

IST 3420: Introduction to Data Science and Management

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3. Data Basics

Reading Assignment 6 (due Sep 3)

- ▶ Stevens, S. S. (1946). On the Theory of Scales of Measurement. *Science*, 103(2684), 677-680.
- ▶ Read "HTML Tutorial" from <http://www.w3schools.com/html/default.asp>
 - ▶ You need to read from "HTML HOME" to "HTML Tables".

Agenda

- ▶ **Data, Dataset, and Scales of Measurement**

- ▶ Data Collection
- ▶ Working with CSV
- ▶ Working with Rational Database
- ▶ Working with HTML
- ▶ Working with XML and JSON
- ▶ Working with APIs

Data and Data Set

- ▶ Data are the facts collected, analyzed, and interpreted.
- ▶ The data collected in a particular data science project are commonly referred to as a data set.

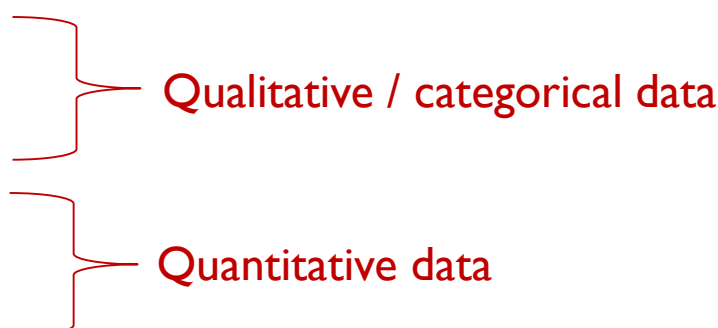
Data Set: Elements, Variables, and Observations

- ▶ Elements/subjects: entities of interest
- ▶ Variables: characteristic of elements
- ▶ Observation: the set of measurements obtained for an element

The diagram shows a data table with annotations. The label 'Variables' has arrows pointing to the columns 'mpg', 'cyl', 'hp', and 'wt'. The label 'Element Names' has arrows pointing to the rows 'Mazda RX4', 'Mazda RX4 Wag', 'Hornet Sportabout', and 'Valiant'. The label 'Observations' has an arrow pointing to the row 'Mazda RX4 Wag', which is also highlighted with a blue border.

car	mpg	cyl	hp	wt
Mazda RX4	21	6	110	2.62
Mazda RX4 Wag	21	6	110	2.875
Datsun 710	22.8	4	93	2.32
Hornet 4 Drive	21.4	6	110	3.215
Hornet Sportabout	18.7	8	175	3.44
Valiant	18.1	6	105	3.46

Scales of Measurement

- ▶ Scale/level of measurement determines:
 - ▶ the amount of information contained in data
 - ▶ data summarization and analysis methods that are appropriate
- ▶ Four types of scales
 - ▶ Nominal
 - ▶ Ordinal
 - ▶ Interval
 - ▶ Ratio

The diagram uses red curly braces to group the four scales into two categories. A brace on the right side groups 'Nominal' and 'Ordinal' under the label 'Qualitative / categorical data'. Another brace on the right side groups 'Interval' and 'Ratio' under the label 'Quantitative data'.

 - Qualitative / categorical data
 - Quantitative data

Nominal Scale

- ▶ Numerical values are just names or labels of the attribute
 - ▶ Ordering of these values is meaningless
 - ▶ No mathematical calculation (+, -, *, /) applicable
- ▶ For example:
 - ▶ Gender (1 = “Male”, 0 = “Female”)
 - ▶ Student ID (1,2,3...)
 - ▶ Department (1 = “BIT”, 2 = “CS”...)
 - ▶ Zip code (65401, 65402...)

Ordinal Scale

- ▶ Attributes can be ranked/ordered.
- ▶ For example:
 - ▶ Football team rank (1st, 2nd, 3rd...)
 - ▶ Customer rating (1 = “Bad”, 2 = “OK”, 3 = “Excellent”)

Interval Scale

- ▶ Have all characteristics of ordinal scale
- ▶ Distance between attributes does have meaning.
- ▶ Ratios are not meaningful.

- ▶ For example:
 - ▶ Temperature
 - ▶ The distance from 40 – 60 is same as the distance from 60 – 80
 - ▶ 80 cannot be said as twice hot as 40
 - ▶ SAT Score
 - ▶ GMAT Score

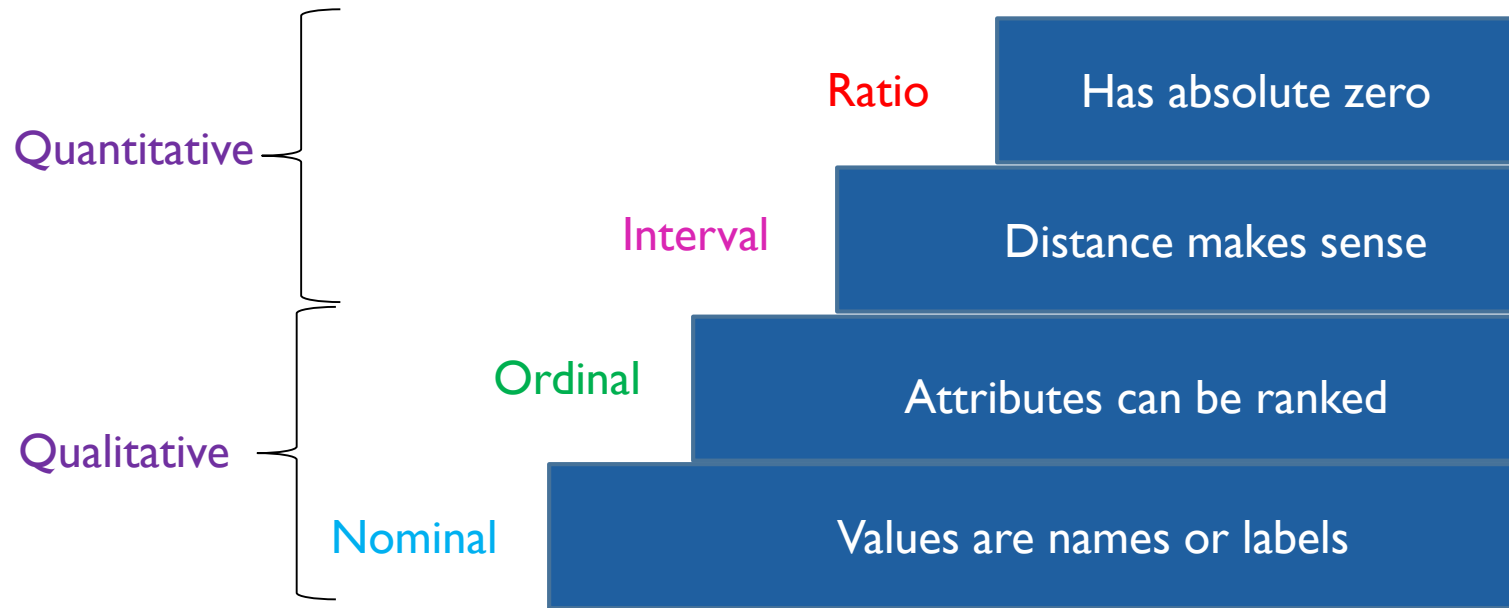
Ratio Scale

- ▶ Have all characteristics of interval scale
- ▶ A ratio of two values is meaningful.
- ▶ An absolute zero is meaningful.

- ▶ For example:
 - ▶ Weight
 - ▶ Height
 - ▶ Distance
 - ▶ Number of visits
 - ▶ Credit hours earned

Hierarchy of Measurement Scales

- ▶ A higher level scale contains all properties of its lower scale.
- ▶ From lower to higher levels, analysis tends to be more comprehensive. Improper use of lower level scales suffers information loss in the data
- ▶ In general, we prefer a higher scale of measurement than a lower one.

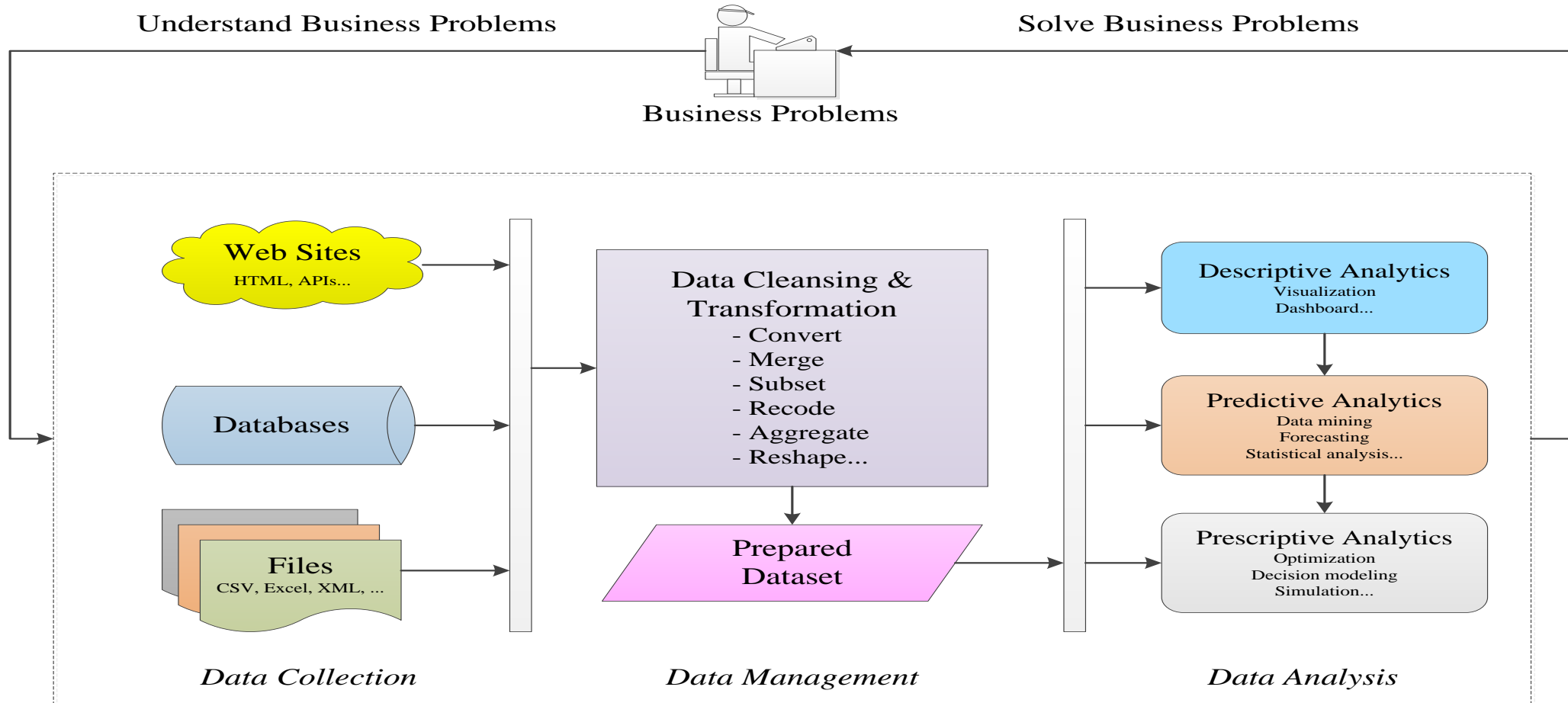


Agenda

- ▶ Data, Dataset, and Scales of Measurement
- ▶ Data Collection
- ▶ Working with CSV
- ▶ Working with Rational Database
- ▶ Working with HTML
- ▶ Working with XML and JSON
- ▶ Working with APIs

Data Collection for Data Science

- ▶ Data collection is the first step in data science procedures.



Data Sources

- ▶ Primary data: collect first-hand data through experimental or observational studies (e.g., survey)
- ▶ Secondary data: reuse existing data
 - ▶ Database or data warehouse
 - ▶ Dataset collected by someone else
 - ▶ Data downloaded from organizations such as government agencies and industry associations
 - ▶ Digital trace data recorded by computer systems
 - ▶ Web server logs
 - ▶ Internet social media and user-generated content
 - ▶ ...
- ▶ In this course, we focus on the management and analysis of existing data.

Major Contents to Cover

- ▶ General principles for data management
- ▶ Common data representation structures such as database, CSV, HTML, XML, JSON
- ▶ Commonly used data collection methods

Common Data Collection Methods

- ▶ CSV
- ▶ Relational Database
- ▶ XML and JSON
- ▶ Web Scraping (copy and paste is inefficient)
 - ▶ HTML
 - ▶ API

Web scraping (web harvesting or web data extraction) is a computer software technique of extracting information from websites.

