



# Advanced Analytics with R

Course Introduction



## Forbes Earning Preview: H.J. Heinz

A quality first quarter earnings announcement could push shares of H.J. Heinz (HNZ) to a new 52-week high as the price is just 49 cents off the milestone heading into the company's earnings release on Wednesday, August 29, 2012.

The Wall Street consensus is 80 cents per share, up 2.6 percent from a year ago when H.J reported earnings of 78 cents per share. The consensus estimate remains unchanged over the past month, but it has decreased from three months ago

when it was 82 cents. Analysts are expecting earnings of \$3.52 per share for the fiscal year. Analysts project revenue to fall 0.3 percent year-over-year to \$2.84 billion for the quarter, after being \$2.85 billion a year ago . For the year, revenue is projected to roll in at \$11.82 billion.



Paging

DR. WATSON



[illegible]





# BEHIND THE WHEEL

edited by PHIL LeBEAU

CONSUMER RETAIL MEDIA AUTOS FOOD AND BEVERAGE RESTAURANTS FASHION GOODS

## 'Driverless' beer run; Bud makes shipment with self-driving truck

Phil LeBeau | @Lebeaucarnews  
Tuesday, 25 Oct 2016 | 12:03 AM ET



19K SHARES

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As beer runs go, this one stands out.

**Anheuser-Busch** hauled a trailer loaded with beer 120 miles in an autonomous-drive truck, completing what's believed to be the first commercial shipment by a self-driving vehicle.

The trip happened last week in Colorado as Anheuser-Busch, collaborated with Otto, a subsidiary of Uber that is developing self-driving truck technology. The semi drove autonomously on the highway between Fort Collins, Colorado and Colorado Springs, Colorado.

"The incredible success of this pilot shipment is an example of what is

Let's write the future with robots that have what it takes to collaborate.

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ABB

### FROM THE WEB

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**4 Reasons You Don't Have to Settle for a High-Interest Loan - One Hou...**  
One Hour Loan Singapore



**Poor Judgment Cascaded in Tokyo Fish Market Mess**  
Nikkei Asian Review



Our workforce and industries have changed dramatically over time.

1940

2010

45,166,083  
Employees

139,033,928  
Employees

23.4%

18.5%

14.0%

8.9%

7.4%

Manufacturing

Agriculture

Retail trade

Personal  
services

Professional  
& related  
services

23.2%

11.7%

10.6%

10.4%

6.2%

Educational services,  
health care & social  
assistance

Retail trade

Professional, scientific,  
management &  
administrative services, waste  
management services

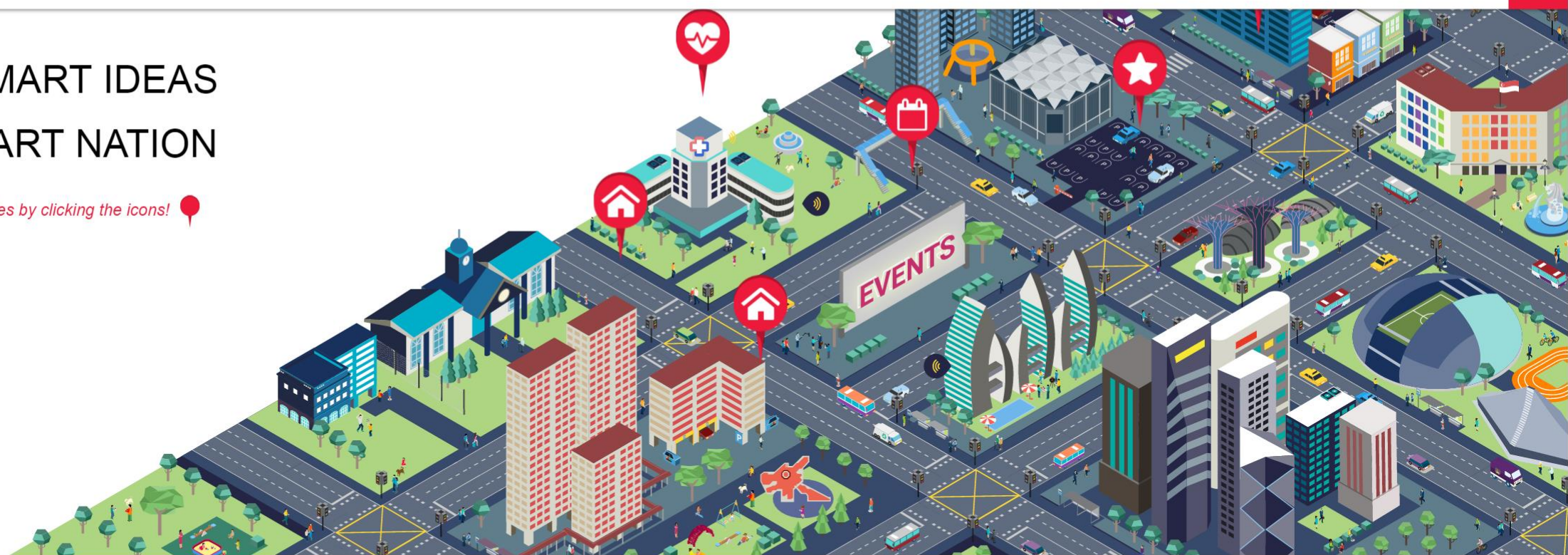
Manufacturing

Construction



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# PROGRAMMING IS NEW O-LEVEL SUBJECT FROM 2017: WHAT PARENTS MUST KNOW

MARCH 7, 2016



©Singapore Press Holdings Ltd

Bukit View Secondary School students Tan Whee Lee, Nicholas Chong, Tio Hui Li, M. Charulatha, head of department for science Ng Wuay Boon, level head for science and Applied Learning Programme Reena Lloyd, Brandon Ng and (squatting) Neo Jun Wei, with solar cars they built at the school on 19 February 2016. The school will be among 19 secondary schools to offer programming as part of a new O-level subject called computing in 2017.

