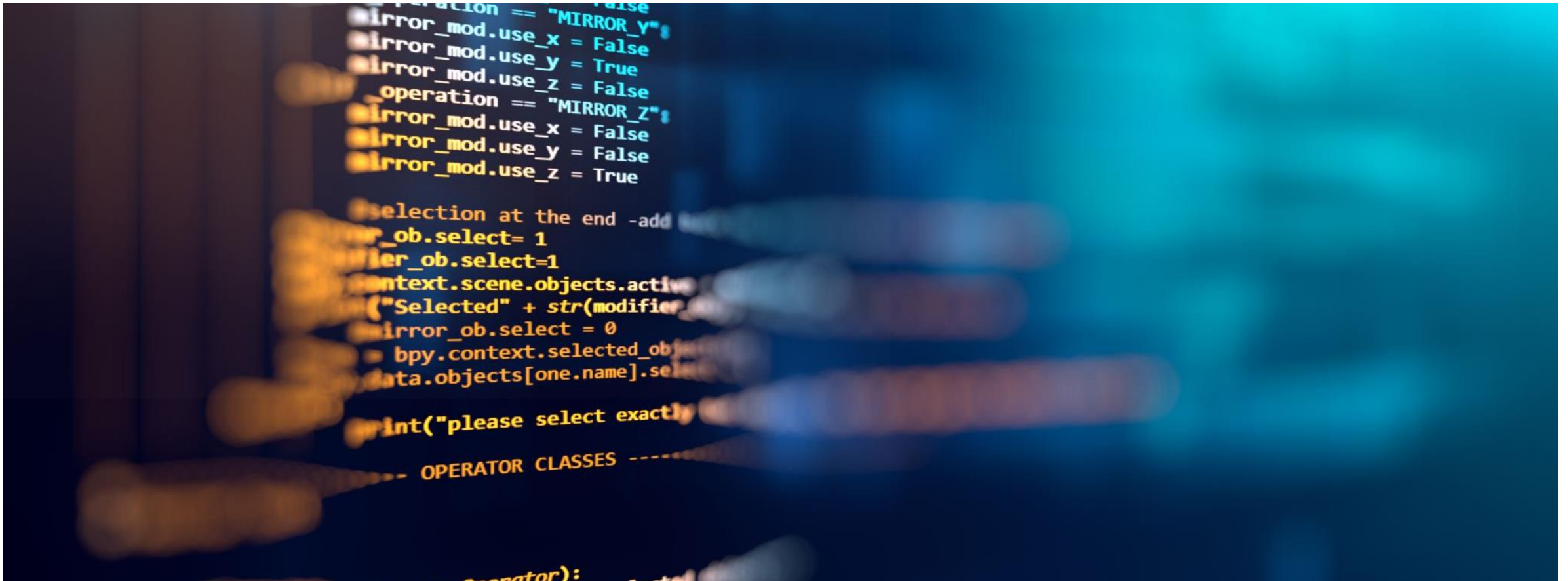




# WORKSHOPS

Week 2 -Data cleaning  
and data carpentry



# DATA: TYPES AND FORMATS

## TYPES OF DATA

- Quantitative: numerical
- Qualitative: text



## QUANTITATIVE

- Annual sales
- Profitability

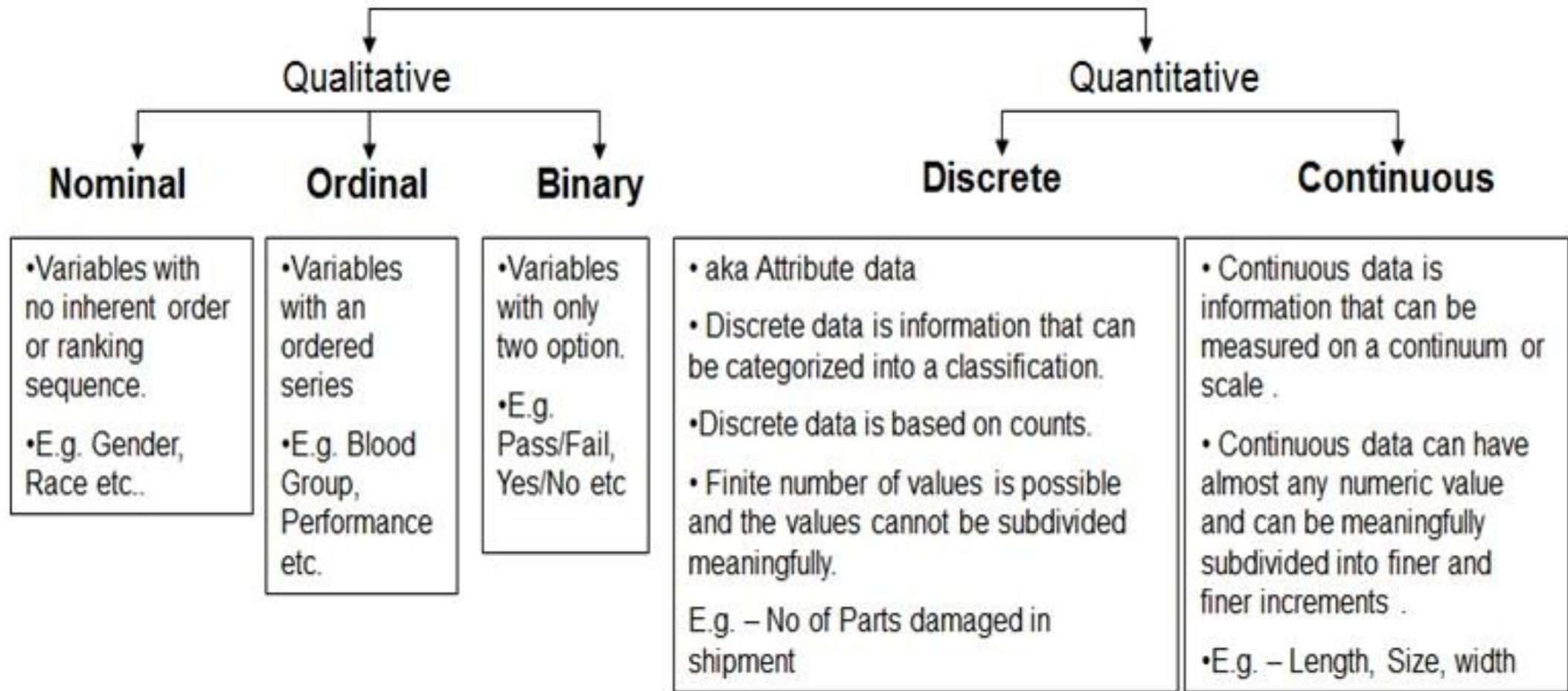
	A	B	C	D
1	CollectorID	StartDate	EndDate	I found Moneyworld confusing
2	92742972	10/26/2016 14:10:35	10/26/2016 14:12:43	Slightly Disagree
3	92742972	10/26/2016 10:03:07	10/26/2016 11:21:47	Strongly Disagree
4	92742972	10/25/2016 16:56:13	10/25/2016 17:14:13	Disagree
5	92742972	10/25/2016 14:42:38	10/25/2016 15:34:03	Disagree
6	92742972	10/25/2016 11:40:06	10/25/2016 12:23:13	Disagree
7	92742972	10/25/2016 09:59:18	10/25/2016 10:22:46	Slightly Agree
8	92742972	10/24/2016 17:12:38	10/24/2016 17:28:29	Slightly Agree
9	92742972	10/24/2016 15:45:40	10/24/2016 16:30:08	Slightly Disagree
10	92742972	10/24/2016 14:19:51	10/24/2016 14:22:06	Strongly Disagree
11	93508248	10/24/2016 11:01:33	10/24/2016 11:03:43	Strongly Disagree

