Chapter 2 Workshop

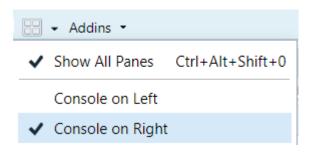
Table of contents

| Setting up a Quarto project | 3 |
|-----------------------------|----|
| Dataset Prestige | 9 |
| Exercise 2.1 | 10 |
| Exercise 2.2 | 13 |
| Exercise 2.3 | 18 |
| Exercise 2.4 | 19 |
| Exercise 2.5 | 20 |
| Exercise 2.6 | 21 |
| Exercise 2.7 | 22 |
| Exercise 2.8 | 23 |
| Exercise 2.9 | 25 |
| Exercise 2.10 | 32 |
| Exercise 2.11 | 33 |
| Exercise 2 12 | 35 |

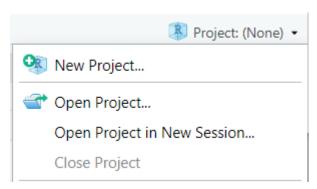
Setting up a Quarto project

It is a good idea to get into the habit of using Quarto projects, rather than just R scripts. Here is a step-by-step guide to creating a project for your workshops. You don't have to use projects, but they are very useful.

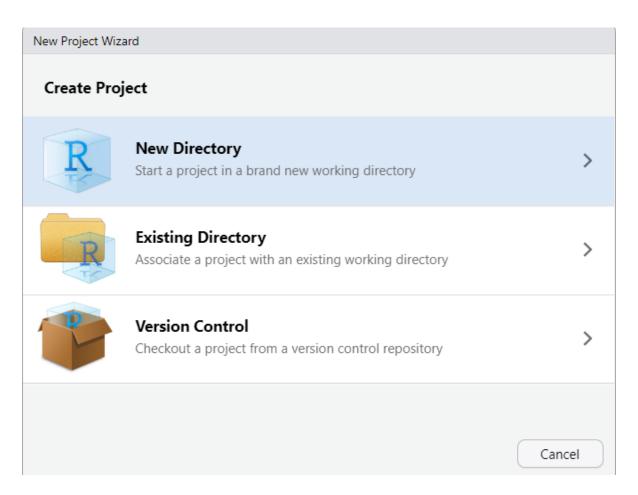
1. Open RStudio. (Optional: click on the little window symbol at the top and select "Console on Right")



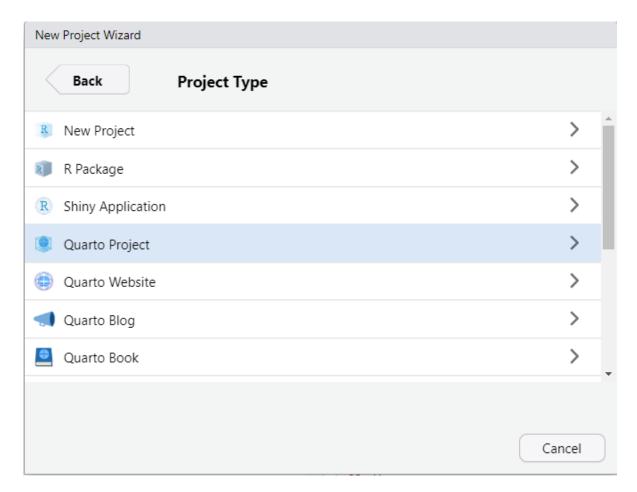
- 2. If you haven't already, make a directory on your computer where you want to keep your code for this course.
- 3. Make a new project. Select the "Project" button at the top-right of Rstudio, and select "New Project...".