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# Mining



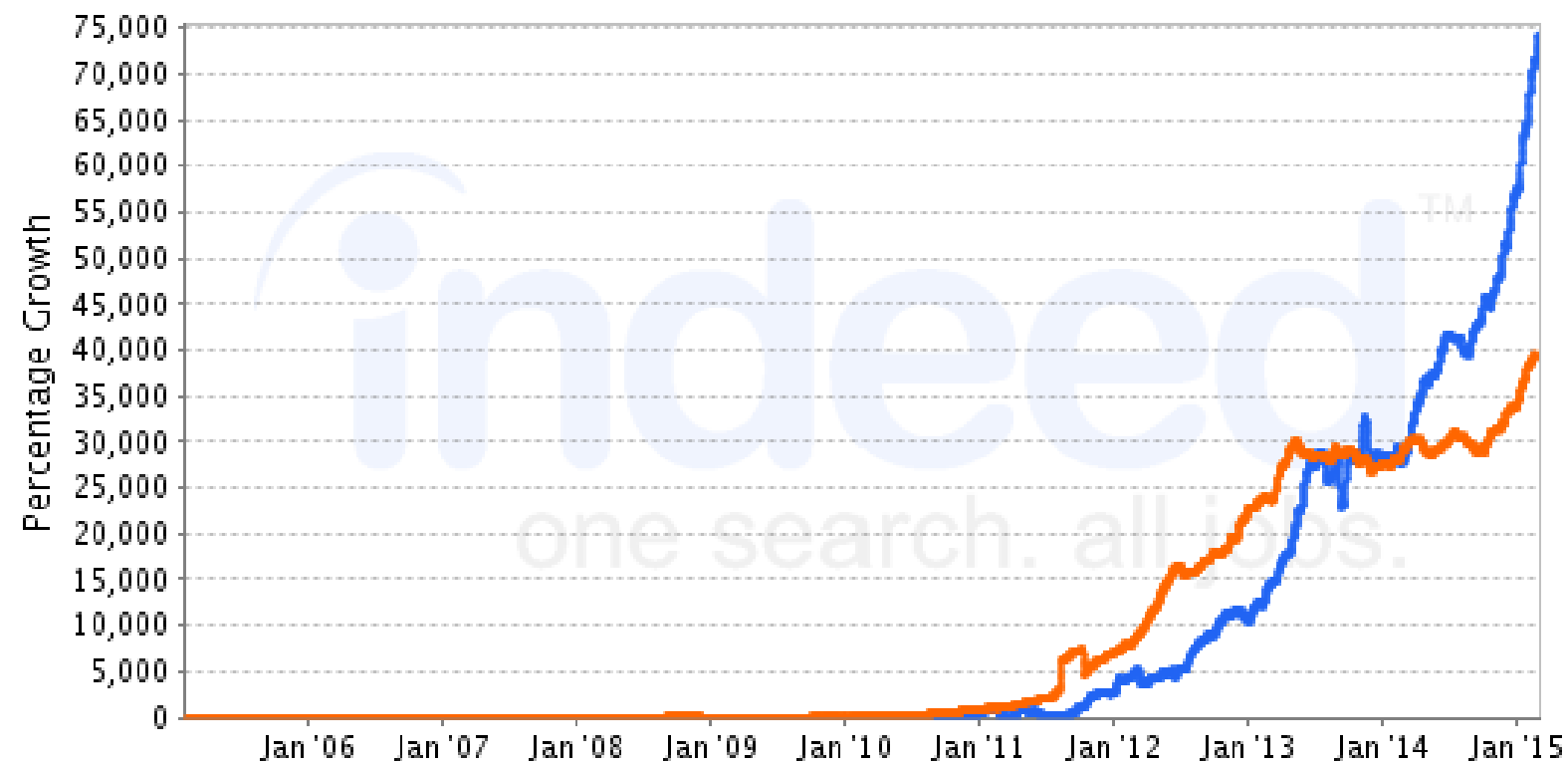
# Data Mining





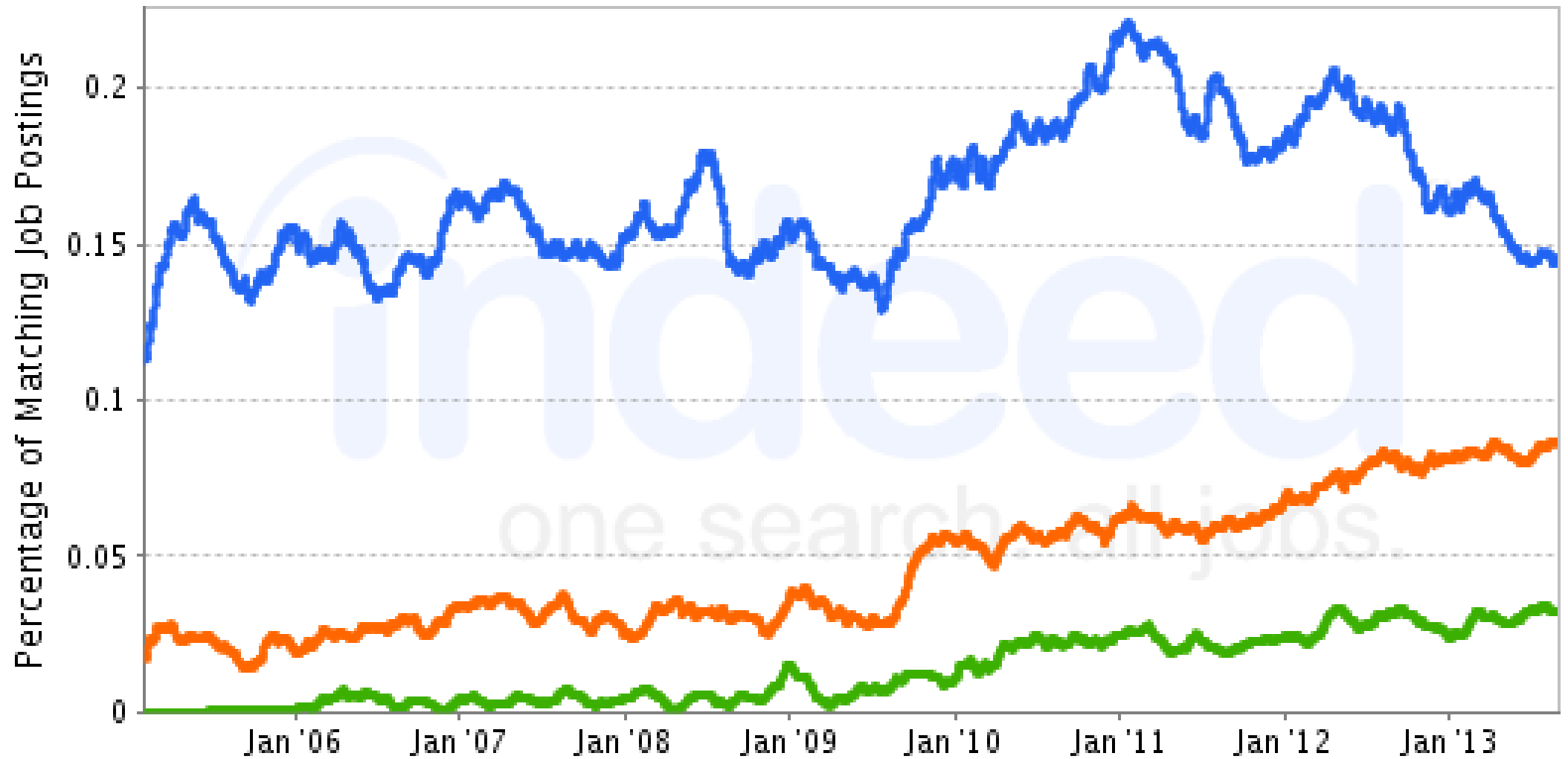
Job Trends from Indeed.com