---- Wikipedia (https://en.wikipedia.org/wiki/Web_scraping)

Agenda

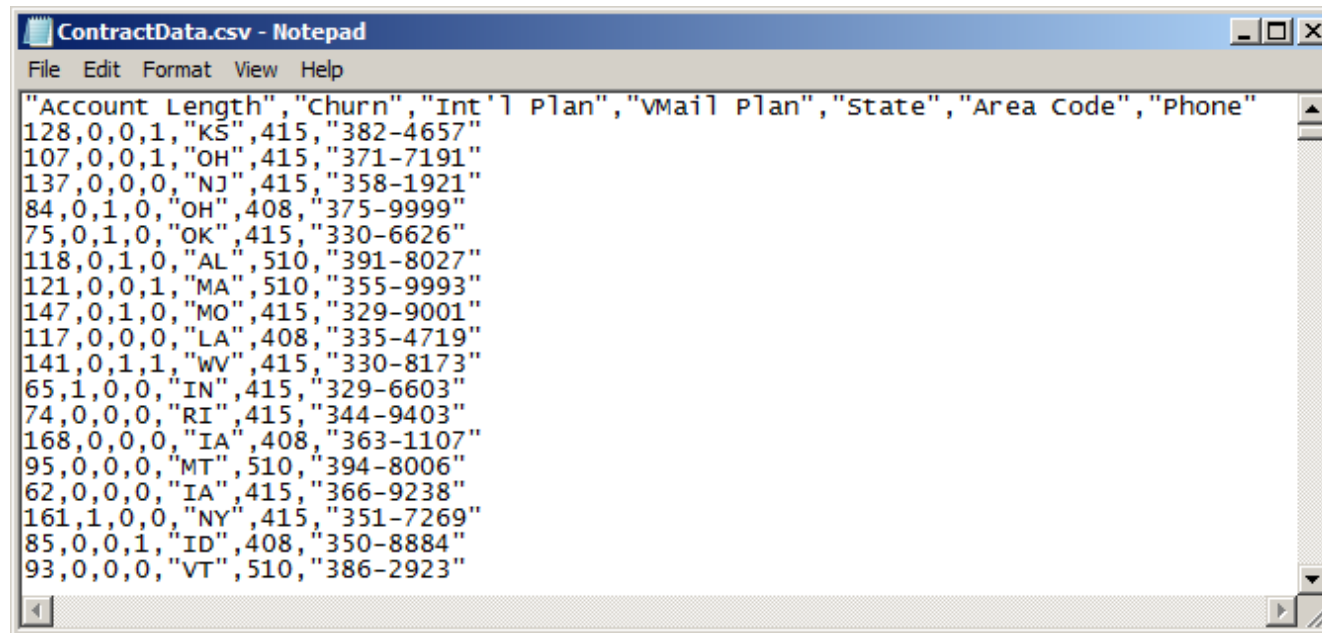
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Working with CSV Files

Comma Separated Values (CSV) Files

- ▶ CSV is a widely used data exchange format. Nowadays many companies are still using CSV to share information with their customers and suppliers.
- ▶ CSV files save tabular data in plain text.
 - ▶ Use comma (",") to separate data fields
 - ▶ May use the first line as a header containing field names
 - ▶ May use single or double quotation marks around some or all fields



```
ContractData.csv - Notepad
File Edit Format View Help
"Account Length","Churn","Intl Plan","VMail Plan","State","Area Code","Phone"
128,0,0,1,"KS",415,"382-4657"
107,0,0,1,"OH",415,"371-7191"
137,0,0,0,"NJ",415,"358-1921"
84,0,1,0,"OH",408,"375-9999"
75,0,1,0,"OK",415,"330-6626"
118,0,1,0,"AL",510,"391-8027"
121,0,0,1,"MA",510,"355-9993"
147,0,1,0,"MO",415,"329-9001"
117,0,0,0,"LA",408,"335-4719"
141,0,1,1,"WV",415,"330-8173"
65,1,0,0,"IN",415,"329-6603"
74,0,0,0,"RI",415,"344-9403"
168,0,0,0,"IA",408,"363-1107"
95,0,0,0,"MT",510,"394-8006"
62,0,0,0,"IA",415,"366-9238"
161,1,0,0,"NY",415,"351-7269"
85,0,0,1,"ID",408,"350-8884"
93,0,0,0,"VT",510,"386-2923"
```

Comments on CSV Files

- ▶ A very simple design of CSV files is to use plain text to store tabular data.
- ▶ CSV files can be easily read or written by using Notepad, MS Excel, and other software tools.
- ▶ However, a plain text format is very difficult to store complicated data such as long textual data. Important format information may be lost.

R Code: Read and Write CSV Files

```
# Set working directory to the folder which contains the CSV file
setwd("D:\\Cloud\\Dropbox\\Teaching 2016 Fall\\IST 3420\\03.Data Basics")
# Read CSV file
call_data <- read.csv(file = "CallsData.csv", header = TRUE)
head(call_data)
summary(call_data)

# Another way is to use read.table() function
call_data2 <- read.table("CallsData.csv", header = TRUE, sep = ",")
head(call_data2)
summary(call_data2)

# Select Area Code and Phone number and combine them into a new list
phone <- cbind(call_data$Area.Code, as.character(call_data$Phone))
colnames(phone) <- c("AreaCode", "PhoneNum")
# Write the phone data into csv file under the working directory
write.csv(phone, file = "Phone.csv")
# Write the phone data into a .txt file, using tab as field separator
write.table(phone, file = "Phone.txt", sep = "\t")

# Show all files under the working directory
dir()
```

Agenda

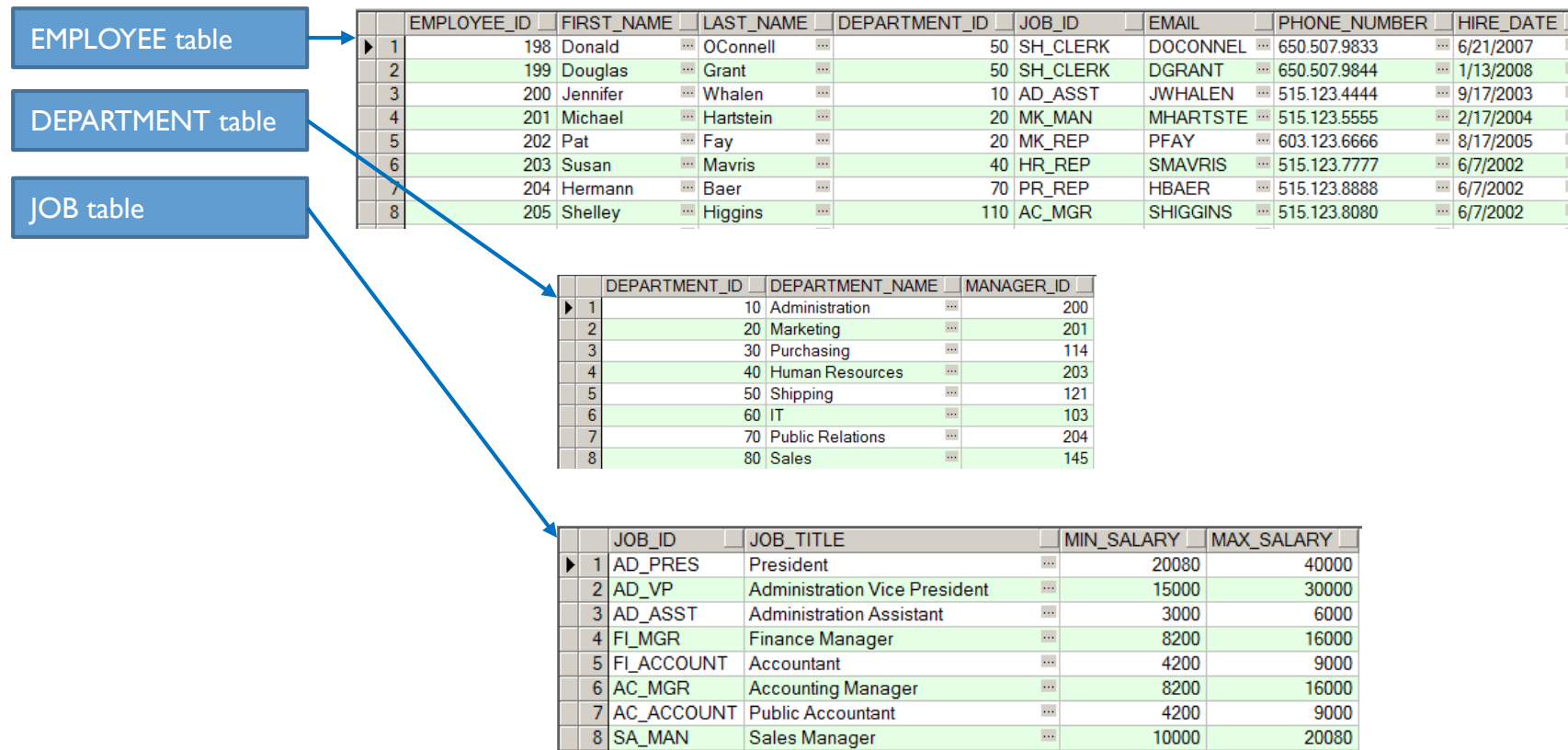
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Working with Relational Database