## QUALITATIVE

- Customer reviews
- Explicit description of a malfunction in evaluation reports

	A	B	C	D
1	CollectorID	StartDate	EndDate	I found Moneyworld confusing
2	92742972	10/26/2016 14:10:35	10/26/2016 14:12:43	Slightly Disagree
3	92742972	10/26/2016 10:03:07	10/26/2016 11:21:47	Strongly Disagree
4	92742972	10/25/2016 16:56:13	10/25/2016 17:14:13	Disagree
5	92742972	10/25/2016 14:42:38	10/25/2016 15:34:03	Disagree
6	92742972	10/25/2016 11:40:06	10/25/2016 12:23:13	Disagree
7	92742972	10/25/2016 09:59:18	10/25/2016 10:22:46	Slightly Agree
8	92742972	10/24/2016 17:12:38	10/24/2016 17:28:29	Slightly Agree
9	92742972	10/24/2016 15:45:40	10/24/2016 16:30:08	Slightly Disagree
10	92742972	10/24/2016 14:19:51	10/24/2016 14:22:06	Strongly Disagree
11	93508248	10/24/2016 11:01:33	10/24/2016 11:03:43	Strongly Disagree

# TYPES OF DATA



# STRUCTURED DATA

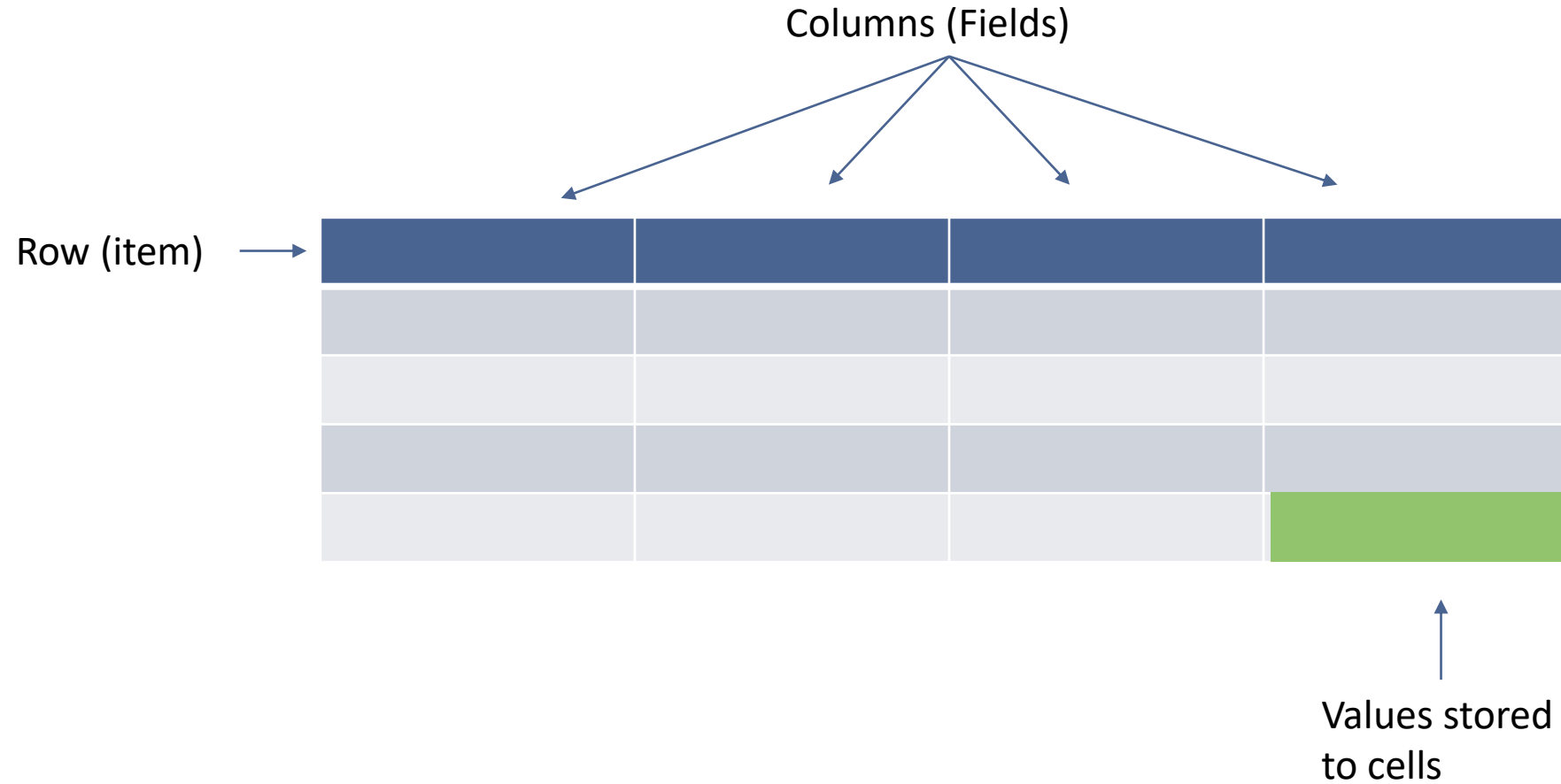
- Tabular or spreadsheet-like data in which each column may be a different type (string, numeric, date, or otherwise). This includes most kinds of data commonly stored in relational databases or tab- or comma-delimited text files.
- Multidimensional arrays (matrices).
- Multiple tables of data interrelated by key columns (what would be primary or foreign keys for a SQL user).
- Evenly or unevenly spaced time series [1].