big-data data-science



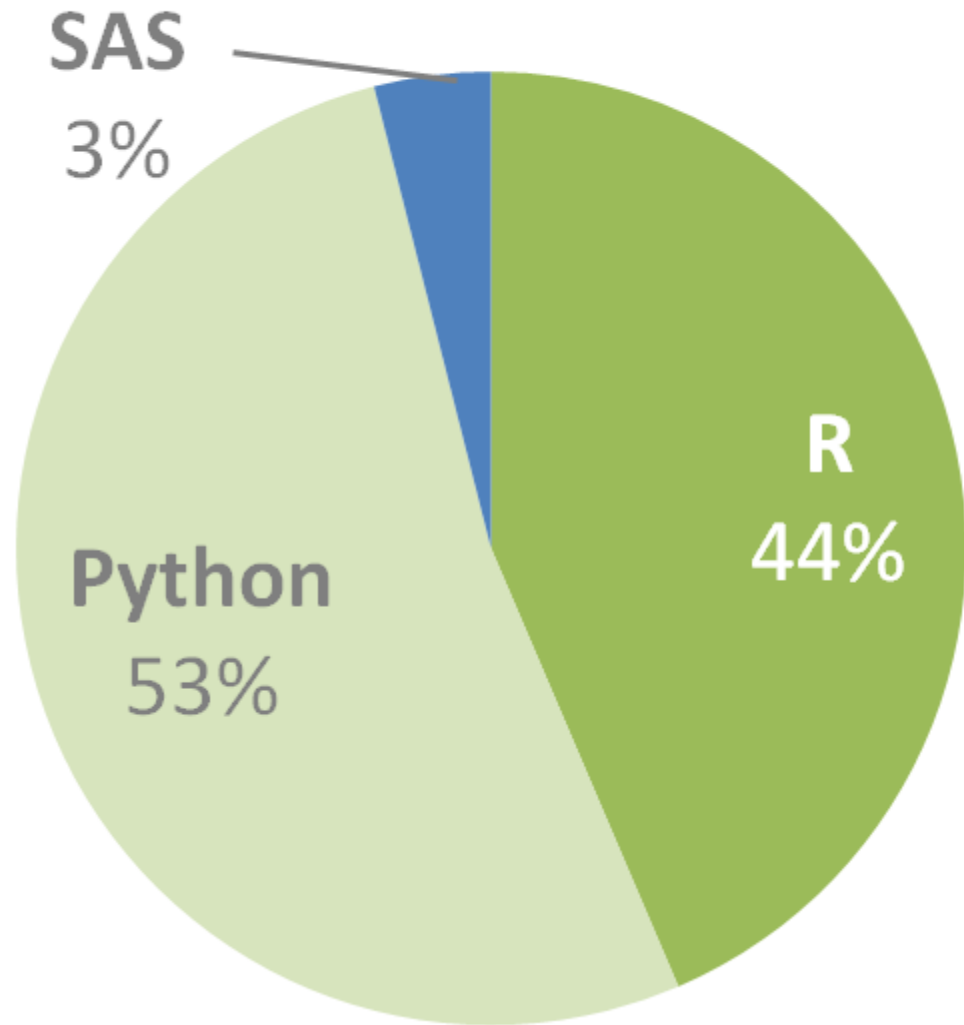
## Job Trends from Indeed.com

— R and "statistics" — SAS and "statistics" — Python and "statistics"