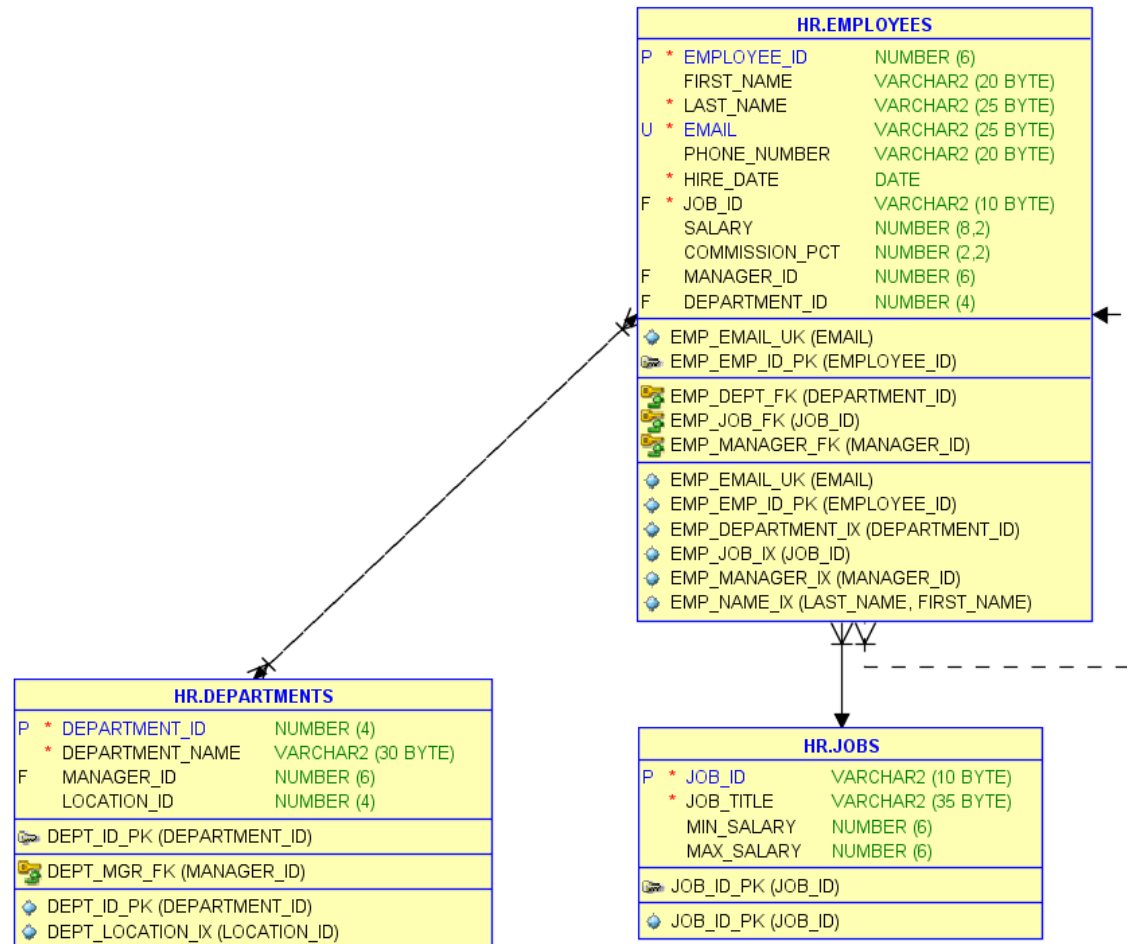
Relational Database

- ▶ A relational database consists of a collection of related data tables



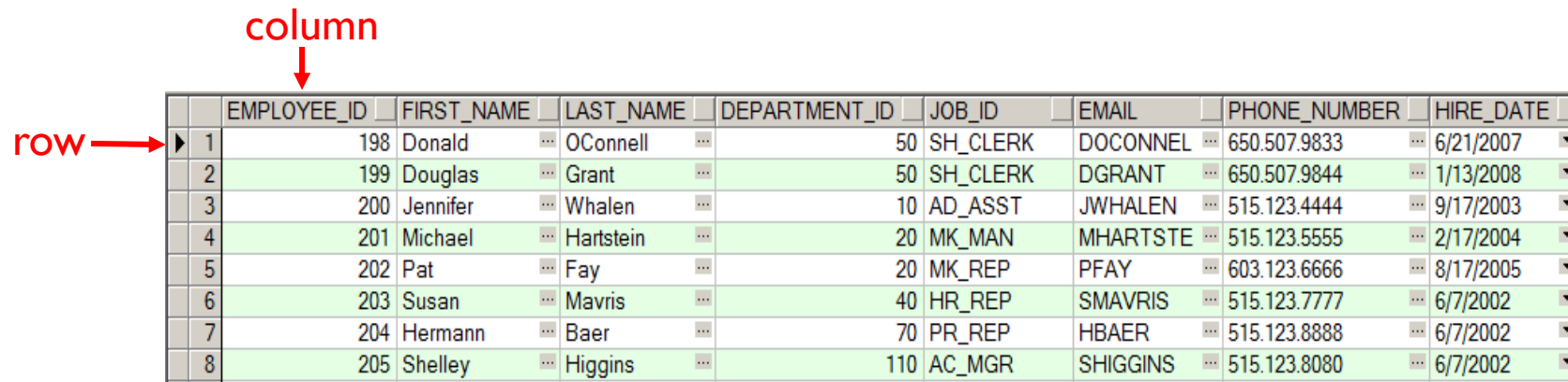
Entity Relationship Diagrams (ERD)

- ▶ An ERD describes business entities and their relationships



Database Tables

- ▶ A table is a collection of related data held in a structured format within a database. It consists of columns, and rows.
- ▶ A column (aka attribute, or field) defines the characteristics of the data stored in the column
- ▶ A row (aka record, or tuple) represents a single, implicitly structured data item



	EMPLOYEE_ID	FIRST_NAME	LAST_NAME	DEPARTMENT_ID	JOB_ID	EMAIL	PHONE_NUMBER	HIRE_DATE
1	198	Donald	OConnell	50	SH_CLERK	DOCONNEL	650.507.9833	6/21/2007
2	199	Douglas	Grant	50	SH_CLERK	DGRANT	650.507.9844	1/13/2008
3	200	Jennifer	Whalen	10	AD_ASST	JWHALEN	515.123.4444	9/17/2003
4	201	Michael	Hartstein	20	MK_MAN	MHARTSTE	515.123.5555	2/17/2004
5	202	Pat	Fay	20	MK_REP	PFAY	603.123.6666	8/17/2005
6	203	Susan	Mavris	40	HR_REP	SMAVRIS	515.123.7777	6/7/2002
7	204	Hermann	Baer	70	PR_REP	HBAER	515.123.8888	6/7/2002
8	205	Shelley	Higgins	110	AC_MGR	SHIGGINS	515.123.8080	6/7/2002

Structured Query Language (SQL)

- ▶ A query language designed to manipulate data held in a relational DBMS
- ▶ Initially developed at IBM in the early 1970s
- ▶ Became a standard of the American National Standards Institute (ANSI) in 1986
- ▶ Beyond the ANSI-standard SQL, variants are supported by different DBMS platforms
 - ▶ Oracle: PL/SQL
 - ▶ Microsoft SQL Server: Transact-SQL
 - ▶ IBM DB2: SQL PL
 - ▶ MySQL: SQL/PSM

SQL Select Statement

- ▶ SELECT is the most common operation in SQL.
- ▶ SELECT retrieves data from one or more tables, or expressions.
- ▶ Standard SELECT statements have no persistent effects on the database.

- ▶ Syntax:

```
SELECT {ColumnName(s)}  
      FROM {TableName(s)}  
      WHERE {Condition(s)}
```

An Example: Reading Data from SQLite

- ▶ Using SQL is a critical skill for data scientists.
- ▶ SQLite is a popular embedded RDBMS software for client/local storage.
- ▶ Need to install RSQLite package.

Data

► Telecommunication Service Data: Calls and Contracts

Calls Data (TTL 3333 records)

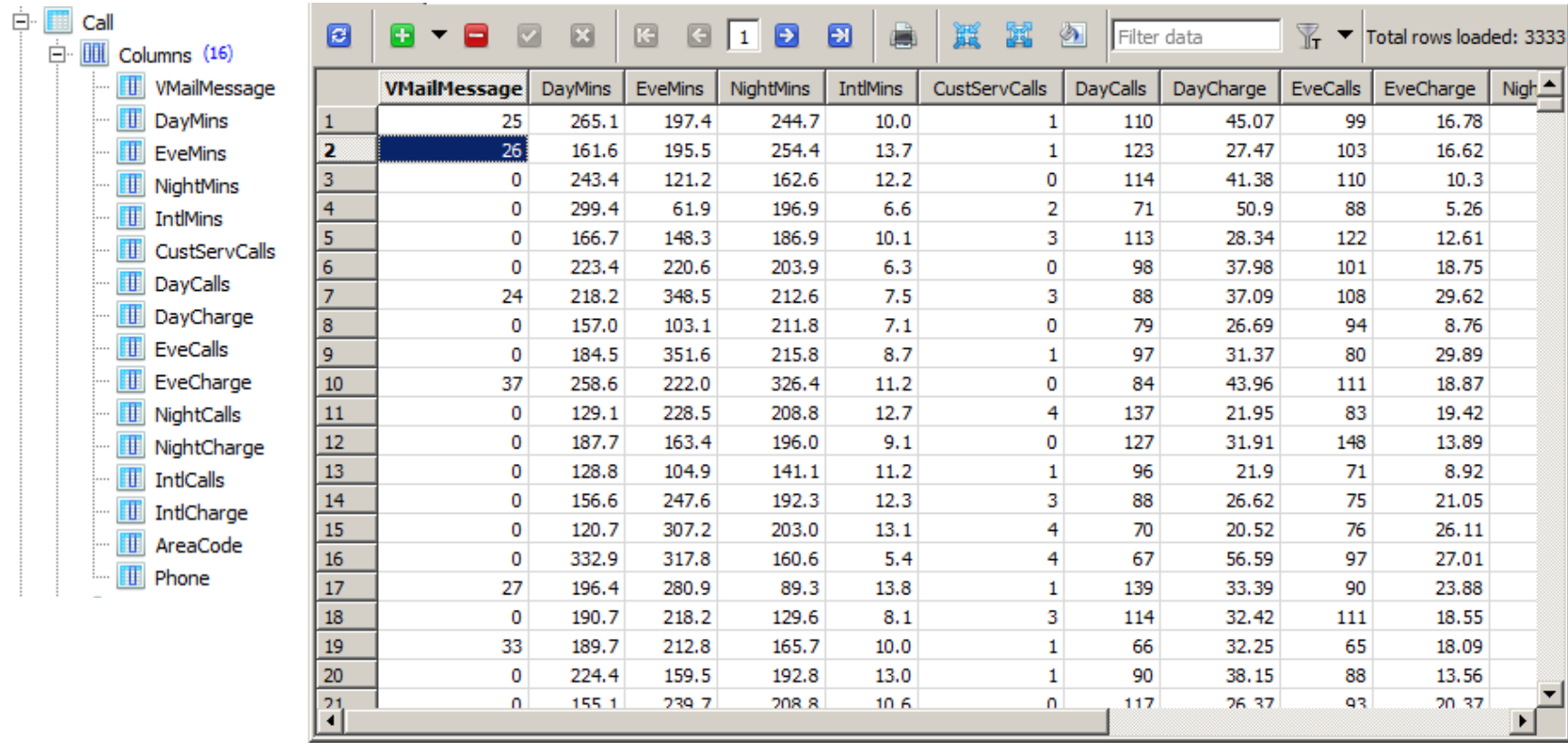
Attribute	Record1	Record2	Record3
VMail Message	25	26	0
Day Mins	265.1	161.6	243.4
Eve Mins	197.4	195.5	121.2
Night Mins	244.7	254.4	162.6
Intl Mins	10	13.7	12.2
CustServ Calls	1	1	0
Day Calls	110	123	114
Day Charge	45.07	27.47	41.38
Eve Calls	99	103	110
Eve Charge	16.78	16.62	10.3
Night Calls	91	103	104
Night Charge	11.01	11.45	7.32
Intl Calls	3	3	5
Intl Charge	2.7	3.7	3.29
Area Code	415	415	415
Phone	382-4657	371-7191	358-1921

Contract Data(TTL 3333 records)

Attribute	Record1	Record2	Record3
Account Length	128	107	137
Churn	0	0	0
Int'l Plan	0	0	0
VMail Plan	1	1	0
State	KS	OH	NJ
Area Code	415	415	415
Phone	382-4657	371-7191	358-1921

SQLite Structure

► Table Call

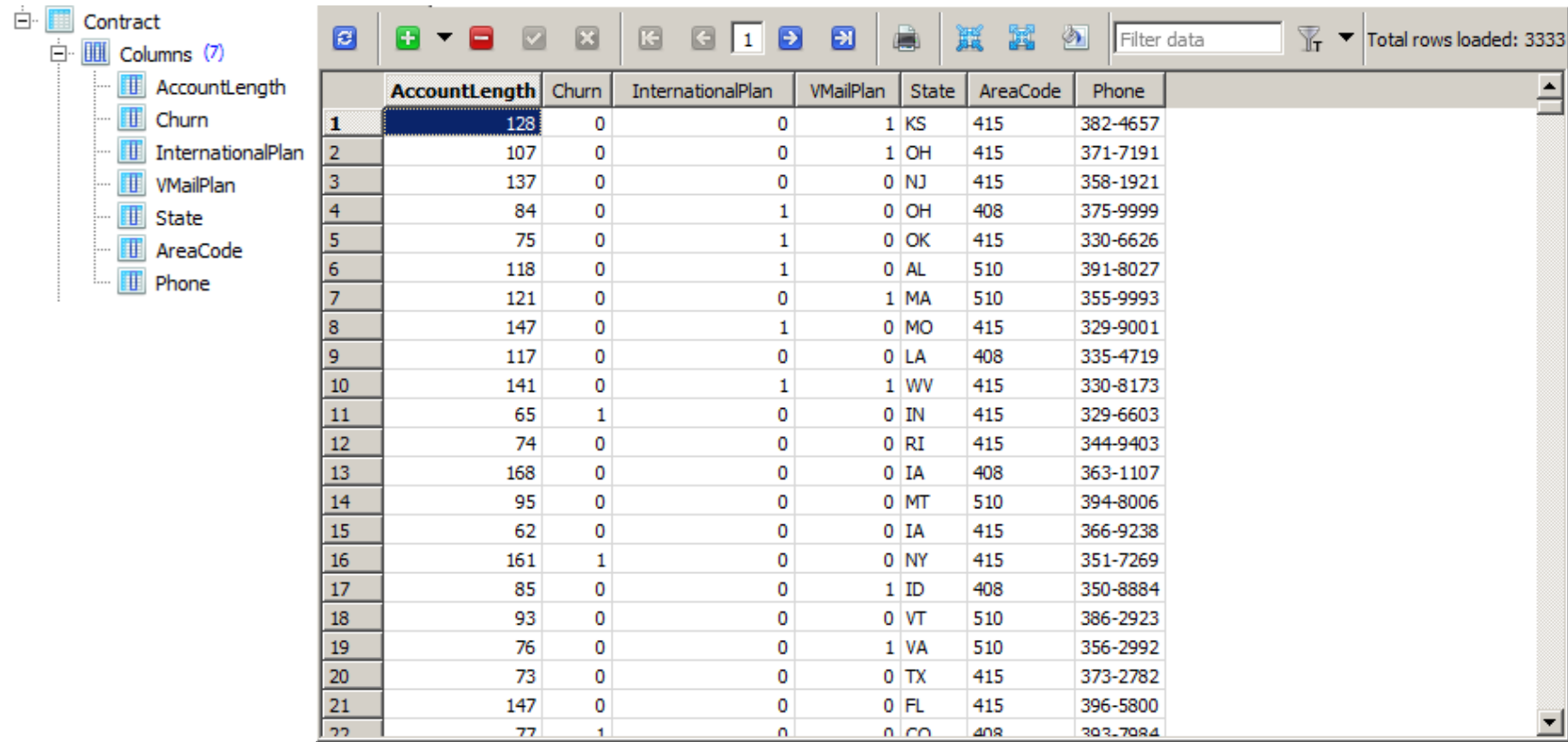


The screenshot displays a SQLite database viewer interface. On the left, a tree view shows the 'Call' table with 16 columns: VMailMessage, DayMins, EveMins, NightMins, IntlMins, CustServCalls, DayCalls, DayCharge, EveCalls, EveCharge, NightCalls, NightCharge, IntlCalls, IntlCharge, AreaCode, and Phone. The main window shows a grid of data for the 'Call' table. The grid has 16 columns and 21 rows. The first row is highlighted. The data is as follows:

