

Research Methods

Analysing Survey Data with R

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Task

The HR manager of your company has asked you to investigate answers to several HR related questions and write a short report. You have access to a survey of the employees that has recently been carried out (jss.xlsx). The questions you need to investigate are:

1. What is the age distribution of the workforce?
2. What proportion of employees belongs to each ethnic group?
3. What is the average income?
4. How is number of years worked related to salary, if at all.
5. How different are the average salaries of the different skill categories?
6. Is there a significant difference between the proportion of males and females who attended the firm's meeting last month?

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Relevant details of variables on the Job Satisfaction Survey file (jss.sav)	
ID	Employee Number
ETHNICGP	Ethnic group
	Missing Values: 0
	Value Label
	0 not reported
	1 white
	2 south asian
	3 east asian
	4 black
	5 other
GENDER	Gender
	Value Label
	1 male
	2 female
INCOME	Annual income in pounds (to nearest hundred)
	Missing Values: 0
AGE	Age in years
	Missing Values: 0
YEARS	Years worked
ATTEND	Attended meeting
	Value Label
	1 yes
	2 no
SKILL	Rated skill level
	Value Label
	1. unskilled
	2. semi-skilled
	3. fairly-skilled
	4. highly skilled

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Data

	A	B	C	D	E	F	G	H	I	J	K	L
id	ethnicgp	gender	income	age	years	attend	skill					
1	21	White Male	5300	43	16	No	Unskilled					
2	12	Black Male	5500	19	2	Yes	Unskilled					
3	36	Black Male	5900	19	1	No	Unskilled					
4	25	White Female	6200	31	9	No	Unskilled					
5	32	South Asian Female	6200	28	10	Yes	Unskilled					
6	63	South Asian Female	6400	26	8	Yes	Unskilled					

save as "jss.csv"

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Import Data

```
> setwd("C:/Users/andyg/Desktop/R")
```

```
> jss <- read.csv("jss.csv", header = TRUE,  
colClasses = c("numeric", "factor", "factor",  
"numeric", "numeric", "numeric", "factor",  
"factor"))
```

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Import Data

```
R Console  
> setwd("C:/Users/andyg/Desktop/R")  
> jss <- read.csv("jss.csv", header = TRUE, colClasses = c("numeric", "factor", "factor",  
> jss  
1..id ethnicgp gender income age years attend skill  
1 21 White Male 5300 43 16 No Unskilled  
2 12 Black Male 5500 19 2 Yes Unskilled  
3 36 Black Male 5900 19 1 No Unskilled  
4 25 White Female 6200 31 9 No Unskilled  
5 32 South Asian Female 6200 28 10 Yes Unskilled  
6 63 South Asian Female 6400 26 8 Yes Unskilled  
7 51 White Female 6500 31 2 No Unskilled  
8 45 White Male 6600 0 10 Yes Unskilled  
9 46 South Asian Male 6700 18 1 Yes Unskilled  
10 18 White Female 6700 18 1 Yes Unskilled  
11 40 Black Male 6700 31 15 No Unskilled  
12 29 White Male 6800 31 12 Yes Unskilled  
13 42 South Asian Male 6800 23 3 Yes Unskilled  
14 48 White Female 6800 29 10 Yes Unskilled  
15 64 White Female 6800 46 0 No Semi-Skilled  
16 10 Black Female 6900 27 6 Yes Semi-Skilled  
17 68 South Asian Male 6900 45 9 No Semi-Skilled  
18 70 White Male 6900 47 22 Yes Semi-Skilled  
19 58 White Female 6900 48 20 No Semi-Skilled  
20 26 White Male 7000 21 1 Yes Fairly Skilled  
21 43 Black Female 7000 27 5 No Fairly Skilled
```

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Summary

```
> summary(jss)
```

```
R Console
> summary(jss)
  Min.   1..id   Black   ethnicgp   gender   income   age
 1st Qu.:18.25   East Asian: 2   Male   :39   1st Qu.: 4900   1st Qu.:29.00
Median :35.50   South Asian:14   Median : 7750   Median :38.50
Mean   :35.50   White   :36   Mean   : 7750   Mean   :38.63
3rd Qu.:52.75   Max.   :70.00   3rd Qu.: 8575   3rd Qu.:49.50
Max.   :70.00   years   attend   skill
Min.   : 0.00   No :34   Fairly Skilled:21
1st Qu.: 4.25   Yes:36   Highly Skilled:17
Median : 9.50   Semi-Skilled :10
Mean   :12.71   Unskilled   :14
3rd Qu.:21.00
Max.   :41.00
```