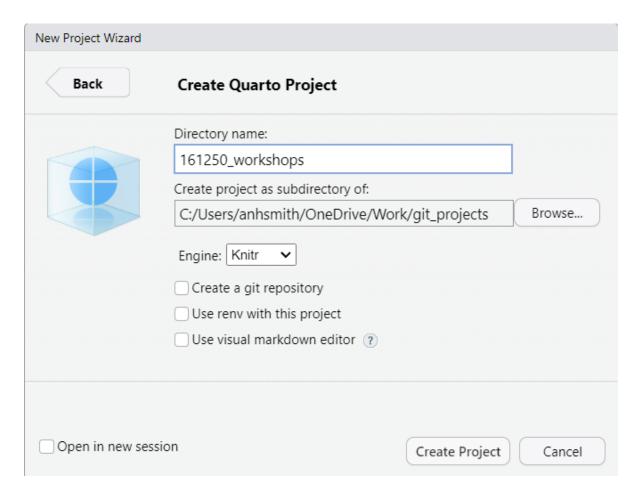
- 4. In the pop-up window:
- Select "New Directory"



• Select "Quarto Project"



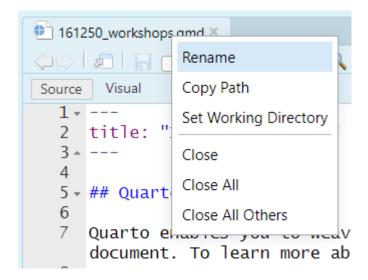
 \bullet Choose your directory via the "Browse", and then give the project a name like "161250_workshops"



• Finish by clicking on "Create Project".

The project should now be created, and you'll likely have an open *.qmd file (something like "161250_workshops.qmd") in the top-right window of Rstudio. We want to make a *.qmd file for this workshop.

5. Right-click on the qmd tab and select "Rename", and rename it "workshop2.qmd" or something similar. (Alternatively, just make a new file via the menus: $File > New\ File > Quarto\ Document.$)



Now you have a document for your Workshop 2 work. You can:

- Write headings with lines beginning with "#".
- Write text in the main part of the document.
- Make a code chunk for your R code using Ctrl-Alt-i. Write R code in the code chunks.

Like so:

```
# Heading
normal text
```{r}
this is a code chunk -- R code goes here
...
```

There are lots of tutorials online covering the basics of Quarto, and we'll discuss them during our own workshops. Here are a couple for starters:

https://quarto.org/docs/get-started/hello/rstudio.html

https://www.youtube.com/watch?v=c654j7aQjcg

There are many advantages of Quarto projects. One is that you can put datasets into the project folder, and they'll be easily accessible within your project, without having to worry about file paths.

You can easily open a recent past projects via the "Projects" button on the top-right of Rstudio.

#### Dataset Prestige

As you work through this workshop, you can copy the code and paste it into a code chunk. Write notes and observations to your self as you go.

We will be using a well-known dataset called Prestige from the car R package. This dataset deals with prestige ratings of Canadian occupations. The Prestige dataset has 102 rows and 6 columns. Each row (or 'observation') is an occupation.

This data frame contains the following columns:

- education Average education of occupational incumbents, years, in 1971.
- income Average income of incumbents, dollars, in 1971.
- women Percentage of incumbents who are women.
- prestige Pineo-Porter prestige score for occupation, from a social survey conducted in the mid-1960s.
- census Canadian Census occupational code.
- type Type of occupation. A factor with levels: bc, Blue Collar; prof, Professional, Managerial, and Technical; wc, White Collar. (includes four missing values).

First we'll load the data. The dataset sits in the car package, so you need to load the car package first.

```
library(car)
data(Prestige)
```

Draw a bar chart for type. These plots show the count or relative frequency of blue collar (bc), professional (prof), and white collar (wc) professions in the dataset.

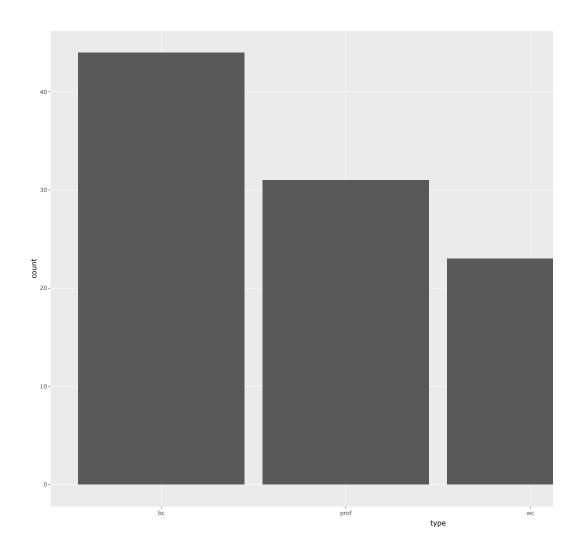
```
library(tidyverse)

p <- Prestige |>
 ggplot() +
 aes(type) +
 geom_bar()

p
```

Or with plotly (which works for HTML, not for PDF)

