE = sigma/sqrt(n)
+ xbar +c(-zstar*SE,zstar*SE))
> simple.z.test(x,1.5)
[1] 173.7703 175.6297
>

```



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t-test Statistic

- More realistically, you may not know the standard deviation. To work around this we use the t-statistic, which is given by

$$t = \frac{\bar{X} - \mu}{s / \sqrt{n}} \quad \text{where } s, \text{ the sample standard deviation, replaces } \sigma, \text{ the population standard deviation.}$$

- The X_i are normal and n is small then t has the t distribution with $n-1$ degrees of freedom.
- If n is large, then t is approximately normal.



左邊截略的常態分配

- `x<-c(175,176,173,175,174,173,173,176,173,179)`
- `par(mfrow=c(1,3))`
- `hist(x)`
- `boxplot(x)`
- `qqnorm(x);qqline(x)`

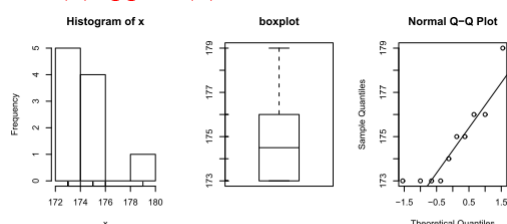


Figure 44: Plot of weights to assess normality

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25



無母數檢定方法是否更適合？

Step1

```
R R Console
> x=c(175,176,173,175,174,173,173,176,173,179)
```

Step2

```
R R Console
複製和貼上
> x=c(175,176,173,175,174,173,173,176,173,179)
> t.test(x)

One Sample t-test

data: x
t = 283.8161, df = 9, p-value < 2.2e-16
alternative hypothesis: true mean is not equal to 0
95 percent confidence interval:
 173.3076 176.0924
sample estimates:
mean of x
 174.7
```

Notice we get a different confidence interval.

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26



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Some Extra Insight: Comparing p-values from t and z

- The confidence interval based on the t statistic would always be larger than that based on the z statistic as always $t^* > z^*$. However, the standard error SE for the t also depends on s which is variable and can sometimes be small enough to offset the difference.
- Use side-by-side box plots of two random sets of data from t and z to compare t^* and z^* .



t and z Comparison

```
x=rnorm(100);y=rt(100,9)
boxplot(x,y)
qqnorm(x);qqline(x)
qqnorm(y);qqline(y)
```

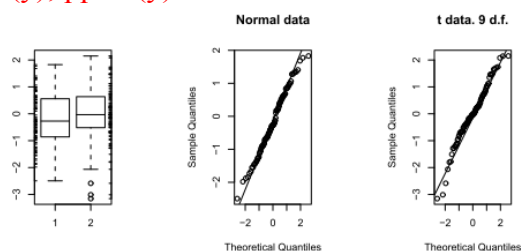


Figure 45: Plot of random normal data and random t -distributed data

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29



Normal Density and t-Density

- `xvals=seq(-4,4,.01)`
- `plot(xvals,dnorm(xvals),type="l")`
- `for (i in c(2,5,10,20,50)) points(xvals, dt(xvals,df=i),`
`type="l",lty=i)`

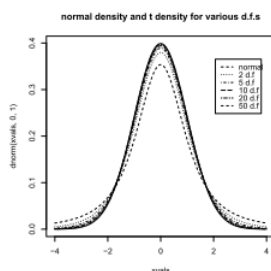


Figure 46: Normal density and the t -density for several degrees of freedom

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30



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Confidence interval for the median (1/3)

- Confidence intervals for the median are **important** too. They are mathematically different than the ones above, but **in R these differences aren't noticed**.
- The R function **wilcox.test** performs a non-parametric test for the median.



Confidence interval for the median (2/3)

- Suppose the following data is the pay of CEO's in America in 2001, then the following creates a test for the median.

```

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R Console

> x = c(110, 12, 2.5, 90, 1017, 540, 54, 4.3, 150, 432)
> wilcox.test(x, conf.int = TRUE)

Wilcoxon signed rank test

data: x
V = 55, p-value = 0.001953
alternative hypothesis: true location is not equal to 0
95 percent confidence interval:
 33.0 514.5
sample estimates:
(pseudo)median
      150
  
```

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33



Confidence interval for the median (3/3)

Notice a few things:

- Unlike `prop.test` and `t.test`, we needed to specify that we wanted a confidence interval computed. (須設定是否要C.I.)
- For this data, the **confidence interval is enormous** as the size of the sample is small and the range is huge. (因n小且range大，所以C.I.大)
- We **couldn't have used a t-test** as the data isn't even close to normal. (資料非常態，不建議做t檢定)

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34