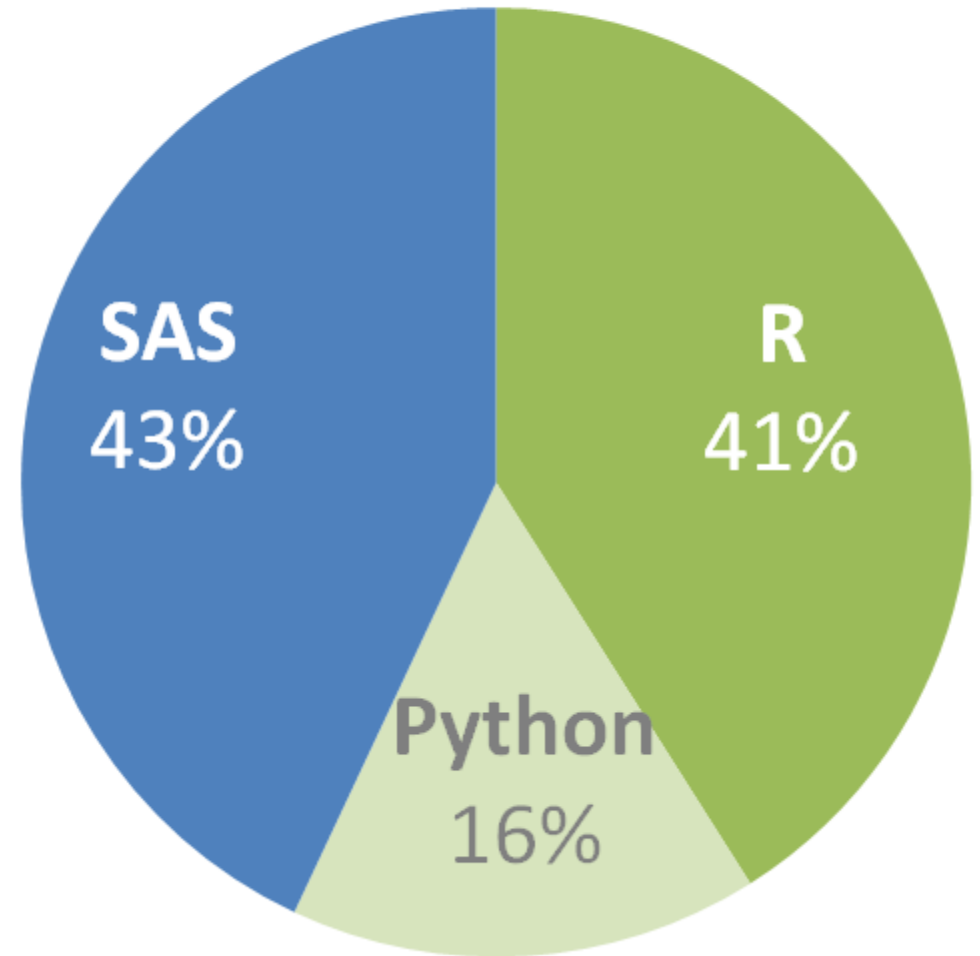




## Data Scientist



## Predictive Analytics



# Why R?

- R is free.
- R is a language. (You have the full flexibility and control)
- R is powerful.
- R has an amazing ecosystem of developers.



# Learning Objectives

- Master basic R programming techniques to model and analyse data.
- Self-explore R packages for analytics needs.
- Understand some common analytics methodologies used in current business environment.
- Appreciate what data science is.

# I am training what industry wants ...

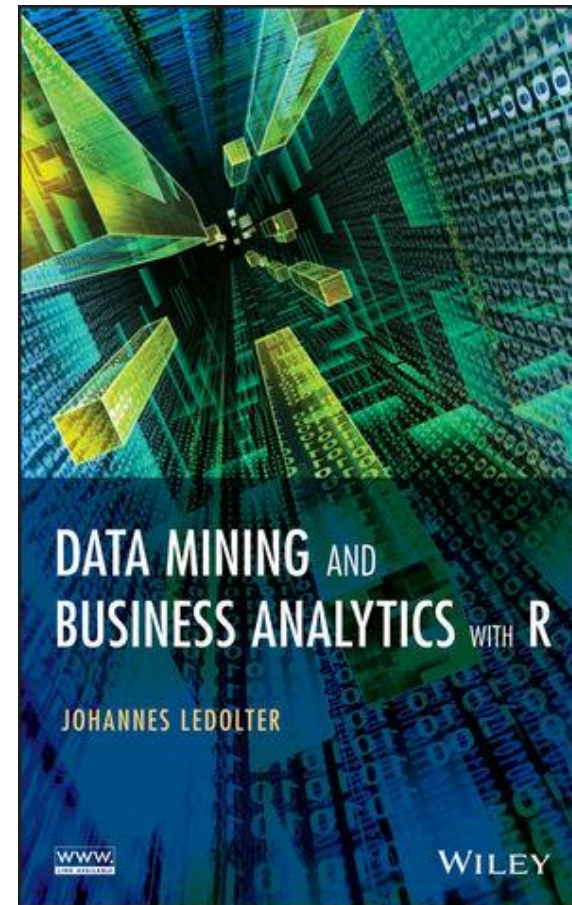
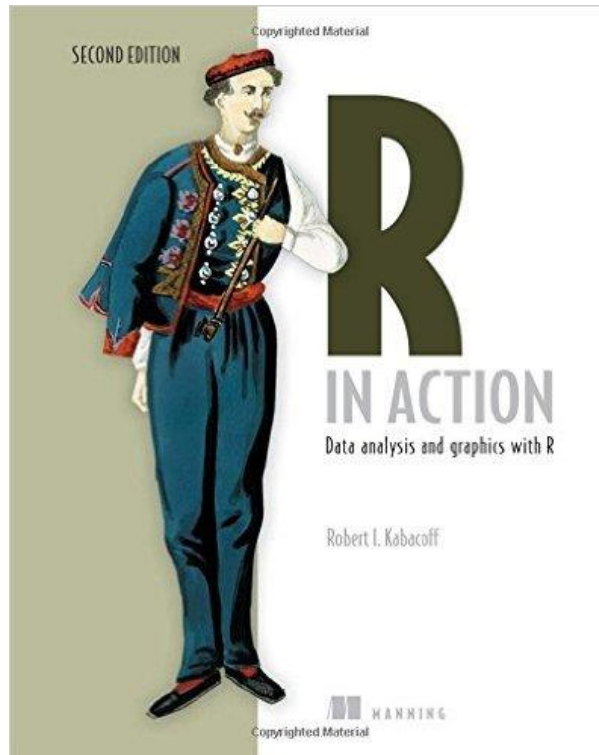




# Right expectations

- Learning programming can be very painful
  - But, believe me, it will be very rewarding
- Be prepared to solve problems yourself
- Be prepared to be better than the professor!!!

# Readings



# Topics

## Fundamentals

Basic components of R

Manipulating data

Exploring data

Data Visualization

Programming structure

## Applications

Simulation

Regression Modelling

Generalized Regression Modelling

Classification

Sentiment Analytics



# Assessment

• Class Participation	20%
• Group Project	40%
• Test 1	20%
• Test 2	20%

# Public datasets

- [http://hadoopilluminated.com/hadoop\\_illuminated/Public Bigdata Sets.html](http://hadoopilluminated.com/hadoop_illuminated/Public_Bigdata_Sets.html)
- <https://www.quora.com/Data/Where-can-I-find-large-datasets-open-to-the-public>
- <http://www.kdnuggets.com/datasets/index.html>
- [http://www.researchpipeline.com/mediawiki/index.php?title=Main Page](http://www.researchpipeline.com/mediawiki/index.php?title=Main_Page)