# TABULAR AND CSV

- Tabular formats (ex. Excel)
- Comma-delimited text files, CSV  
format



# TABULAR DATA



## TABULAR DATA

	A	B	C	D
1	CollectorID	StartDate	EndDate	I found Moneyworld confusing
2	92742972	10/26/2016 14:10:35	10/26/2016 14:12:43	Slightly Disagree
3	92742972	10/26/2016 10:03:07	10/26/2016 11:21:47	Strongly Disagree
4	92742972	10/25/2016 16:56:13	10/25/2016 17:14:13	Disagree
5	92742972	10/25/2016 14:42:38	10/25/2016 15:34:03	Disagree
6	92742972	10/25/2016 11:40:06	10/25/2016 12:23:13	Disagree
7	92742972	10/25/2016 09:59:18	10/25/2016 10:22:46	Slightly Agree
8	92742972	10/24/2016 17:12:38	10/24/2016 17:28:29	Slightly Agree
9	92742972	10/24/2016 15:45:40	10/24/2016 16:30:08	Slightly Disagree
10	92742972	10/24/2016 14:19:51	10/24/2016 14:22:06	Strongly Disagree
11	93508248	10/24/2016 11:01:33	10/24/2016 11:03:43	Strongly Disagree

# CSV FORMAT

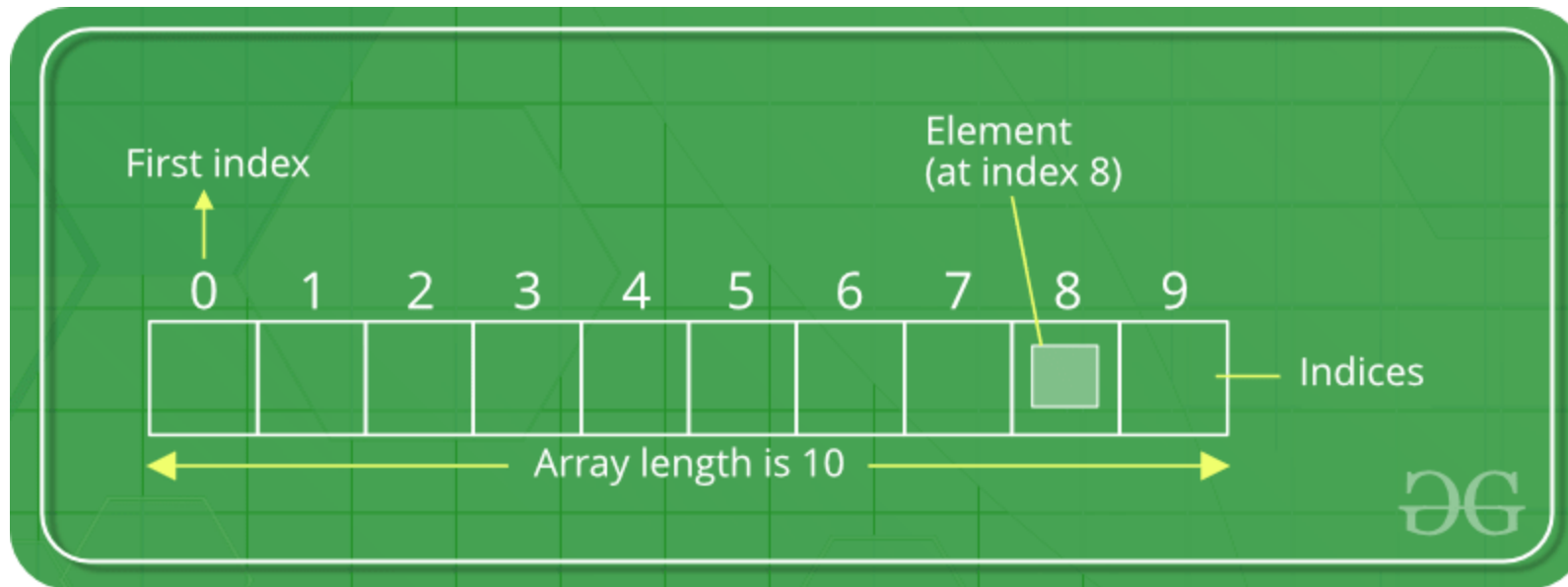
- CSV stands for Comma Separated Values
- Saves tabular information into a delimited text file with the series of values separated by commas
- It is lightweight and consumes less memory
- Each line of text is a single row
- It is human readable and can be opened using a text editor vs tabular data that are stored as binary files.