```
library(plotly)
ggplotly(p)
```



#### Or with old-style R plot

```
or
library(car)
barplot(table(Prestige$type))
```

Draw a histogram of prestige.

Below demonstrates the flexibility of ggplot code. You can specify the data argument by piping it into ggplot, or by putting it as an argument to ggplot or a geom\_. Likewise, the mapping or aes information, which determines which variables are used where, can be added as an extra line or specified inside the ggplot or geom\_ function.

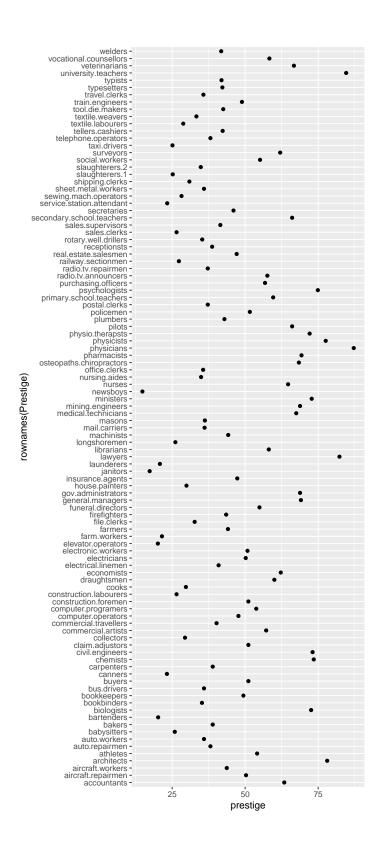
All of these methods give the same result.

```
Prestige |>
 ggplot() +
 aes(x = prestige) +
 geom_histogram(bins=10)
ggplot(
 data = Prestige,
 mapping = aes(x = prestige)
 geom_histogram(bins=10)
ggplot(Prestige) +
 aes(x = prestige) +
 geom_histogram(bins=10)
ggplot() +
 geom_histogram(
 data = Prestige,
 mapping = aes(x = prestige),
 bins = 10
or
library(plotly)
```

```
p <- Prestige |>
ggplot() +
aes(prestige) +
geom_histogram(bins=10)
#
ggplotly(p)
or
hist(Prestige$prestige)
```

We can display this information as a dot plot.

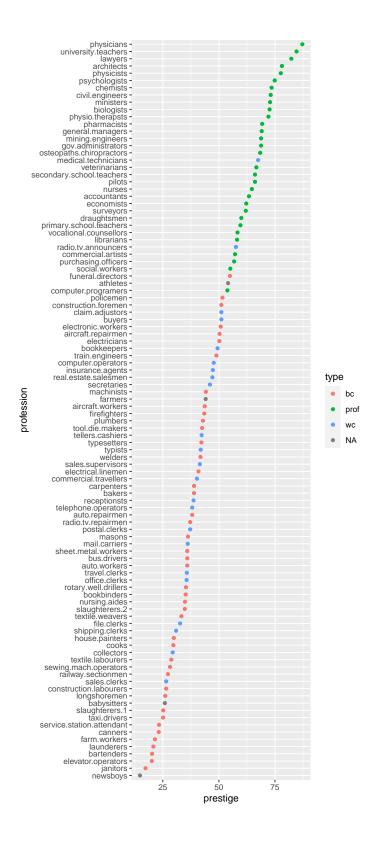
```
Prestige |>
 ggplot() +
 aes(x = rownames(Prestige), y = prestige) +
 geom_point() +
 coord_flip()
```



#### What a mess!

We can tidy it up by ordering the professions on the plot according to prestige. First, we move the professions from rownames to a variable. Then, we fct\_reorder the professions using prestige. Then, the resulting data gets piped into ggplot.