	VMailMessage	DayMins	EveMins	NightMins	IntlMins	CustServCalls	DayCalls	DayCharge	EveCalls	EveCharge	NightCalls	NightCharge	IntlCalls	IntlCharge	AreaCode	Phone
1	25	265.1	197.4	244.7	10.0	1	110	45.07	99	16.78						
2	26	161.6	195.5	254.4	13.7	1	123	27.47	103	16.62						
3	0	243.4	121.2	162.6	12.2	0	114	41.38	110	10.3						
4	0	299.4	61.9	196.9	6.6	2	71	50.9	88	5.26						
5	0	166.7	148.3	186.9	10.1	3	113	28.34	122	12.61						
6	0	223.4	220.6	203.9	6.3	0	98	37.98	101	18.75						
7	24	218.2	348.5	212.6	7.5	3	88	37.09	108	29.62						
8	0	157.0	103.1	211.8	7.1	0	79	26.69	94	8.76						
9	0	184.5	351.6	215.8	8.7	1	97	31.37	80	29.89						
10	37	258.6	222.0	326.4	11.2	0	84	43.96	111	18.87						
11	0	129.1	228.5	208.8	12.7	4	137	21.95	83	19.42						
12	0	187.7	163.4	196.0	9.1	0	127	31.91	148	13.89						
13	0	128.8	104.9	141.1	11.2	1	96	21.9	71	8.92						
14	0	156.6	247.6	192.3	12.3	3	88	26.62	75	21.05						
15	0	120.7	307.2	203.0	13.1	4	70	20.52	76	26.11						
16	0	332.9	317.8	160.6	5.4	4	67	56.59	97	27.01						
17	27	196.4	280.9	89.3	13.8	1	139	33.39	90	23.88						
18	0	190.7	218.2	129.6	8.1	3	114	32.42	111	18.55						
19	33	189.7	212.8	165.7	10.0	1	66	32.25	65	18.09						
20	0	224.4	159.5	192.8	13.0	1	90	38.15	88	13.56						
21	0	155.1	239.7	208.8	10.6	0	117	26.37	93	20.37						

(cont.)

► Table **Contract**



	AccountLength	Churn	InternationalPlan	VMailPlan	State	AreaCode	Phone
1	128	0	0	1	KS	415	382-4657
2	107	0	0	1	OH	415	371-7191
3	137	0	0	0	NJ	415	358-1921
4	84	0	1	0	OH	408	375-9999
5	75	0	1	0	OK	415	330-6626
6	118	0	1	0	AL	510	391-8027
7	121	0	0	1	MA	510	355-9993
8	147	0	1	0	MO	415	329-9001
9	117	0	0	0	LA	408	335-4719
10	141	0	1	1	WV	415	330-8173
11	65	1	0	0	IN	415	329-6603
12	74	0	0	0	RI	415	344-9403
13	168	0	0	0	IA	408	363-1107
14	95	0	0	0	MT	510	394-8006
15	62	0	0	0	IA	415	366-9238
16	161	1	0	0	NY	415	351-7269
17	85	0	0	1	ID	408	350-8884
18	93	0	0	0	VT	510	386-2923
19	76	0	0	1	VA	510	356-2992
20	73	0	0	0	TX	415	373-2782
21	147	0	0	0	FL	415	396-5800
22	77	1	0	0	CO	408	303-7984

R Code: Read from SQLite

```
# If you haven't installed RSQLite package, do it.
install.packages("RSQLite")

library("RSQLite")

# Set working directory to the folder which contains the SQLite database file
setwd("D:\\Cloud\\Dropbox\\Teaching 2016 Fall\\IST 3420\\03.Data Basics")

# Specify the database file
dbfile <- "TelecomService.sqlite"

# Create a database connection
con <- dbConnect(dbDriver("SQLite"), dbname = dbfile)

# Get call data
call_data <- dbGetQuery(con, "SELECT * FROM Call")
head(call_data)
summary(call_data)

# Get contract data
contract_data <- dbGetQuery(con, "SELECT * FROM Contract")
head(contract_data)
summary(contract_data)
```

Agenda

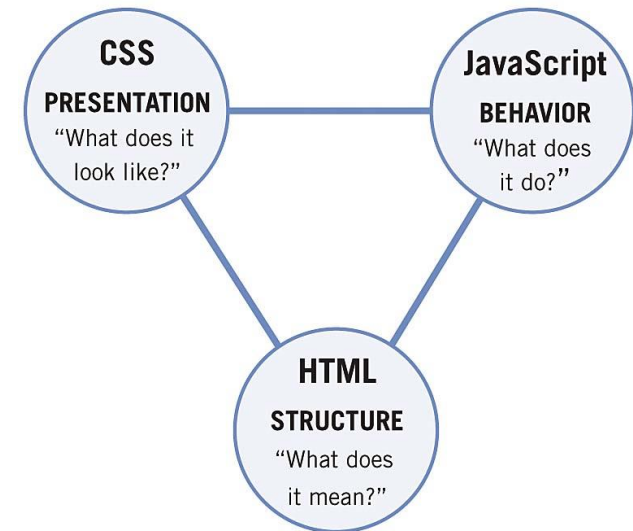
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Working with HTML

HTML Overview

- ▶ HyperText Markup Language (HTML) is the standard markup language used to create web pages.
- ▶ Web Application = **HTML** + **CSS** + **JavaScript**
 - ▶ **HTML**: Content and structure of web pages
 - ▶ Headings
 - ▶ Paragraphs
 - ▶ Lists
 - ▶ Images...
 - ▶ **CSS** (Cascading Style Sheets): Describe the presentation/display of HTML elements
 - ▶ Font
 - ▶ Color
 - ▶ Border...
 - ▶ **JavaScript**: Control the behavior of HTML elements
 - ▶ User interaction
 - ▶ Button click
 - ▶ Dynamic display

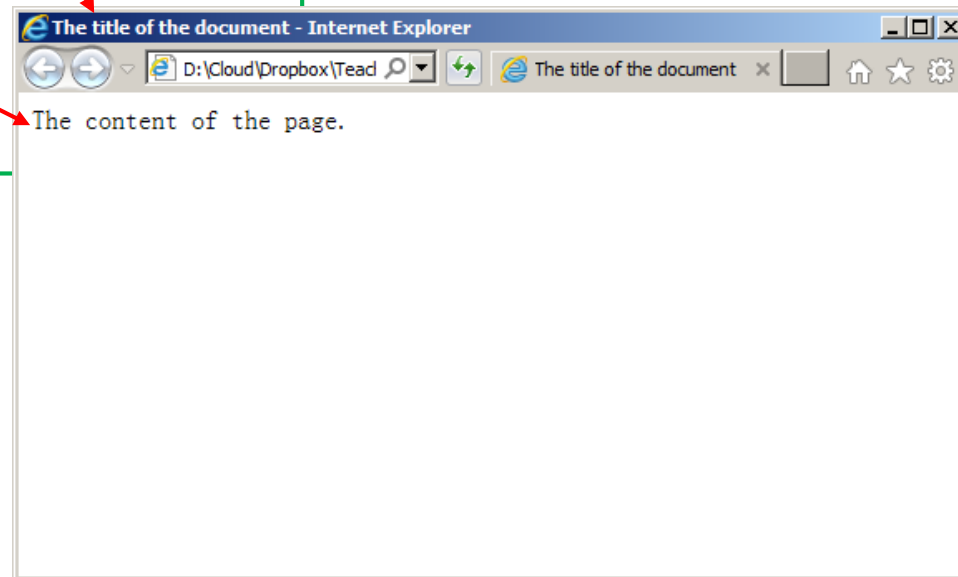


A Simple HTML Page: A Tree Structure

SimpePage.html

Contents are stored within tags

```
<!DOCTYPE html>
<html>
  <head>
    <title>The title of the document</title>
  </head>
  <body>
    The content of the page.
  </body>
</html>
```



URL

- ▶ A Uniform Resource Locator (URL) is an identifier which specifies the location of a web resource
 - ▶ Web pages (http, https)
 - ▶ Email (mailto)
 - ▶ FTP
 - ▶ Database connection
- ▶ A web page URL

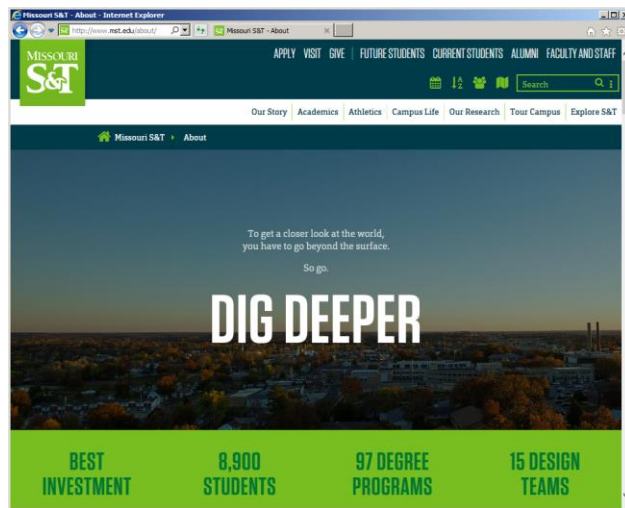
http://www.mst.edu/index.html

protocol host name file location and name

In Practice...

- ▶ HTML with CSS and JavaScript becomes complicated

<http://www.mst.edu/about/>



```
1 <html lang="en-US">
2 <head>
3 <title>Missouri S&T - About</title>
4 <!--///////////////////////////////// META INFORMATION //////////////////////////////////-->
5 <meta name="viewport" content="width=device-width, initial-scale=1">
6 <meta charset="utf-8">
7 <meta name="author" content="Missouri University of Science and Technology">
8 <meta name="copyright" content="Curators of the University of Missouri">
9 <meta name="DC.title" content="About" />
10 <!--///////////////////////////////// GOOGLE ANALYTICS //////////////////////////////////-->
11 <script type="text/javascript">
12     var gaJsHost = (("https:" == document.location.protocol) ? "https://ssl." : "
13     http://www.");
14     document.write(unescape("%3Cscript src='" + gaJsHost +
15     "google-analytics.com/ga.js' type='text/javascript'%3E%3C/script%3E"));
16 </script>
17 <script type="text/javascript">
18
19 </script>
20
21 </head>
22
23 <body>
24 <div class="overflow_wrap"><!-- Begin overflow wrapper -->
25 <!--///////////////////////////////// BRANDING BAR //////////////////////////////////-->
26 <div id="branding_bar" class="row dark_blue_bg text_center">
27     <div class="column center max_width">
28         <div class="branding">
29             <div id="logo">
30                 <a href="//www.mst.edu">
31                     <svg id="logosvg" viewBox="0 0 140 134"
32                     style="background-color:#ffffff00" version="1.1" xmlns="
33                     http://www.w3.org/2000/svg" xmlns:xlink="
34                     http://www.w3.org/1999/xlink" xml:space="preserve" x="0px"
35                     y="0px">
36                         <g xmlns="http://www.w3.org/2000/svg" id="box">
37                             <path d="M0 0L140 0 140 134 0 134 0 0z" fill="#000"
38                             fill-opacity="0"/>
39                             <path d="M50.98 91.73C50.98 87.35 52.6 83.71 55.46
```

Interest in Data Science










- ▶ Our objective is to get data of interest from the complicated web page structure.
- ▶ Usually we can ignore all CSS and JavaScript parts.