# Places to get help

- IVLE
- <https://www.r-project.org/>
- Stackoverflow.com
- Cross Validated

# R Communities

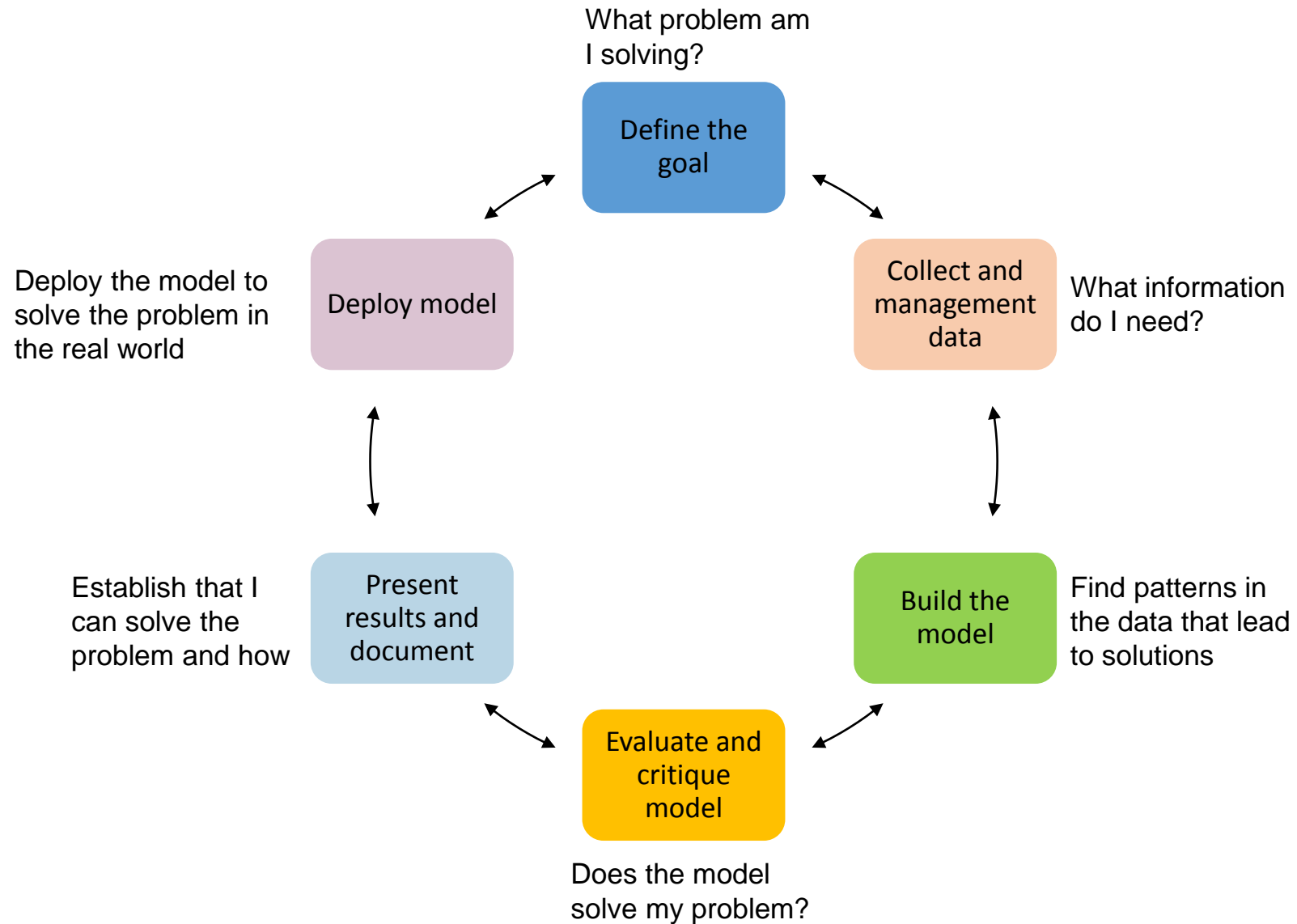
- <http://www.r-bloggers.com/>
- <https://twitter.com/search?q=%23rstats&src=typd>
- <http://www.revolutionanalytics.com/r-community>



# Good about R

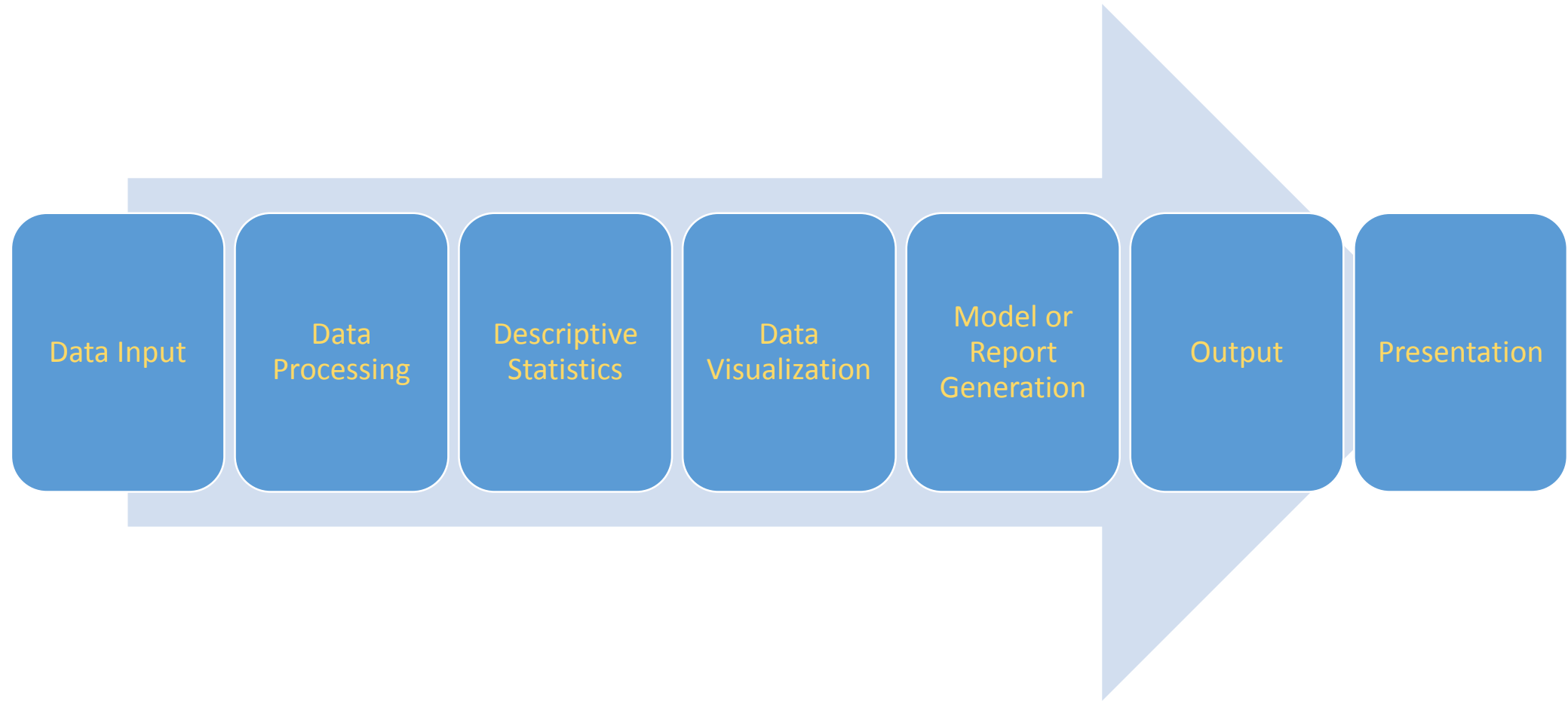
- What you can think of, someone may have done it for you.