```
Prestige |>
 rownames_to_column(var = "profession") |>
 mutate(
 profession = fct_reorder(profession, prestige)
) |>
 ggplot() +
 aes(x = profession, y = prestige, colour = type) +
 geom_point() +
 coord_flip()
```



Obtain some summary statistics for prestige. There are a few options for this.

Make a boxplot of prestige ~ type:

```
Prestige |>
 ggplot() +
 aes(y=prestige, x=type) +
 geom_boxplot()
or
library(plotly)
p <- Prestige |> ggplot() +
aes(y=prestige, x=type) + geom_boxplot()
ggplotly(p)
or
library(lattice)
bwplot(prestige ~ type, data=Prestige)
as violin plots
Prestige |>
 ggplot() +
 aes(y=prestige, x=type) +
 geom_violin()
Or put it all together
Prestige |>
 ggplot() +
 aes(y=prestige, x=type) +
 geom_violin() +
 geom_boxplot(col = 2, alpha = .2) +
 geom_jitter(alpha = .2, width = .2, height = 0, colour = 4)
```

Obtain the Empirical Cumulative Distribution Function (ECDF) graphs of prestige ~ type:

```
Prestige |>
 ggplot() +
 aes(prestige, colour=type) +
 stat_ecdf()
Prestige |>
 ggplot() +
 aes(prestige) +
 stat_ecdf() +
 facet_wrap(~type)
or
library(latticeExtra)
ecdfplot(~ prestige | type, data = Prestige)
Prestige |>
 ggplot() +
 aes(
 x = prestige, # these aes settings are used
 col = type # by both geoms
) +
 geom_density(
 aes(fill = type), # the 'fill' aes goes here because
 alpha = .2 # geom_rug doesn't use 'fill'
) +
 geom_rug()
```

Obtain the {0.05, 0.1, 0.25, 0.5, 0.75, 0.9, 0.95} quantiles of prestige:

```
pr <- c(0.01, 0.05, 0.1, 0.25, 0.5, 0.75, 0.9, 0.95, 0.99)

Prestige |>
 summarise(
 probs = pr,
 quants = quantile(prestige, pr)
)

or simply
quantile(Prestige$prestige, pr)
```

Obtain the scatter plot (with and without marginal boxplots) prestige vs. education :

```
library(ggExtra)

p1 <- Prestige |>
 ggplot() +
 aes(x = education, y = prestige) +
 geom_point() +
 geom_smooth(col = 2) +
 geom_smooth(method = "lm", se = FALSE)

ggMarginal(p1, type="boxplot")

library(car)

scatterplot(education ~ prestige, data = Prestige)
```

The later plot will show prediction interval ribbon while the first plot will show the confidence interval ribbon.

Obtain the bubble or balloon plot **prestige vs. education vs. income** (income forming the bubble size):

```
library(ggplot2)

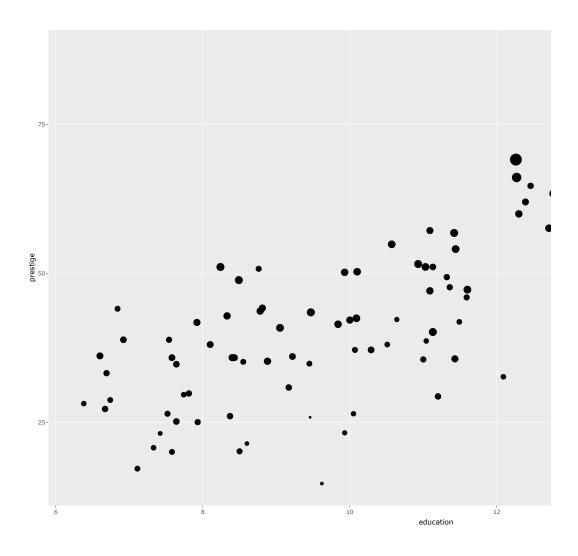
Prestige |>
 ggplot() +
 aes(x = education, y = prestige, size = income) +
 geom_point()