Guidelines for Web Data Collection

- ▶ Inspect the website to fully understand the web page structure and content
- ▶ Two important packages in R
 - ▶ RCurl
 - ▶ XML
- ▶ Steps in scraping web pages
 - ▶ Specify URL
 - ▶ Get the web page content
 - ▶ Parse the web page content
 - ▶ Read specific elements in the web page

Example: Scraping Tables from Web Pages

- ▶ Task: To collect world population data from the following Wikipedia web page https://en.wikipedia.org/wiki/List_of_countries_and_dependencies_by_population

Countries and dependencies by population [edit]					
Note: All dependent territories or countries that are parts of sovereign states are shown in <i>italics</i> .					
Rank ↕	Country (or dependent territory) ↕	Population ↕	Date ↕	% of world population ↕	Source
1	 China ^[Note 2]	1,377,453,498	July 11, 2016	18.78%	Official population clock
2	 India	1,295,330,000	July 11, 2016	17.7%	Unofficial population clock
3	 United States ^[Note 3]	323,961,000	July 11, 2016	4.42%	Official population clock
4	 Indonesia	258,705,000	July 1, 2016	3.53%	Official projection
5	 Brazil	206,144,905	July 11, 2016	2.81%	Official population clock
6	 Pakistan	194,143,490	July 11, 2016	2.65%	Official population clock
7	 Nigeria	186,988,000	July 1, 2016	2.55%	UN Projection
8	 Bangladesh	161,018,354	July 11, 2016	2.2%	Official population clock
9	 Russia ^[Note 4]	146,599,183	May 1, 2016	2%	Official estimate

HTML Table Tags

Tag	Description
<table>	Defines a table
<caption>	Defines a table caption
<th>	Defines a header cell in a table
<tr>	Defines a row in a table
<td>	Defines a cell in a table
<thead>	Groups the header content in a table
<tbody>	Groups the body content in a table
<tfoot>	Groups the footer content in a table
<col>	Specifies column properties for each column within a <colgroup> element
<colgroup>	Specifies a group of one or more columns in a table for formatting

For a description of complete HTML tags, refer to: http://www.w3schools.com/tags/ref_byfunc.asp

Inspect the Tree Structure of Web Page






- ▶ In Google Chrome, right click the table and then select “Inspect” menu.
- ▶ Then move mouse over the HTML element, the corresponding display content will be highlighted.

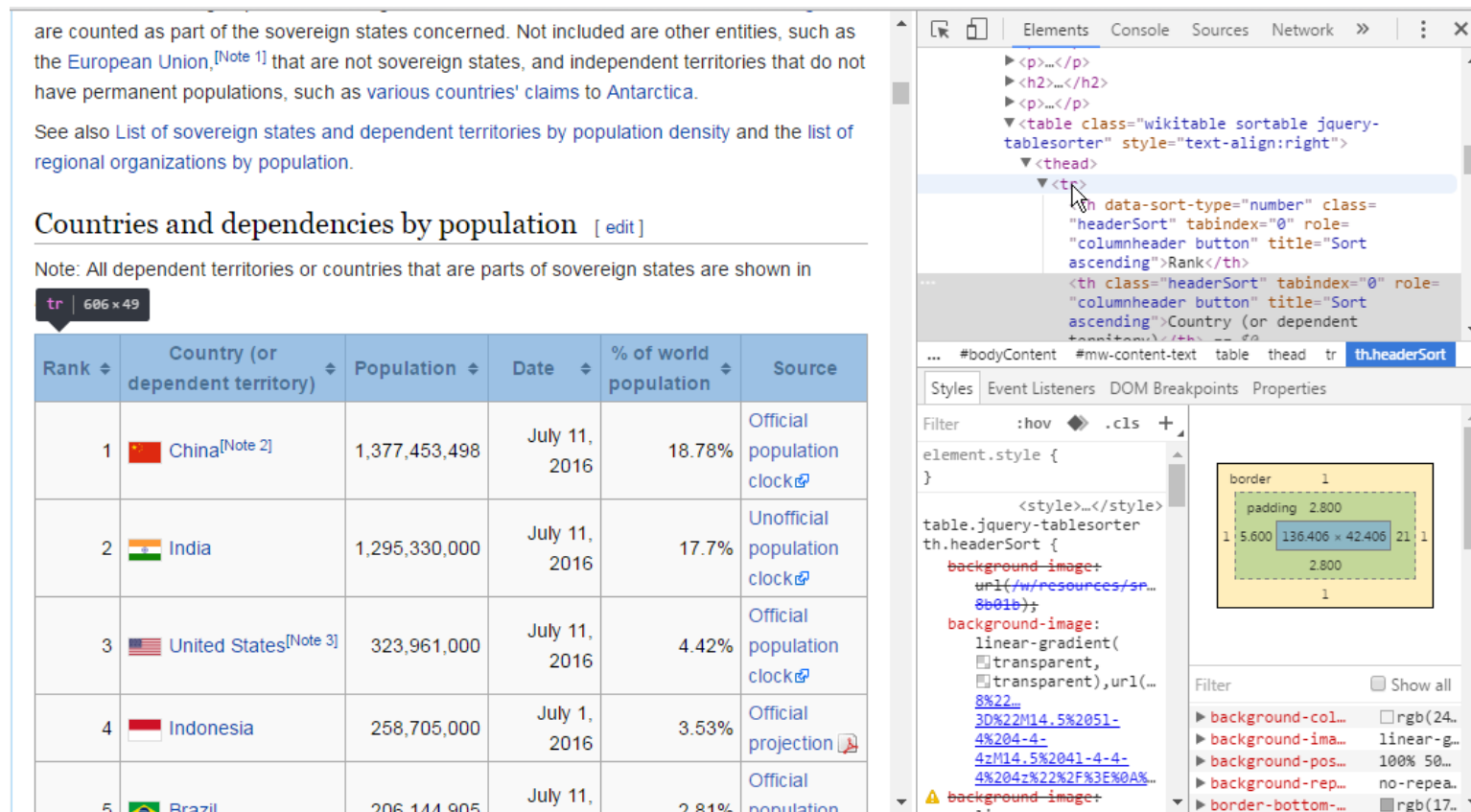
are counted as part of the sovereign states concerned. Not included are other entities, such as the [European Union](#),^[Note 1] that are not sovereign states, and independent territories that do not have permanent populations, such as [various countries' claims to Antarctica](#).

See also [List of sovereign states and dependent territories by population density](#) and the [list of regional organizations by population](#).

Countries and dependencies by population [\[edit \]](#)

Note: All dependent territories or countries that are parts of sovereign states are shown in

Rank	Country (or dependent territory)	Population	Date	% of world population	Source
1	 China ^[Note 2]	1,377,453,498	July 11, 2016	18.78%	Official population clock
2	 India	1,295,330,000	July 11, 2016	17.7%	Unofficial population clock
3	 United States ^[Note 3]	323,961,000	July 11, 2016	4.42%	Official population clock
4	 Indonesia	258,705,000	July 1, 2016	3.53%	Official projection
5	 Brazil	206,144,905	July 11,	2.81%	Official population



```
<table class="wikitable sortable jquery-tablesorter" style="text-align:right">
  <thead>
    <tr>
      <th data-sort-type="number" class="headerSort" tabindex="0" role="columnheader" button title="Sort ascending">Rank</th>
      <th class="headerSort" tabindex="0" role="columnheader" button title="Sort ascending">Country (or dependent territory)</th>
      <th>Population</th>
      <th>Date</th>
      <th>% of world population</th>
      <th>Source</th>
    </tr>
  </thead>
  <tbody>
    <tr>
      <td>1</td>
      <td><img alt="Flag of China" data-bbox="245 648 258 665"/> <a href="#">China</a><sup>[Note 2]</sup></td>
      <td>1,377,453,498</td>
      <td>July 11, 2016</td>
      <td>18.78%</td>
      <td><a href="#">Official population clock</a></td>
    </tr>
    <tr>
      <td>2</td>
      <td><img alt="Flag of India" data-bbox="245 718 258 735"/> <a href="#">India</a></td>
      <td>1,295,330,000</td>
      <td>July 11, 2016</td>
      <td>17.7%</td>
      <td><a href="#">Unofficial population clock</a></td>
    </tr>
    <tr>
      <td>3</td>
      <td><img alt="Flag of United States" data-bbox="245 788 258 805"/> <a href="#">United States</a><sup>[Note 3]</sup></td>
      <td>323,961,000</td>
      <td>July 11, 2016</td>
      <td>4.42%</td>
      <td><a href="#">Official population clock</a></td>
    </tr>
    <tr>
      <td>4</td>
      <td><img alt="Flag of Indonesia" data-bbox="245 858 258 875"/> <a href="#">Indonesia</a></td>
      <td>258,705,000</td>
      <td>July 1, 2016</td>
      <td>3.53%</td>
      <td><a href="#">Official projection</a></td>
    </tr>
    <tr>
      <td>5</td>
      <td><img alt="Flag of Brazil" data-bbox="245 928 258 945"/> <a href="#">Brazil</a></td>
      <td>206,144,905</td>
      <td>July 11,</td>
      <td>2.81%</td>
      <td><a href="#">Official population</a></td>
    </tr>
  </tbody>
</table>
```

(cont.)

- ▶ In Firefox, right click the table and then select “Inspect Element” menu.
- ▶ Then move mouse over the HTML element, the corresponding display content will be highlighted.

The screenshot shows the Firefox Developer Tools interface. The top part displays a table titled "Countries and dependencies by population" with a note: "Note: All dependent territories or countries that are parts of **thead** 849 × 51.4 are shown in *italics*." The table has the following structure:

Rank	Country (or dependent territory)	Population	Date	% of world population	Source
1	China ^[Note 2]	1,377,453,498	July 11, 2016	18.78%	Official population clock
2	India	1,291,834,160	July 11, 2016	17.61%	Unofficial population clock
3	United States ^[Note 3]	323,961,000	July 11, 2016	4.42%	Official population clock

The bottom part of the screenshot shows the "Inspector" panel with the HTML structure of the table. The `<thead>` element is selected, and the corresponding styles are shown in the "Rules" panel.

```
<table class="wikitable sortable jquery-tablesorter" style="text-align:right">
  <thead>
    <tr>
      <th class="headerSort" title="Sort ascending" role="columnheader button" tabindex="0" data-sort-type="number">Rank</th>
      <th class="headerSort" title="Sort ascending" role="columnheader button" tabindex="0">Country (or dependent territory)</th>
      <th class="headerSort" title="Sort ascending" role="columnheader button" tabindex="0">Population</th>
      <th class="headerSort" title="Sort ascending" role="columnheader button" tabindex="0">Date
```

The "Rules" panel shows the following styles for the selected element:

```
element {
  text-align: right;
}
table.wikitable {
  margin: 1em 0;
  background-color: #f9f9f9;
  border: 1px solid #aaa;
  border-collapse: collapse;
  color: #000;
}
```

R Code: Scraping Tables from Web Pages

```
# Load packages
library("XML")
library("RCurl")

# Specify URL
url <- "https://en.wikipedia.org/wiki/List_of_countries_and_dependencies_by_population"
# Download the content of the URL
url_content <- getURL(url)
# Parse the HTML/XML content to generate an R structure representing the HTML/XML tree
doc <- htmlParse(url_content)
tables <- readHTMLTable(doc)

# Convert the 1st element of the list to data frame
pop_df <- data.frame(tables[[1]])
attributes(pop_df)
colnames(pop_df) <- c("Rank", "Country/Territory", "Population", "Date", "% of World Population", "Source")

is.factor(pop_df$Population)
# Convert factors into numbers for Population column
pop_df$Population <- as.numeric(gsub(",", "", pop_df$Population))
top10 <- head(pop_df, n = 10L)
plot(top10$Population, type = "l")
```

Agenda

- ▶ Data, Dataset, and Scales of Measurement
- ▶ Data Collection
- ▶ Working with CSV
- ▶ Working with Rational Database
- ▶ Working with HTML
- ▶ Working with XML and JSON
- ▶ Working with APIs



Working with XML and JSON

What is XML?