## CSV FORMAT EXAMPLE

```
CollectorID,StartDate,EndDate,I found Moneyworld confusing to use.  
92742972,10/26/2016 14:10:35,10/26/2016 14:12:43,Slightly Disagree,  
92742972,10/26/2016 10:03:07,10/26/2016 11:21:47,Strongly Disagree,  
92742972,10/25/2016 16:56:13,10/25/2016 17:14:13,Disagree,Disagree,  
92742972,10/25/2016 14:42:38,10/25/2016 15:34:03,Disagree,Strongly  
92742972,10/25/2016 11:40:06,10/25/2016 12:23:13,Disagree,Disagree,  
92742972,10/25/2016 09:59:18,10/25/2016 10:22:46,Slightly Agree,Dis  
92742972,10/24/2016 17:12:38,10/24/2016 17:28:29,Slightly Agree,Neu  
92742972,10/24/2016 15:45:40,10/24/2016 16:30:08,Slightly Disagree,  
92742972,10/24/2016 14:19:51,10/24/2016 14:22:06,Strongly Disagree,  
93508248,10/24/2016 11:01:33,10/24/2016 11:03:43,Strongly Disagree,
```

# ARRAYS

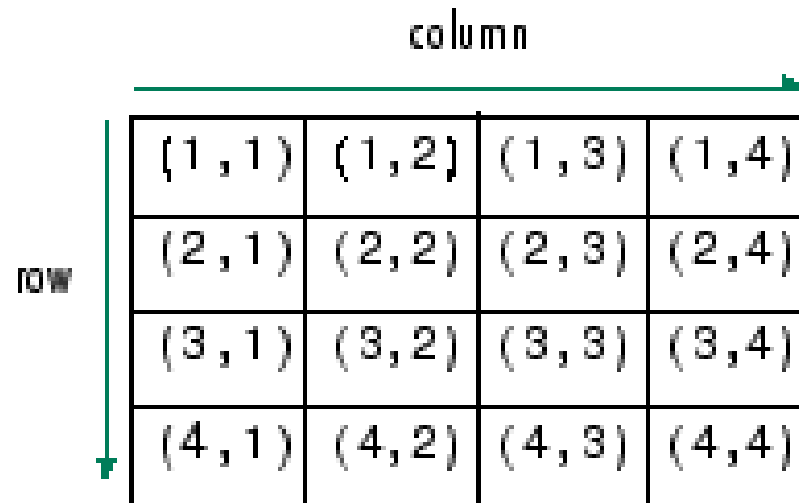
- An array is a special variable, which can hold more than one value at a time.