or

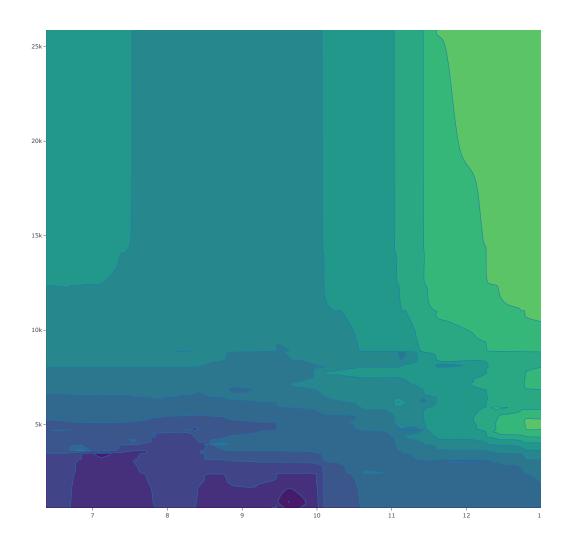
library(plotly)

p <- Prestige |>
 ggplot() +
 aes(x = education, y = prestige, size = income) +
 geom_point()

ggplotly(p)
```



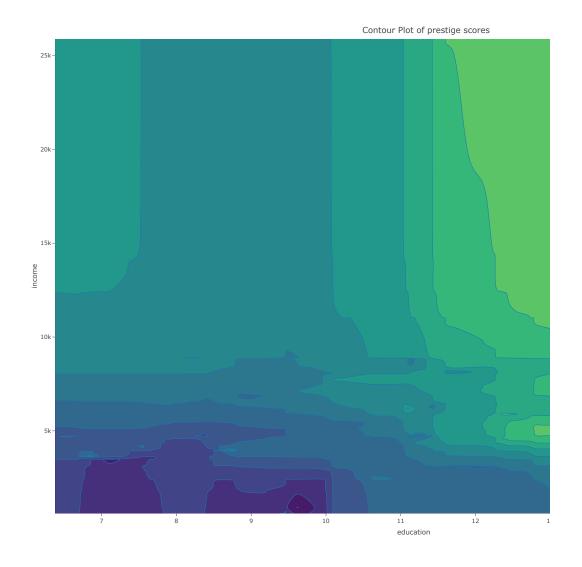
Obtain the contour plot **prestige vs. education vs. income** :



To add axes labels and titles, try-

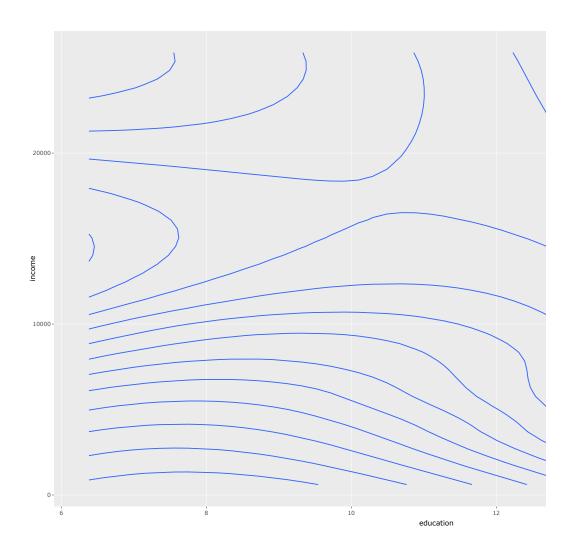
```
library(plotly)

plot_ly(
 Prestige,
 type = 'contour',
 x = Prestige$education,
 y = Prestige$income,
 z = Prestige$prestige
) |> layout(
 title = 'Contour Plot of prestige scores',
 xaxis = list(title = 'education'),
 yaxis = list(title = 'income')
)
```



We can also define our own function for the contour approximation.

```
library(modelr)
make a smooth model
y.m = loess(prestige ~ education * income, data = Prestige)
make a regular grid of all combinations of education and income
mygrid <- Prestige |>
 data_grid(
 education = seq_range(education, 50),
 income = seq_range(income, 50)
) |>
 # add predicted prestige using the smooth model
 add_predictions(y.m, var = "predicted prestige")
make ggplot contour plot
p <- mygrid |>
 ggplot() +
 aes(x = education, y = income, z = `predicted prestige`) +
 geom_contour()
p
make a plotly version
library(plotly)
ggplotly(p)
```