- ▶ XML stands for EXtensible Markup Language
- ▶ XML is a markup language much like HTML
- ▶ XML was designed to store and transport data (platform independent)
- ▶ XML was designed to be self-descriptive
- ▶ XML was designed to be both human-readable and machine-readable
- ▶ XML is a W3C Recommendation since 1998

Source: http://www.w3schools.com/xml/xml_what_is.asp

An XML File: Element + Attribute + Text

Books.xml

```
<?xml version="1.0" encoding="UTF-8"?>
<bookstore>

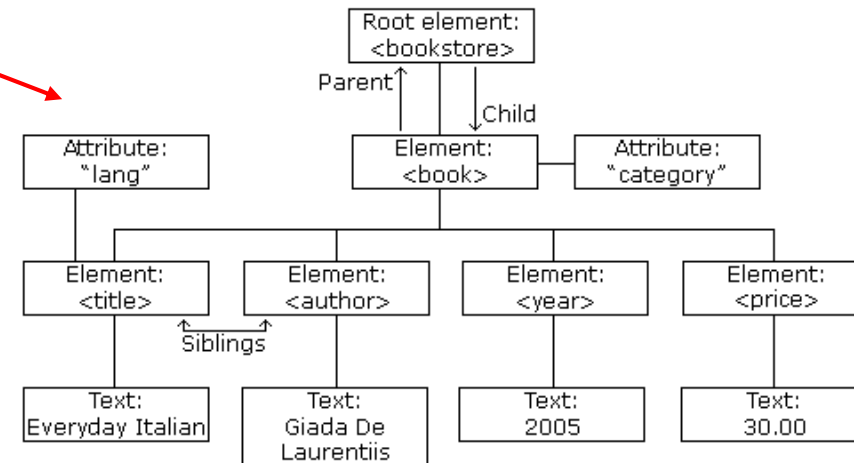
  <book category="cooking">
    <title lang="en">Everyday Italian</title>
    <author>Giada De Laurentiis</author>
    <year>2005</year>
    <price>30.00</price>
  </book>

  <book category="children">
    <title lang="en">Harry Potter</title>
    <author>J K. Rowling</author>
    <year>2005</year>
    <price>29.99</price>
  </book>

  <book category="web" cover="paperback">
    <title lang="en">Learning XML</title>
    <author>Erik T. Ray</author>
    <year>2003</year>
    <price>39.95</price>
  </book>

</bookstore>
```

XML Tree Structure



Source: <http://www.w3schools.com/xml/default.asp>

Summary of XML Syntax

- ▶ An XML document must have a root element
- ▶ XML prolog is optional

```
<?xml version="1.0" encoding="UTF-8"?>
```
- ▶ Elements must have a closing tag
- ▶ Tags are case sensitive
- ▶ Elements must be properly nested within each other
- ▶ Attributes must be quoted

Source: http://www.w3schools.com/xml/xml_syntax.asp

XML vs. HTML

- ▶ XML does not carry any information on data presentation
- ▶ You define your own XML tag!
- ▶ XML is a complement to HTML
 - ▶ Many web applications use XML to store and transport data, while using HTML to display the same data

XPath

- ▶ XPath stands for the XML Path Language,
- ▶ Use XPath to extract information from XML documents
- ▶ XPath uses path expressions to navigate in XML documents

To learn more about XPath, go to:

http://www.w3schools.com/xsl/xpath_intro.asp

Some XPath expressions

XPath Expression	Result
bookstore/book	Selects all book elements that are children of bookstore
/bookstore/book[1]	Selects the first book element that is the child of the bookstore element
/bookstore/book[last()]	Selects the last book element that is the child of the bookstore element
/bookstore/book[position()<3]	Selects the first two book elements that are children of the bookstore element
//@lang	Selects all attributes that are named lang
//title[@lang]	Selects all the title elements that have an attribute named lang
//title[@lang='en']	Selects all the title elements that have a "lang" attribute with a value of "en"
/bookstore/book[price>35.00]	Selects all the book elements of the bookstore element that have a price element with a value greater than 35.00
/bookstore/book[price>35.00]/title	Selects all the title elements of the book elements of the bookstore element that have a price element with a value greater than 35.00

```
<?xml version="1.0" encoding="UTF-8"?>
<bookstore>

  <book category="cooking">
    <title lang="en">Everyday
Italian</title>
    <author>Giada De
Laurentiis</author>
    <year>2005</year>
    <price>30.00</price>
  </book>

  <book category="children">
    <title lang="en">Harry
Potter</title>
    <author>J K. Rowling</author>
    <year>2005</year>
    <price>29.99</price>
  </book>

  <book category="web"
cover="paperback">
    <title lang="en">Learning
XML</title>
    <author>Erik T. Ray</author>
    <year>2003</year>
    <price>39.95</price>
  </book>

</bookstore>
```

R Code: Read XML Data

```
require(XML)
# Specify XML file location
loc <- "D:\\Cloud\\Dropbox\\Teaching 2016 Fall\\IST 3420\\3.Data Basics\\Books.xml"

doc <- xmlParse(file = loc) # Parse XML file to generate an R structure
top <- xmlRoot(doc) # Get the root node

# Explore root node
xmlName(top)
names(top) # Show child nodes of the root node
names(top[[1]]) # Show child nodes of the 1st book
top[[1]][["title"]] # Show title of the 1st book
top[[1]][["year"]] # Show year of the 1st book
top[[1]][["price"]] # Show price of the 1st book

# Use xpathSApply() to extract information by XPath expression.
# The xpathSApply() is a simplified version of xpathApply() function.
b_title <- xpathSApply(doc, "//bookstore/book/title", xmlValue)
b_category <- xpathSApply(doc, "//bookstore/book/@category")
b_author <- xpathSApply(doc, "//bookstore/book/author", xmlValue)
b_year <- xpathSApply(doc, "//bookstore/book/year", xmlValue)
b_price <- xpathSApply(doc, "//bookstore/book/price", xmlValue)

# Generate a book data frame
book_df <- data.frame(b_title, b_category, b_author, b_year, b_price)
colnames(book_df) <- c("Title", "Category", "Author", "Year", "Price")
print(book_df)
```

What is JSON?

- ▶ JSON stands for JavaScript Object Notation, an open-standard format of expressing information.
- ▶ A JSON document consists of attribute–value pairs.
- ▶ JSON is promoted as a low-overhead alternative to XML.
- ▶ Though JSON is named after JavaScript language, it is language independent.
- ▶ Many programming languages support JSON.

JSON Syntax

- Data is in name/value pairs (separated by colon)
- Data is separated by commas
- Curly braces hold objects
- Square brackets hold arrays

Source: <http://www.w3schools.com/json/>

Books.json

```
{
  "Title": [
    "Everyday Italian",
    "Harry Potter",
    "Learning XML"
  ],
  "Category": [
    "cooking",
    "children",
    "web"
  ],
  "Author": [
    "Giada De Laurentiis",
    "J K. Rowling",
    "Erik T. Ray"
  ],
  "Year": [
    "2005",
    "2005",
    "2003"
  ],
  "Price": [
    "30.00",
    "29.99",
    "39.95"
  ]
}
```

R Code: Access JSON Data

- ▶ Use **rjson** package
 - ▶ **toJSON()** : Convert R to JSON
 - ▶ **fromJSON()** : Convert JSON to R

Note: Use the same data frame object created by XML example

```
# Load rjson package
require(rjson)

# Convert data frame to JSON
# data.frames must be converted into a list before converting into JSON
j_book <- toJSON(as.list(book_df))
print(j_book)

# Convert JSON to data frame
book_df2 <- data.frame(fromJSON(j_book))
print(book_df2)
```

Agenda

- ▶ Data, Dataset, and Scales of Measurement
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- ▶ Working with XML and JSON
- ▶ Working with APIs



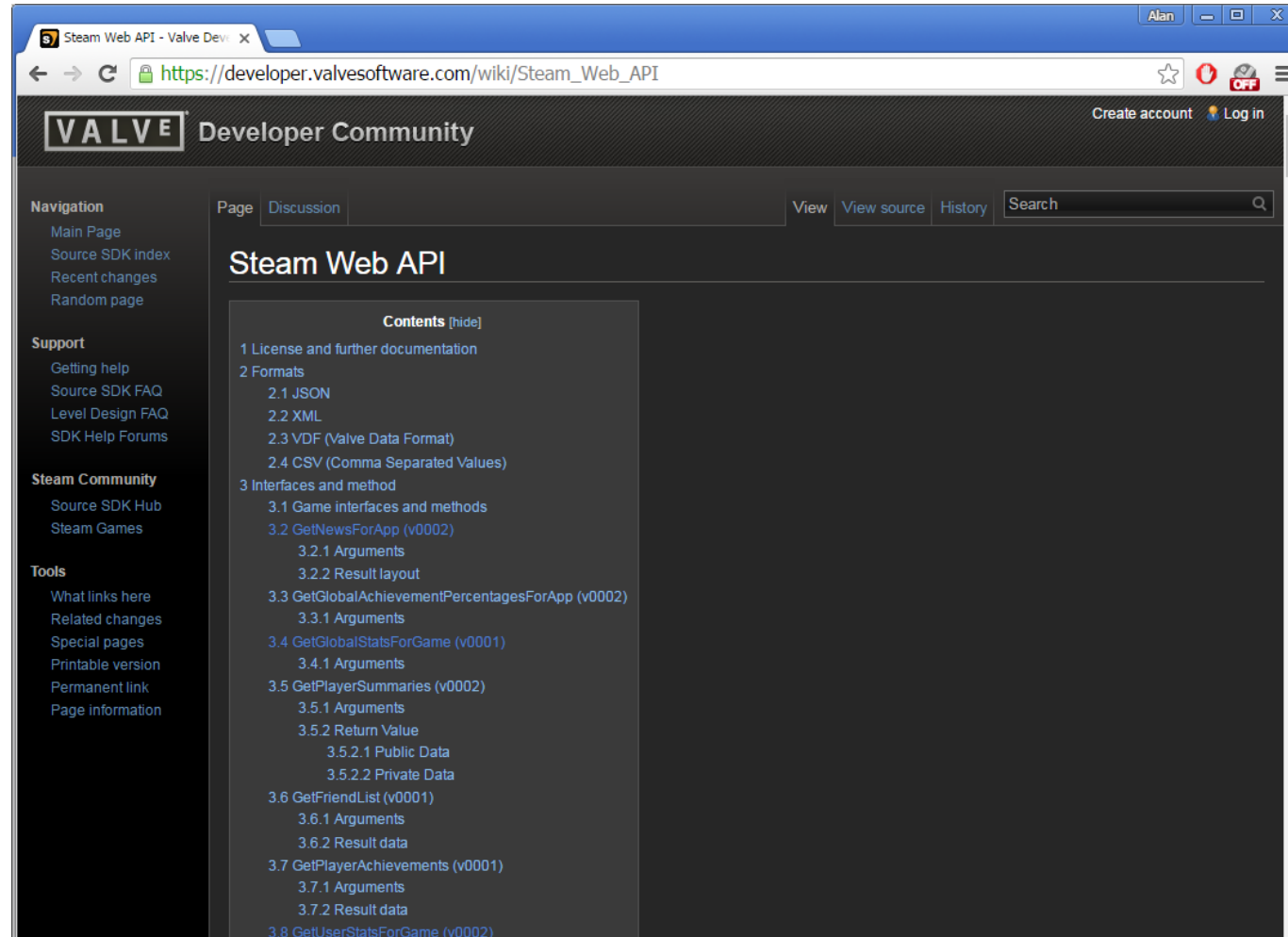
Working with APIs

Application Programming Interface (API)

- ▶ Some Web Applications provide APIs for access their content.
- ▶ APIs usually accept HTTP request.
- ▶ We already learn how to access XML and JSON files. Usually the XML and JSON objects are returned by APIs.
- ▶ Some APIs
 - ▶ YouTube API
 - ▶ Google Maps API
 - ▶ Twitter API
 - ▶ Facebook API
 - ▶ Yahoo API
 - ▶ LinkedIn API
 - ▶ Steam Web API
 - ▶ ...