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Task 1

What is the age distribution of the workforce?

```
> summary(jss$age)
```

```
> sd(jss$age)
```

```
R Console
>
>
> summary(jss$age)
  Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
 0.00  29.00   38.50   38.63  49.50   63.00
>
> sd(jss$age)
[1] 13.09405
>
```

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Task 1

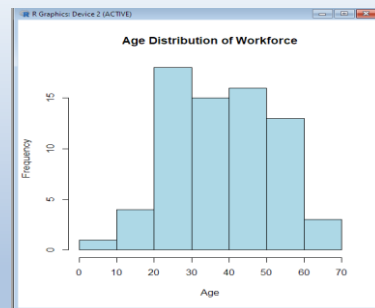
```
> hist(jss$age)
```

```
> hist(jss$age, main="Age Distribution of
Workforce", xlab="Age", col="lightblue")
```

```
R Console
> hist(jss$age)
>
> hist(jss$age, main="Age Distribution of Workforce", xlab="Age", col="lightblue")
>
```

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Task 1



File -> Save As

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Task 2

What proportion of employees belongs to each ethnic group?

```
> table(jss$ethnicgp)
```

```
R Console
>
> table(jss$ethnicgp)
  Black   East Asian   South Asian   White
    18         2         14        36
```

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Task 2

```
> prop <- table(jss$ethnicgp)
```

Proportions

```
> prop.table(prop)
```

To produce percentages rounded to whole numbers

```
> round(100*prop.table(prop),digits=0)
```

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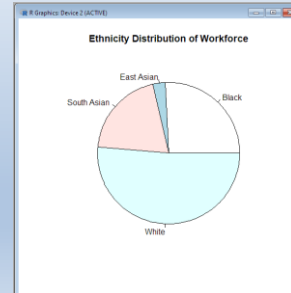
Task 2

```
R Console
> table(jss$ethnicgp)
  Black East Asian South Asian White
    18      2      14      36
> prop <- table(jss$ethnicgp)
> prop
  Black East Asian South Asian White
    18      2      14      36
> prop.table(prop)
  Black East Asian South Asian White
0.2571429 0.02857143 0.2000000 0.51428571
> round(100*prop.table(prop),digit=0)
  Black East Asian South Asian White
    26      3      20      51
>
>
>
>
```

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Task 2

```
> pie(prop, main="Ethnicity Distribution of Workforce")
```



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Task 3

What is the average income?

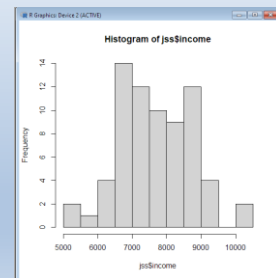
```
> summary(jss$income)
> mean(jss$income)
```

```
R Console
>
>
> summary(jss$income)
  Min. 1st Qu. Median Mean 3rd Qu. Max.
  $100  4900   7750  7750  8875 10500
> mean(jss$income)
[1] 7750
>
>
>
```

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Task 3

```
> hist(jss$income)
```



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Task 3

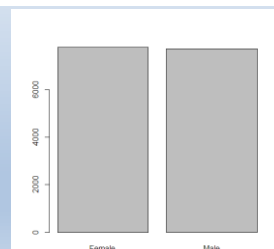
```
> tapply(jss$income, jss$gender, mean)
> tapply(jss$income, jss$ethnicgp, mean)
```

```
R Console
> tapply(jss$income, jss$skill, mean)
Fairly Skilled Highly Skilled Semi-Skilled Unskilled
  7695.238    9129.412    7589.889    6364.286
> tapply(jss$income, jss$gender, mean)
Female Male
7777.419 7728.205
> tapply(jss$income, jss$ethnicgp, mean)
Black East Asian South Asian White
7761.111 8050.000 7728.571 7736.111
>
>
>
```

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Task 3

```
> barplot(tapply(jss$income, jss$gender, mean))
```



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Task 3

```
> barplot(tapply(jss$income, jss$skill,
mean))
```



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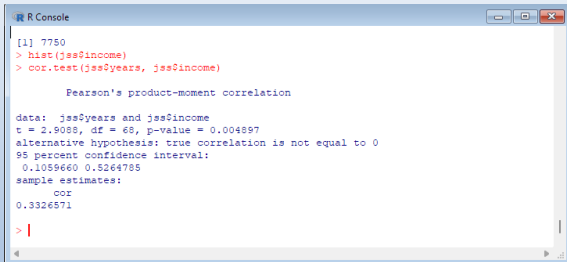
Task 4