# Data Science Project



Source: "Practical Data Science with R"

# Basic Analytics Steps





# Fundamental of R Programming

# Installation

- R: the core engine

Download at <http://www.r-project.org/> and install

- RStudio: the IDE

Download at <http://www.rstudio.com/ide/> and install

# Introduction to R Studio

The screenshot displays the RStudio environment with the following components:

- Script Editor:** Contains an R function named `HistogramTopicTime` that reads a CSV file, filters outliers, and generates plots (densityplot, boxplot, histogram).
- Environment Pane:** Shows the global environment with variables `df`, `g`, `q`, `x`, and `z`. It also lists values for `a`, `b`, `c`, `cr`, `d`, and `fixed`.
- Files Pane:** Lists installed and available packages in the user library.
- Console:** Displays the R version (3.2.2), copyright information, and workspace details.

**Script Editor Content:**

```
1 #This function visualizes time spent on questions VS topics
2 HistogramTopicTime<-function(time){
3   library(lattice)
4   data<-read.csv("practice_time view v6 - firstqnomitted.csv") #read in the data
5   data<-data[data$time_elapsed>=0 & data$time_elapsed<time,] #filter outlier data
6   topics<-c("Chain Rule", "Product Rule", "Quotient Rule", "Sum and Difference Rule", "Derivative of Exponential Function", "Derivative of Logarithmic Function", "Normal Differentiation")
7   labels<-c("CR", "PR", "QR", "SDR", "DEF", "DLF", "ND")
8   data<-data[data$topicName %in% topics, ]
9   data$topicName <- factor(data$topicName,
10     levels = topics,
11     labels = labels)
12   densityplot(~time_elapsed|topicName, data=data, layout=c(1, length(topics)),
13     col="black")
14   # boxplot(time_elapsed~topicName, data=data,
15     col="black")
16   # histogram(~time_elapsed|topicName, data=data, layout=c(1, length(topics)),
17     col="black")
18 }
19 }
```

**Environment Pane Data:**

Variable	Description
df	1 obs. of 3 variables
g	3653 obs. of 4 variables
q	7304 obs. of 4 variables
x	1461 obs. of 4 variables
z	117 obs. of 4 variables

**Environment Pane Values:**

Variable	Value
a	log1 [1:2] FALSE TRUE
b	log1 [1:2] FALSE TRUE
c	NULL (empty)
cr	num [1:234] -0.019 -0.1405 -0.0439 -0.0682 -0.1235 ...
d	3L
fixed	log1 [1:2] FALSE FALSE

**Files Pane Packages:**

Name	Description	Version
abind	Combine Multidimensional Arrays	1.4-3
acepack	ace() and avas() for selecting regression transformations	1.3-3.3
aplpack	Another Plot PACKAGE: stem.leaf, bagplot, faces, spin3R, plotsummary, plothulls, and some slider functions	1.3.0
arm	Data Analysis Using Regression and Multilevel/Hierarchical Models	1.8-6
bitops	Bitwise Operations	1.0-6
car	Companion to Applied Regression	2.1-0
caTools	Tools: moving window statistics, GIF, Base64, ROC AUC, etc.	1.17.1
cluster	"Finding Groups in Data": Cluster Analysis Extended Rousseeuw et al.	2.0.3
coda	Output Analysis and Diagnostics for MCMC	0.17-1
colorspace	Color Space Manipulation	1.2-6
combinat	combinatorics utilities	0.0-8
conf.design	Construction of factorial designs	2.0.0
curl	A Modern and Flexible Web Client for R	0.9.3
date	Functions for handling dates	1.2-34
DiagrammeR	Create Diagrams and Flowcharts Using R	0.7
dichromat	Color Schemes for Dichromats	2.0-0
digest	Create Cryptographic Hash Digests of R Objects	0.6.8
DoE.base	Full Factorials, Orthogonal Arrays and Base Utilities for DoE Packages	0.27-1
e1071	Misc Functions of the Department of Statistics, Probability Theory Group (Formerly: E1071), TU Wien	1.6-6
effects	Effect Displays for Linear, Generalized Linear, and Other Models	3.0-4

**Console Output:**

```
R version 3.2.2 (2015-08-14) -- "Fire safety"
Copyright (C) 2015 The R Foundation for Statistical Computing
Platform: x86_64-w64-mingw32/x64 (64-bit)

R is free software and comes with ABSOLUTELY NO WARRANTY.
You are welcome to redistribute it under certain conditions.
Type 'license()' or 'licence()' for distribution details.

R is a collaborative project with many contributors.
Type 'contributors()' for more information and
'citation()' on how to cite R or R packages in publications.

Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.

[workspace loaded from C:/RProjects/.RData]
> |
```



# Making notes using R Markdown

The screenshot displays the RStudio interface with the 'File' menu open, highlighting 'R Markdown...'. The script editor contains R code for creating a matrix and using negative indexing. The console shows the execution of these commands, including a warning message. The viewer pane on the right displays the R documentation for the `html_nodes` function from the `selectr` package.