```
filled contour ggplot
mygrid |>
 ggplot() +
 aes(x=education, y=income, z=`predicted prestige`) +
 stat_contour_filled()
or the older-style lattice graphs
library(lattice)
contourplot(`predicted prestige` ~ education * income,
 data = mygrid,
 cuts = 10, region = TRUE,
 xlab = "education ", ylab = "income ")
wireframe(`predicted prestige` ~ education * income,
 data = mygrid,
 cuts = 10, region = TRUE,
 xlab = "education ", ylab = "income ")
levelplot(`predicted prestige` ~ education * income,
 data = mygrid,
 cuts = 10, region = TRUE,
 xlab = "education ", ylab = "income ")
cloud(`predicted prestige` ~ income * education,
 data = mygrid)
```

Obtain the 3-D plot **prestige vs. education vs. income** :

Create prestige ~ education | type graphs. That is, prestige ~ education grouped by type as colours and/or panels.

```
Prestige |>
 ggplot() +
 aes(x = education, y = prestige, color = type) +
 geom_point() +
 facet_wrap(~ type)
or
library(plotly)
p <- Prestige |>
ggplot() +
aes(x = education, y = prestige, color = type) +
geom_point() +
 facet_wrap(~ type)
ggplotly(p)
p <- Prestige |>
 ggplot() +
 aes(x = education, y = prestige, color = type) +
 geom_point()
p
OR
library(plotly)
ggplotly(p)
```

Time-series data EDA based on RBNZ house sales data.

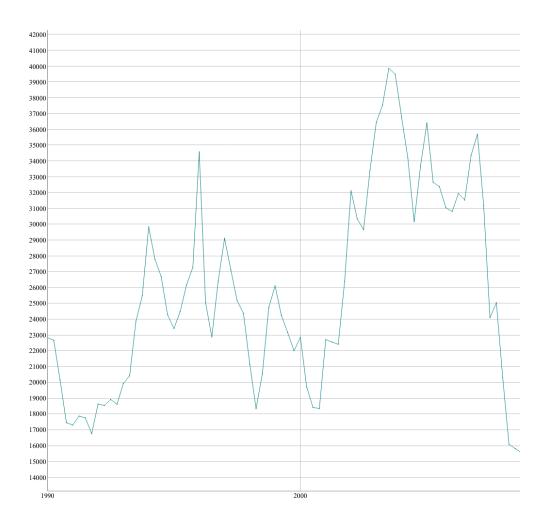
```
url1 <- "https://www.massey.ac.nz/~anhsmith/data/housesales.RData"
download.file(url = url1, destfile = "housesales.RData")
load("housesales.RData")

library(forecast)
autoplot(housesales)

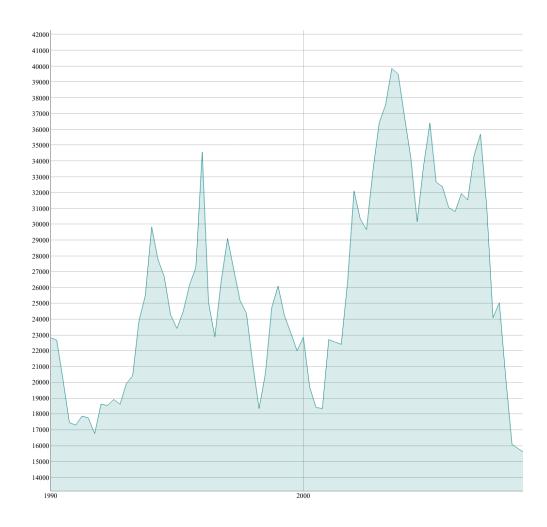
Dynamic graphing
https://rstudio.github.io/dygraphs/index.html

library(dygraphs)

dygraph(housesales) |>
 dyOptions(drawPoints = TRUE)
```



dygraph(housesales) |>
 dyOptions(fillGraph=TRUE)



```
ggseasonplot(housesales)
 ggsubseriesplot(housesales)
Series Decomposition
 library(tidyverse)
 housesales |>
 decompose(type="additive") |>
 forecast::autoplot() +
 ggtitle("")
 housesales |>
 decompose(type="multiplicative") |>
 forecast::autoplot() +
 ggtitle("")
lag & ACF plots
 gglagplot(housesales)
 gglagplot(housesales, seasonal=FALSE, lag=1)
 ggAcf(housesales)
 ggPacf(housesales)
 ggtsdisplay(housesales)
```

More graphing examples are here (R code file).