Steam Web API Specification

https://developer.valvesoftware.com/wiki/Steam_Web_API



GetNewsForApp (v0002)

- ▶ GetNewsForApp returns the latest of a game specified by its appID.
- ▶ Example
URL: <http://api.steampowered.com/ISteamNews/GetNewsForApp/v0002/?appid=440&count=3&maxlength=300&format=json>
- ▶ **Arguments**
 - ▶ **appid**
 - ▶ AppID of the game you want the news of.
 - ▶ **count**
 - ▶ How many news entries you want to get returned.
 - ▶ **maxlength**
 - ▶ Maximum length of each news entry.
 - ▶ **format**
 - ▶ Output format. *json* (default), *xml* or *vdf*.
- ▶ **Result layout**
 - ▶ An **appnews** object containing:
 - ▶ **appid**, the AppID of the game you want news of
 - ▶ **newsitems**, an array of news item information:
 - ▶ An ID, title and url.
 - ▶ A shortened excerpt of the contents (to maxlength characters), terminated by "..." if longer than maxlength.
 - ▶ A comma-separated string of labels and UNIX timestamp.

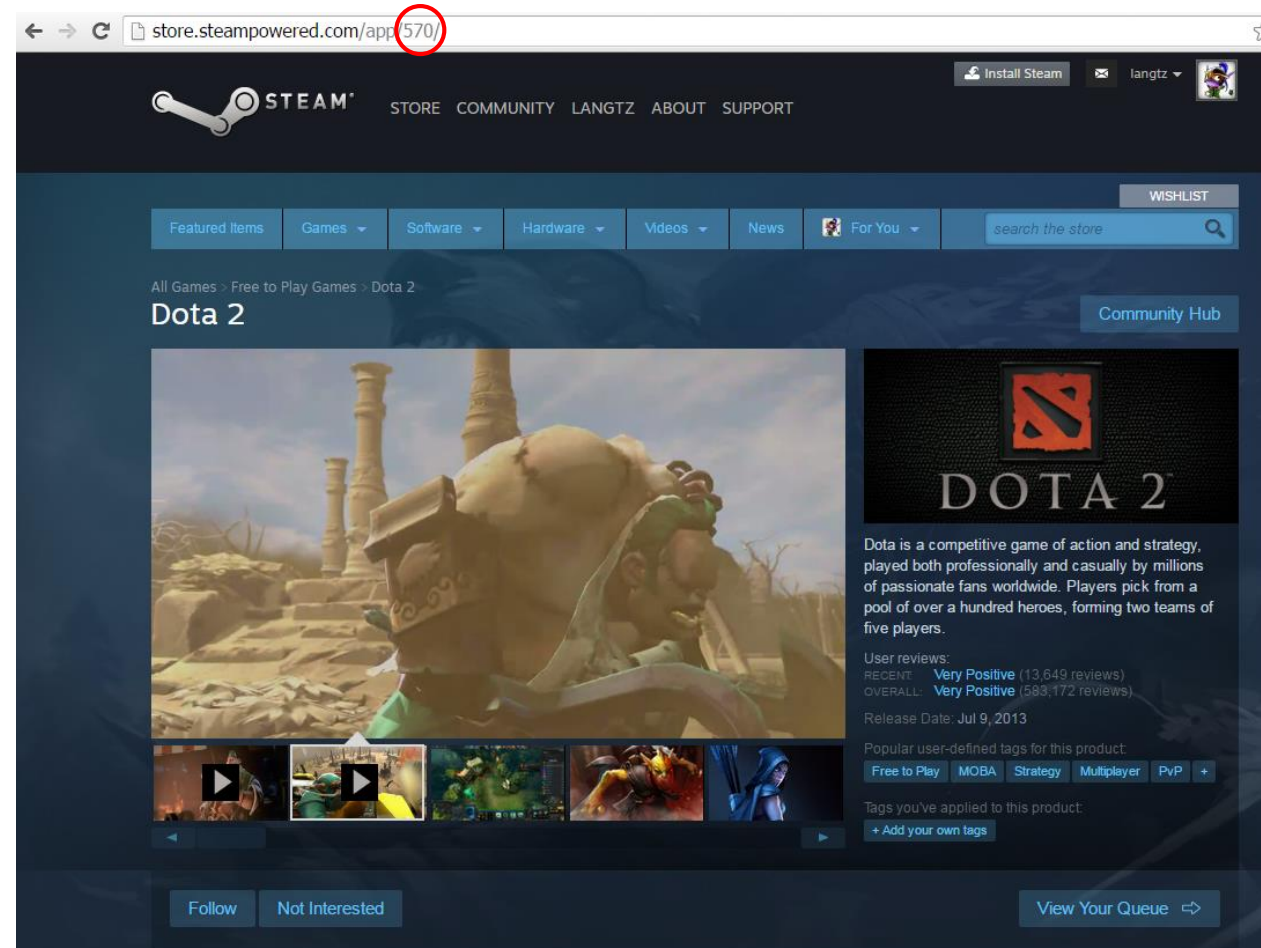
You can test the API in browsers

<http://api.steampowered.com/ISteamNews/GetNewsForApp/v0002/?appid=440&count=3&maxlength=300&format=json>



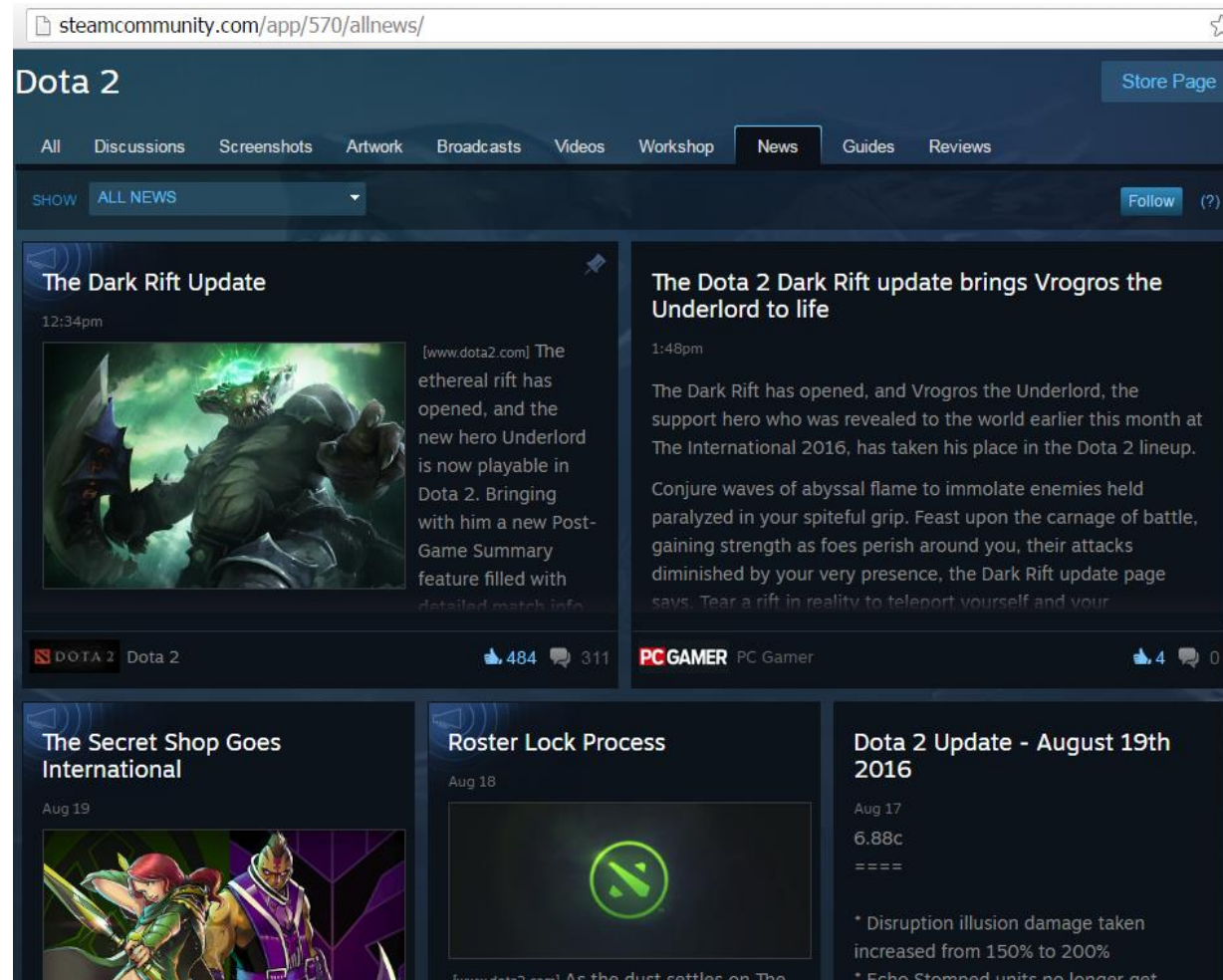
What is an App ID?

- ▶ Select an App from steam store (<http://store.steampowered.com/>) to check it's App ID



What data the API provides?

<http://steamcommunity.com/app/570/allnews/>



The screenshot displays the Dota 2 news page on the Steam community website. The browser address bar shows the URL `steamcommunity.com/app/570/allnews/`. The page header includes the "Dota 2" title and a "Store Page" button. Navigation tabs for "All", "Discussions", "Screenshots", "Artwork", "Broadcasts", "Videos", "Workshop", "News", "Guides", and "Reviews" are visible, with "News" currently selected. A "SHOW ALL NEWS" dropdown and a "Follow" button are also present.

The main content area features several news items:

- The Dark Rift Update** (12:34pm): Announces the new hero Vrosgros the Underlord, accompanied by an image of the hero. The text mentions a new Post-Game Summary feature.
- The Dota 2 Dark Rift update brings Vrosgros the Underlord to life** (1:48pm): A detailed update about Vrosgros, describing his abilities like conjuring waves of abyssal flame and teleporting.
- The Secret Shop Goes International** (Aug 19): Features an image of two Dota 2 heroes.
- Roster Lock Process** (Aug 18): Includes a green circular icon with a diagonal line.
- Dota 2 Update - August 19th 2016** (Aug 17): Lists version 6.88c and includes patch notes such as "Disruption illusion damage taken increased from 150% to 200%" and "Echo Stomped units no longer get".

Each news item includes engagement metrics like likes and comments.

R Code

```
appid <- 570 # Choose Dota 2 whose App ID is 570
n_new <- 30 # Number of news to get
# Generate url for the app
url <- paste("http://api.steampowered.com/ISteamNews/GetNewsForApp/v0002/?appid=", appid,
"&count=", n_new, "&maxlength=300&format=json", sep = "")

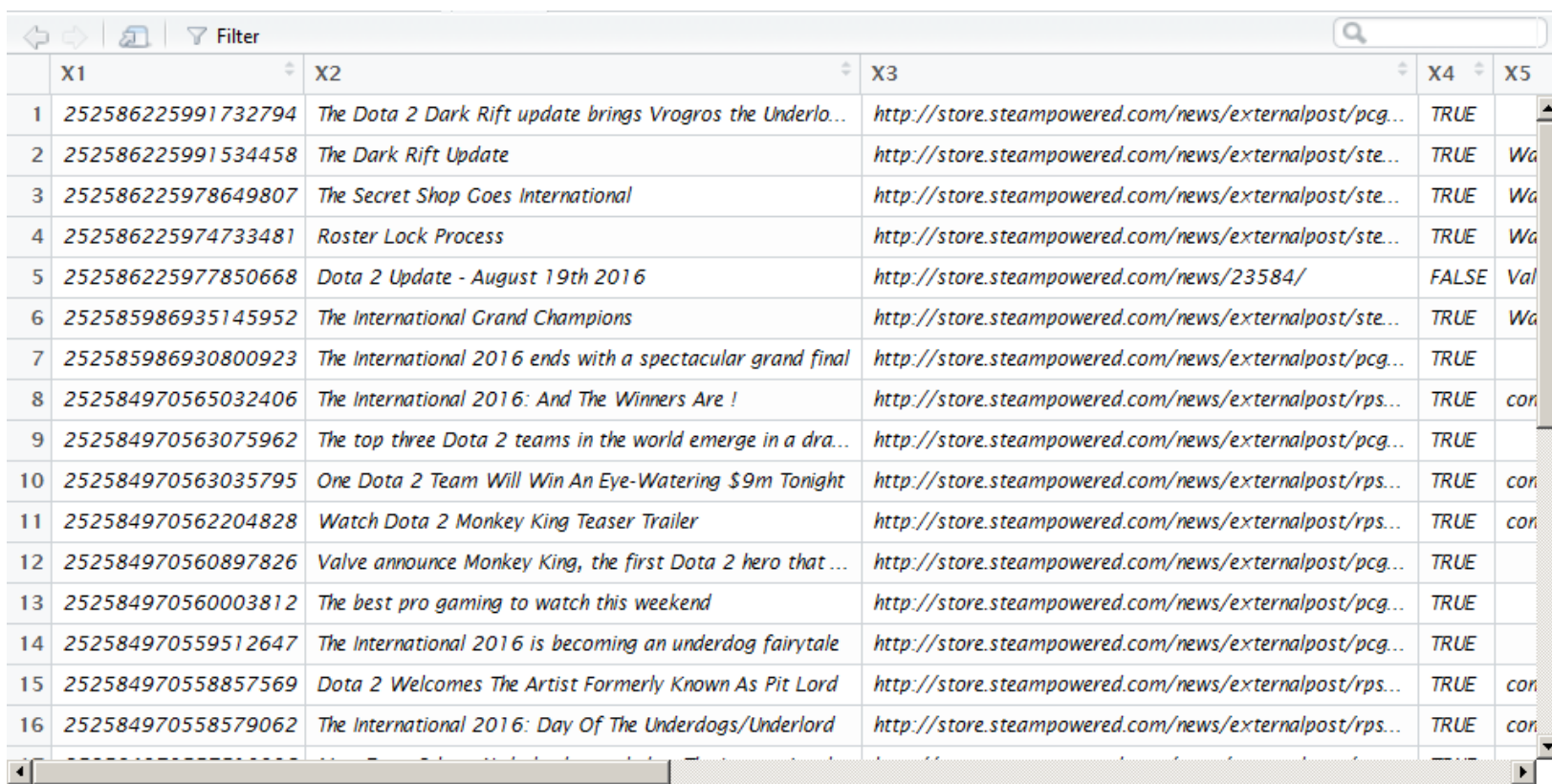
# Download HTTP response
content = RCurl::getURI(url)

# Create a list
list <- fromJSON(content)
# Show content in the list
list$appnews$newsitems
list$appnews$newsitems[[1]]

# Create a data frame
df <- data.frame(matrix(unlist(list$appnews$newsitems), nrow = n_new, byrow=T))
# Rename variables in the data frame
colnames(df) <- names(json$appnews$newsitems[[1]])
# Show content of the data frame. You'll notice that the date is shown as numbers (in strings actually)
df
# Add variable date2 to show the readable date time
df$date2 <- as.POSIXlt(as.numeric(as.character(df$date)), origin = "1970-01-01")
df
```