**File Menu Options:**

- New File
  - R Script (Ctrl+Shift+N)
  - R Markdown...**
  - Shiny Web App...
  - Text File
  - C++ File
  - R Sweave
  - R HTML
  - R Presentation
  - R Documentation
- New Project...
- Open File... (Ctrl+O)
- Reopen with Encoding...
- Recent Files
- Open Project...
- Open Project in New Session...
- Recent Projects
- Save (Ctrl+S)
- Save As...
- Save with Encoding...
- Save All (Ctrl+Alt+S)
- Knit Document (Ctrl+Shift+K)
- Publish...
- Print...
- Close (Ctrl+W)
- Close All (Ctrl+Shift+W)
- Close All Except Current (Ctrl+Alt+Shift+W)
- Close Project
- Quit Session... (Ctrl+Q)

**Script Editor Content:**

```
# column (*cbind*). For example,
# each will make it effectively as inserting a column (row). For example,
# it is useful to take a look at the beginning (head) or the end (tail) of it.
# return 6 rows of data
# exactly how many rows of data to return
# matrix or data frame by specifying the corresponding indices. For example,
# a[c(2,3,7)]
# Negative index works oppositely. You will obtain all elements except those given in negative index. Let me use the following example to illustrate this principle. Suppose we have a vector of numbers. Now we want to find the difference between each element and its predecessor. It can be done easily with negative index.
# a[-1] - a[1:length(a)]
```

**Console Output:**

```
[1] "matrix"
> cbind(a,1,E=c(1,3,2))
      E
[1,] 1 1 1 1
[2,] 2 2 1 1
[3,] 1 3 1 2
[4,] 2 4 1 1
[5,] 1 5 1 3
[6,] 2 6 1 2
> matrix(3:7,nrow=2,ncol=3)
      [,1] [,2] [,3]
[1,] 3 5 7
[2,] 4 6 3
Warning message:
In matrix(3:7, nrow = 2, ncol = 3) :
  data length [5] is not a sub-multiple or multiple of the number of rows [2]
> matrix(3:4,nrow=2,ncol=3)
      [,1] [,2] [,3]
[1,] 3 3 3
[2,] 4 4 4
> matrix(3:5,nrow=2,ncol=3)
      [,1] [,2] [,3]
[1,] 3 5 4
[2,] 4 3 5
```

**Environment Panel:**

Object	Class	Attributes
a	int	[1:6, 1:2] 1 2 1 2 1 2 1 2 3 4 ...
b	1436 obs. of 1 variable	
cars	1436 obs. of 10 variables	
cars1	1428 obs. of 10 variables	
co2	226 obs. of 13 variables	
co2ByCountry	199 obs. of 2 variables	
custdata	1000 obs. of 11 variables	
data.f	12 obs. of 6 variables	
Fish	4728 obs. of 6 variables	
Fishing	1182 obs. of 10 variables	
H	4500 obs. of 10 variables	
Heating	900 obs. of 16 variables	
median.income	57 obs. of 7 variables	
mtcars	32 obs. of 11 variables	
mydata	1 obs. of 4 variables	
newData	1000 obs. of 18 variables	
...	...	...

**Viewer Panel:**

### Select nodes from an HTML document

**Description**

More easily extract pieces out of HTML documents using XPath and CSS selectors. CSS selectors are particularly useful in conjunction with <http://selectorgadgets.com/>; it makes it easy to find exactly which selector you should be using. If you haven't used CSS selectors before, work your way through the fun tutorial at <http://fukeout.github.io/>.

**Usage**

```
html_nodes(x, css, xpath)
```

**Arguments**

- `x`: Either a document, a node set or a single node.
- `css`: Nodes to select. Supply one of `css` or `xpath` depending on whether you want to use a CSS or XPath 1.0 selector.
- `xpath`: XPath 1.0 selector.

**html\_node VS html\_nodes**

`html_node` is like `[]` (it always extracts exactly one element. When given a list of nodes, `html_node` will always return a list of the same length, the length of `html_nodes` might be longer or shorter).

**CSS selector support**

CSS selectors are translated to XPath selectors by the `selectr` package, which is a port of the python `cssselect` library, <https://pythonhosted.org/cssselect/>.

It implements the majority of CSS3 selectors, as described in <http://www.w3.org/TR/2011/REC-css3-selectors-20110929/>. The exceptions are listed below:


- Pseudo selectors that require interactivity are ignored: `:hover`, `:active`, `:focus`, `:target`, `:visited`.
- The following pseudo classes don't work with the wild card element `*`: `:first-of-type`, `:last-of-type`.

# Working Environment

- `getwd()` - Get the current working directory
- `setwd()` - Set the working directory to a specific folder
- `list.files()` - list all the files/directories under a specific folder
- `objects()` – list all the objects stored in current environment

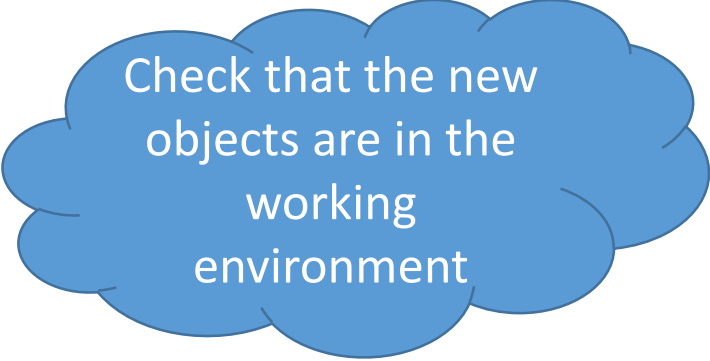
# Create Objects

```
> x<-1  
> y<-2  
> y<-TRUE  
> z<-c("A","B","C")  
.
```



Create three new  
objects

```
> ls()
```



Check that the new  
objects are in the  
working  
environment

# Remove Object

```
> rm(x)  
> ls()
```



Remove x from  
the environment

```
> rm(list = ls())
```



Remove all  
objects from the  
environment

Warning: Don't do this unless  
necessary!!!

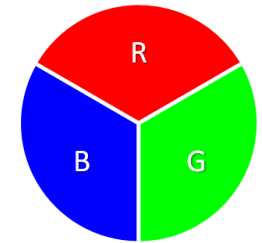
# Exercise

- Open “Lasagna Triers.csv” file.
- Discuss the various types of fields in the file.



# Data Type

- R has five basic or “atomic” classes of objects
  - Character
  - Numeric
  - Integer
  - Complex
  - logical
- On top of basic classes, you can build objects such as
  - Vector
  - List
  - Matrix
  - Factor
  - Data Frames



# Character

- A ***character*** object is used to represent string values in R. For example, “James”, “China”, etc.

```
> x <- "James"  
> class(x)
```

# Commonly used functions on character

Function	Description	Example
nchar()	Get the number of characters in the string	<i>a&lt;-"Singapore"</i> <i>nchar(a)</i>
regexpr()	Find the starting position of a small string in a large string	<i>regexpr("ex", "longtext")</i>
gregexpr()	find positions of every match of a small sting in a large string	<i>gregexpr("a","banana")</i>
grep()	find the positions of a regular expression in a vector of text strings	<i>txt&lt;-c("arm","foot","lefroo",</i> <i>"bafoobar")</i> <i>grep("foo", txt)</i>
substr()	extract part of a text string based on position in the text string	<i>substr("Singapore",2,4)</i>
sub()	replace the first match of a string with a new string	<i>sub("or","es","Singapore")</i>
gsub()	replace every match of a given sub string in a string with a new string	<i>gsub("a","o","banana")</i>
paste()	combine two strings into a new string	<i>paste("Liu", "Qizhang")</i>

# Logical

- A **logical** value is normally produced by some logical operations.