How is number of years worked related to salary, if at all?

```
> cor.test(jss$years, jss$income)
```

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Task 4



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Task 4

Scatterplot

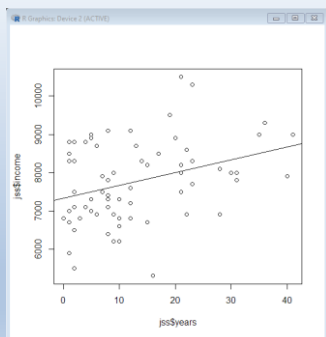
```
> plot(jss$years, jss$income)
```

Add a line of best fit - Linear Regression

```
> abline(lm(jss$income ~ jss$years))
```

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Task 4



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Task 4

Linear Regression Equation

```
> lm(jss$income ~ jss$years)
```

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Task 4

```
R Console
> sample estimates:
      cor 
0.3326971

> plot(jss$years, jss$income)
> abline(lm(jss$income ~ jss$years))
> lm(jss$income ~ jss$years)

Call:
lm(formula = jss$income ~ jss$years)

Coefficients:
(Intercept)      jss$years 
 7324.50         33.47
```

Relationship between years worked and salary is:

Salary = £7324.50 + 33.47 x Years Worked

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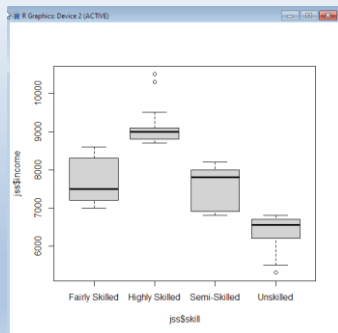
Task 5

How different are the average salaries of the different skill categories?

```
> boxplot(jss$income ~ jss$skill)
```

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Task 5



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Task 5

```
> tapply(jss$income, jss$skill, mean)
```

```
R Console
> 
> 
> 
> 
> 
> 
> tapply(jss$income, jss$skill, mean)
Fairly Skilled Highly Skilled Semi-Skilled Unskilled
 7695.238      9129.412      7588.889      6364.286
```

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Task 5

```
> anova <- aov(jss$income ~ jss$skill)
```

```
> summary(anova)
```

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Task 5

```
R Console
> 
> 
> 
> anova <- aov(jss$income ~ jss$skill)
> summary(anova)
          Df Sum Sq Mean Sq F value Pr(>F)    
jss$skill  3  59760261 19920087  71.63 <2e-16 ***
Residuals 66  18354739   278102               

---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

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Task 5

> TukeyHSD(anova)

```
R Console
> TukeyHSD(anova)
Tukey multiple comparisons of means
 55% family-wise confidence level

Fit: aov(formula = jss$income ~ jss$skill)

$`jss$skill`
             diff      lwr      upr      p adj
Highly Skilled-Fairly Skilled  1434.1737   980.6937  1887.6537  0.0000000
Semi-Skilled-Fairly Skilled   -106.3492  -552.8136   340.1152  0.9227496
Unskilled-Fairly Skilled     -1930.9524 -1810.5321  -851.3727  0.0000000
Semi-Skilled-Highly Skilled   -1540.5229 -2010.6050 -1070.4407  0.0000000
Unskilled-Highly Skilled     -2765.1261 -3266.7668 -2263.4853  0.0000000
Unskilled-Semi-Skilled       -1224.6032 -1719.9110  -729.2954  0.0000001

> |
```

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Task 6

Is there a significant difference between the proportion of males and females who attended the firm's meeting last month?

> table(jss\$attend, jss\$gender)

> chisq.test(table(jss\$attend, jss\$gender))

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Task 6

```
R Console
> table(jss$attend, jss$gender)
      Female Male
No       16    18
Yes      15    21

> chisq.test(table(jss$attend, jss$gender))

Pearson's Chi-squared test with Yates' continuity correction

data:  table(jss$attend, jss$gender)
X-squared = 0.045458, df = 1, p-value = 0.8312

> |
```

21 out of 36 of men (55%) attended the meeting, whereas 14 out of 32 (44%) of women attended the meeting. So the percentage of men attending the meeting was higher than the percentage of women attending the meeting. However, Sig = 0.83. Therefore, there is no significant difference between M/F attendance at the meeting.

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