Dataset Collected

Data collected on 8/23/2016

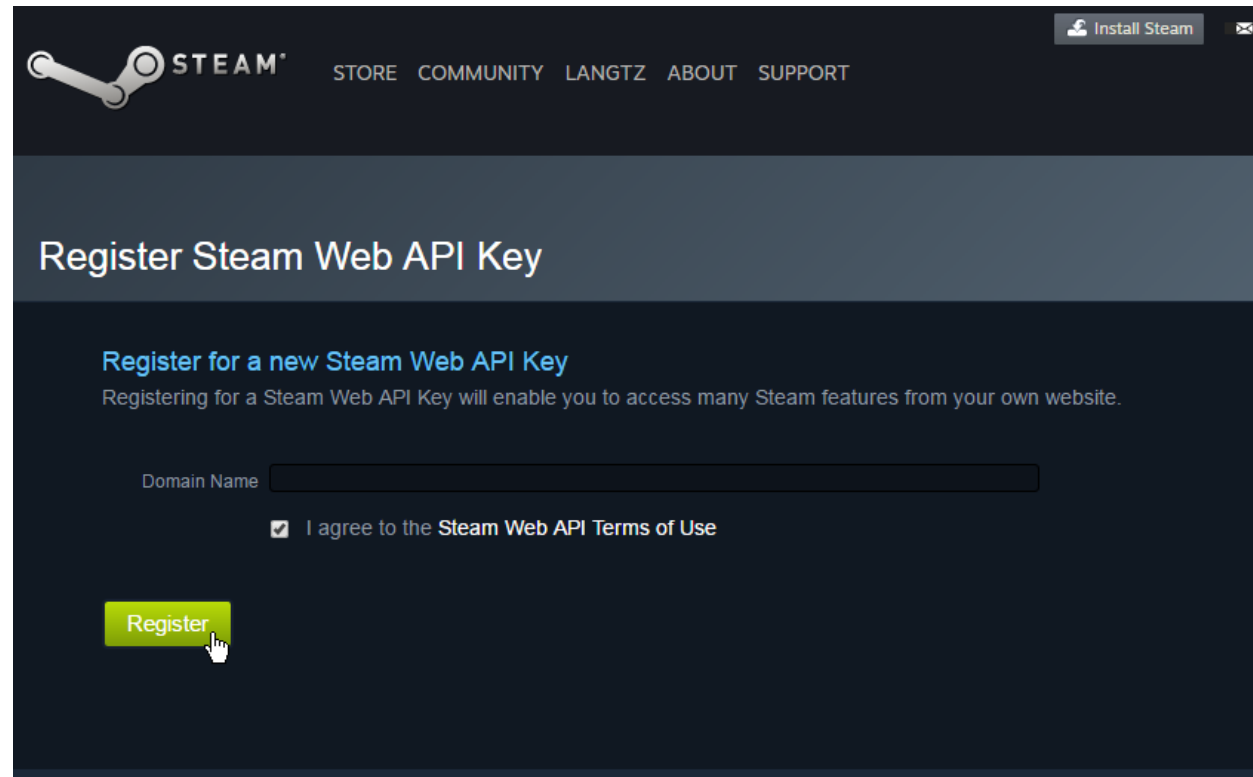


The screenshot shows a web application interface for data collection. At the top, there are navigation icons (back, forward, home) and a 'Filter' button. Below this is a table with 6 columns: an index column, and five data columns labeled X1, X2, X3, X4, and X5. The table contains 16 rows of data, each representing a news item from the Dota 2 store. The X1 column contains numeric IDs, X2 contains the news titles, X3 contains the URLs, X4 contains a boolean value (TRUE or FALSE), and X5 contains a category label (partially visible as 'Wa', 'Val', 'con').

	X1	X2	X3	X4	X5
1	252586225991732794	The Dota 2 Dark Rift update brings Vrogros the Underlo...	http://store.steampowered.com/news/externalpost/pcg...	TRUE	
2	252586225991534458	The Dark Rift Update	http://store.steampowered.com/news/externalpost/ste...	TRUE	Wa
3	252586225978649807	The Secret Shop Goes International	http://store.steampowered.com/news/externalpost/ste...	TRUE	Wa
4	252586225974733481	Roster Lock Process	http://store.steampowered.com/news/externalpost/ste...	TRUE	Wa
5	252586225977850668	Dota 2 Update - August 19th 2016	http://store.steampowered.com/news/23584/	FALSE	Val
6	252585986935145952	The International Grand Champions	http://store.steampowered.com/news/externalpost/ste...	TRUE	Wa
7	252585986930800923	The International 2016 ends with a spectacular grand final	http://store.steampowered.com/news/externalpost/pcg...	TRUE	
8	252584970565032406	The International 2016: And The Winners Are !	http://store.steampowered.com/news/externalpost/rps...	TRUE	con
9	252584970563075962	The top three Dota 2 teams in the world emerge in a dra...	http://store.steampowered.com/news/externalpost/pcg...	TRUE	
10	252584970563035795	One Dota 2 Team Will Win An Eye-Watering \$9m Tonight	http://store.steampowered.com/news/externalpost/rps...	TRUE	con
11	252584970562204828	Watch Dota 2 Monkey King Teaser Trailer	http://store.steampowered.com/news/externalpost/rps...	TRUE	con
12	252584970560897826	Valve announce Monkey King, the first Dota 2 hero that ...	http://store.steampowered.com/news/externalpost/pcg...	TRUE	
13	252584970560003812	The best pro gaming to watch this weekend	http://store.steampowered.com/news/externalpost/pcg...	TRUE	
14	252584970559512647	The International 2016 is becoming an underdog fairytale	http://store.steampowered.com/news/externalpost/pcg...	TRUE	
15	252584970558857569	Dota 2 Welcomes The Artist Formerly Known As Pit Lord	http://store.steampowered.com/news/externalpost/rps...	TRUE	con
16	252584970558579062	The International 2016: Day Of The Underdogs/Underlord	http://store.steampowered.com/news/externalpost/rps...	TRUE	con

Some APIs need a Steam Web API Key

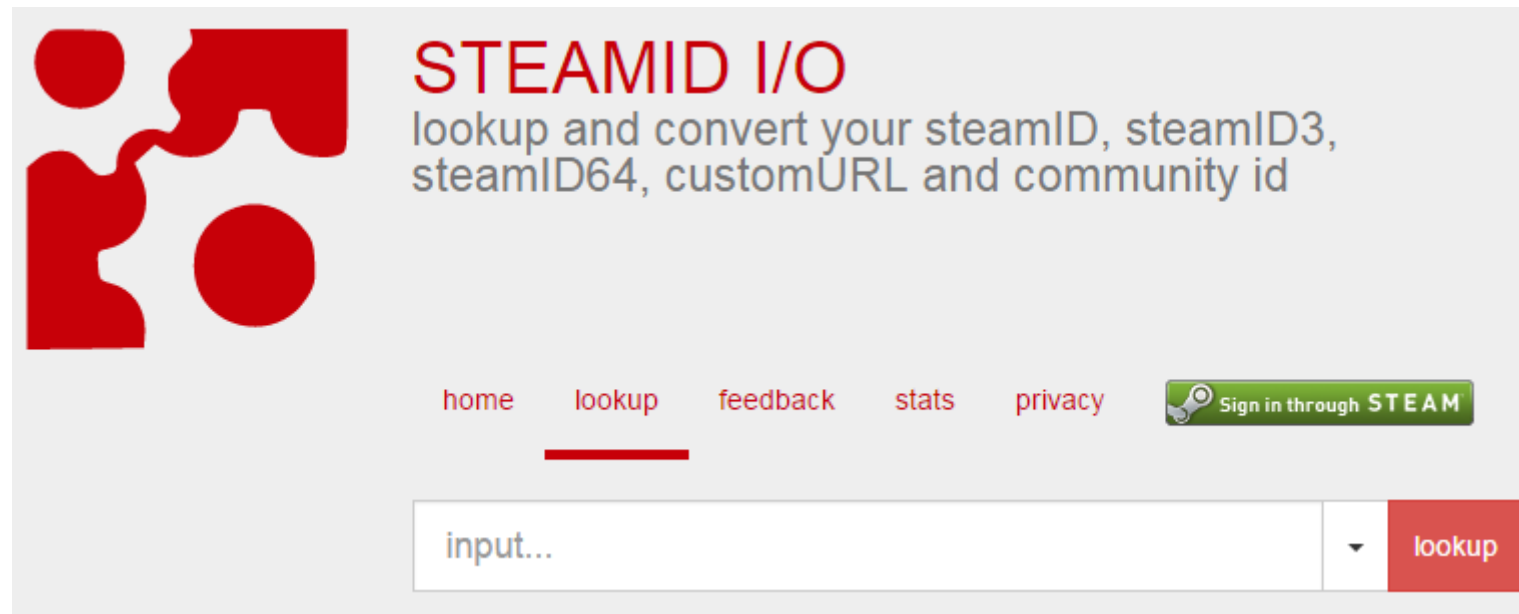
- ▶ Click the link (<http://steamcommunity.com/dev/apikey>) to register one



The screenshot shows the Steam website's 'Register Steam Web API Key' page. At the top, the Steam logo and navigation links (STORE, COMMUNITY, LANGTZ, ABOUT, SUPPORT) are visible. Below the header, the title 'Register Steam Web API Key' is displayed. The main content area includes a sub-header 'Register for a new Steam Web API Key' and a descriptive sentence: 'Registering for a Steam Web API Key will enable you to access many Steam features from your own website.' There is a text input field for 'Domain Name'. Below the input field, there is a checkbox labeled 'I agree to the Steam Web API Terms of Use', which is checked. At the bottom, there is a yellow 'Register' button with a mouse cursor hovering over it.

Some APIs need a 64bit SteamID of the user

- ▶ Click the link (<https://steamid.io/lookup>) to check



Reading Assignment (due Sep 17)

- ▶ *Base R Cheat Sheet*

- ▶ <https://www.rstudio.com/wp-content/uploads/2016/09/r-cheat-sheet-1.pdf>

- ▶ *Data Wrangling with dplyr and tidyr Cheat Sheet*

- ▶ <https://www.rstudio.com/wp-content/uploads/2015/02/data-wrangling-cheatsheet.pdf>

Q & A