Operator	Description	Example
>	Check if a number is more than the other	5 > 3
<	Check if a number is less than the other	3 < 5
==	Check if two values are the same	3 == 5
<=	Check if a number is less than or equal to the other	3 <= 5
>=	Check if a number is greater than or equal to the other	3 >= 5
!=	Check if a number is unequal to the other	3 != 5
&	(AND) It combines two logical values. It is TRUE only if both logical values are TRUE	(5>3) & (4>2)
	(OR) It combines two logical values. It is FALSE only if both logical values are FALSE	(5>3)   (4>2)
!	(NOT) Gives opposite value of the given logical value	!(5 > 3)

# Numeric

- Decimal values are called numeric in R. It is the **default** computational data type.

```
> x <- 1.20  
> class(x)  
[1] "numeric"
```

```
> x <- 2  
> class(x)  
[1] "numeric"
```



# Integer

- Integer is a special data type for integer values.

```
x<-as.integer(2)
class(x)
```

```
x<-2L
class(x)
```

```
x<-as.integer(5>6)
x
```

# Coercion

- Use `as(object)` function to convert an object from one data type to another. This is called ***coercion***.
- Coercion order: logical < integer < numeric < complex < character

# Vector

- Vector is the most basic data structure. It stores an ordered array of elements of the **same** data type.

```
a<-c(3,1,5)  
a
```

```
b<-1:4  
b
```

```
c<-c(a,b)  
c
```

```
d<-c("Name",1)  
d
```

# Special vectors

- `seq()` creates a vector of numbers in a special sequence.

```
seq(1, 9, 2)
```

- `rep()` creates a vector which is a replication of a number or a vector

```
rep(c(2, 3, 4), 3)
```

# Computing basic statistics

- `mean(x)`
- `median(x)`
- `sum(x)`
- `sd(x)`
- `var(x)`
- `cor(x,y)`
- `cov(x,y)`
- `max(x)`
- `min(x)`



# Selecting Vector Elements

- Use `[]` to select vector elements by their positions.
- Use negative indexes to exclude elements
- Use a vector of indexes to select multiple values
- Use a logical vector to select elements based on a condition
- Use names to access named elements

# List

- List is more flexible than vector. It allows multiple types of elements, including list itself.
- A list is constructed by *list()* command.

```
Mike<-list(Name="Mike",Salary=10000,Age=43,Children=c("Tom","Lily","Alice"))  
Mike
```

# Matrix

- **Matrix** is a **vector** of elements arranged in two dimensions.

```
m1<-matrix(3:8,ncol=3,nrow=2)
m1
```

- It can be formed by introducing *dim()*.

```
m2<-3:8
```

```
dim(m2)<-c(3,2)
m2
```

```
dim(m2)<-c(2,3)
m2
```

- Matrix is the data structure in R corresponding to matrix in linear algebra.

# Naming a matrix

```
m3<-matrix(3:8,ncol = 3,nrow = 2,byrow = TRUE)
```

```
rownames(m3)<-c("Row1","Row2")  
colnames(m3)<-c("Col.1","Col.2","Col.3")  
m3
```

```
m3["Row1","Col.2"]
```

# Data Frame

- The most commonly used data structure in R is *data frame*, which is an extension of matrix by allowing co-existence of data of various types.
- A column in a data frame normally represents a data field.
- A row in a data frame normally corresponds to a record of the data.

# Construct a data frame

```
df<-data.frame(ID=c(1,2,3),Names=c("James","Jack","Tom"),Values=rnorm(3,mean=100,sd=10))  
df
```



# Explore data set

- Explore data set *mtcars*

# Factor

- ***Factors*** are special variables used to store categorical variables.
- Factor is not an atomic data type and it can be either a numeric data or a character data.

# Advantage of using factor

- Factor variables are stored as a vector of integer values, thus it is a more efficient use of memory. Yet, the original set of character values will be used when the factors are displayed, which will make the data presentation more meaningful.
- Many statistical models will automatically handle factor variables properly.
- Factor variables are also very useful in many different types of graphics.

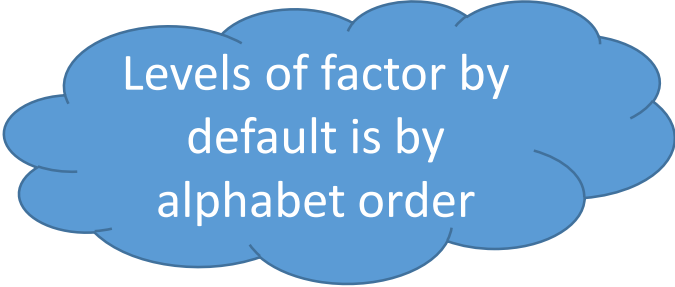
# Example

```
a<-c("Snake", "Dog", "Elephant", "Dog", "Cat" )
```

```
b <- factor(a)
```

```
b
```

```
as.integer(b)
```

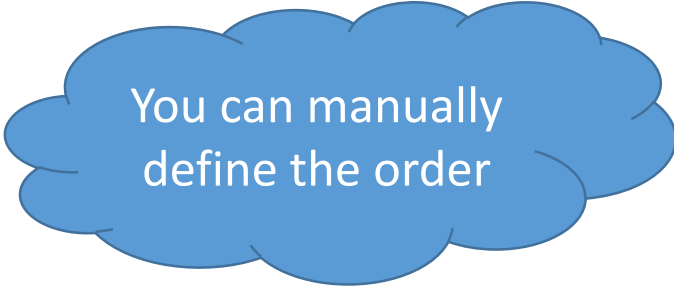


Levels of factor by  
default is by  
alphabet order

```
b <-factor(a, levels=c("Snake", "Cat", "Dog", "Elephant"))
```

```
b
```

```
as.integer(b)
```



You can manually  
define the order