# MULTIDIMENSIONAL ARRAYS

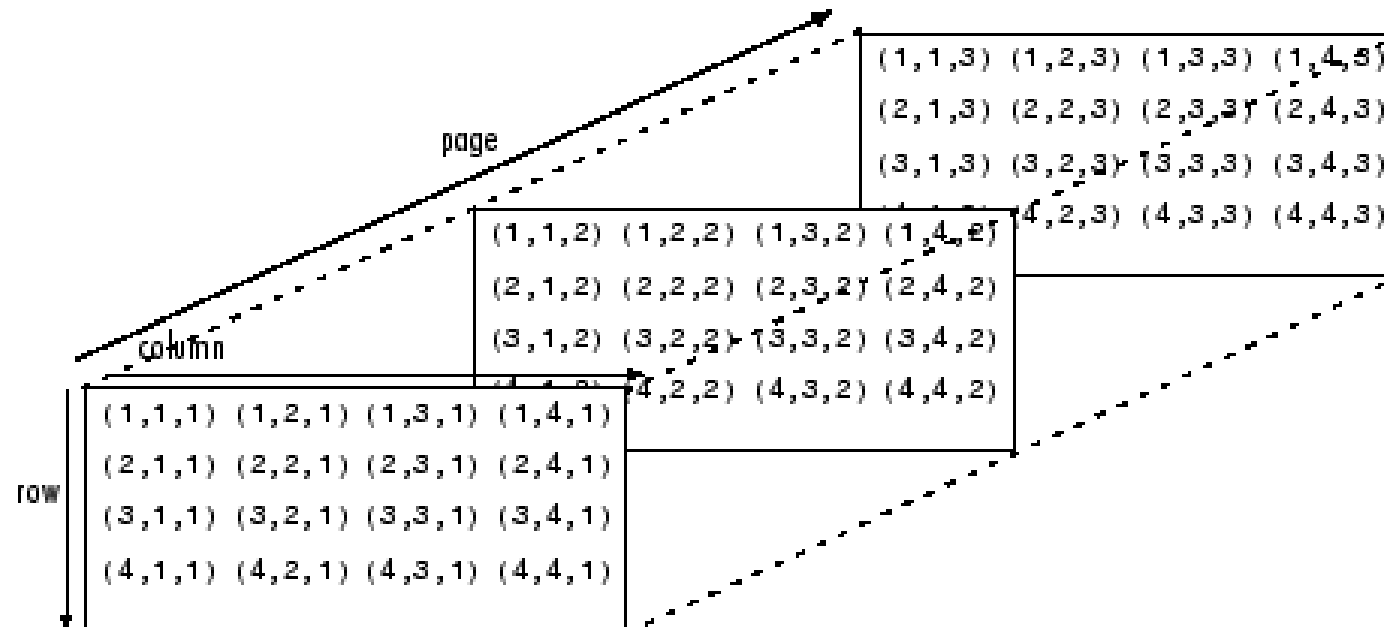
- Multidimensional arrays are data arrays with more than two dimensions. Each element is defined by two subscripts, the row index and the column index.



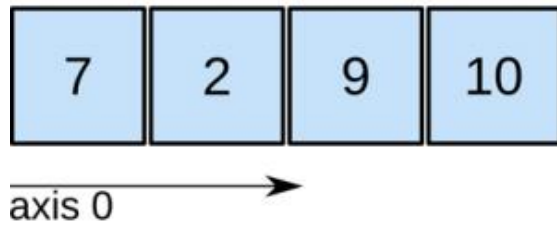
(1, 1)	(1, 2)	(1, 3)	(1, 4)
(2, 1)	(2, 2)	(2, 3)	(2, 4)
(3, 1)	(3, 2)	(3, 3)	(3, 4)
(4, 1)	(4, 2)	(4, 3)	(4, 4)

# MULTIDIMENSIONAL ARRAYS

- Multidimensional arrays are an extension of 2-D matrices and use additional subscripts for indexing. A 3-D array, for example, uses three subscripts. The first two are just like a matrix, but the third dimension represents pages or sheets of elements [2].

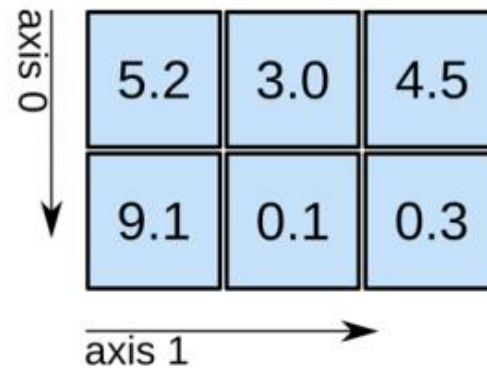


### 1D array



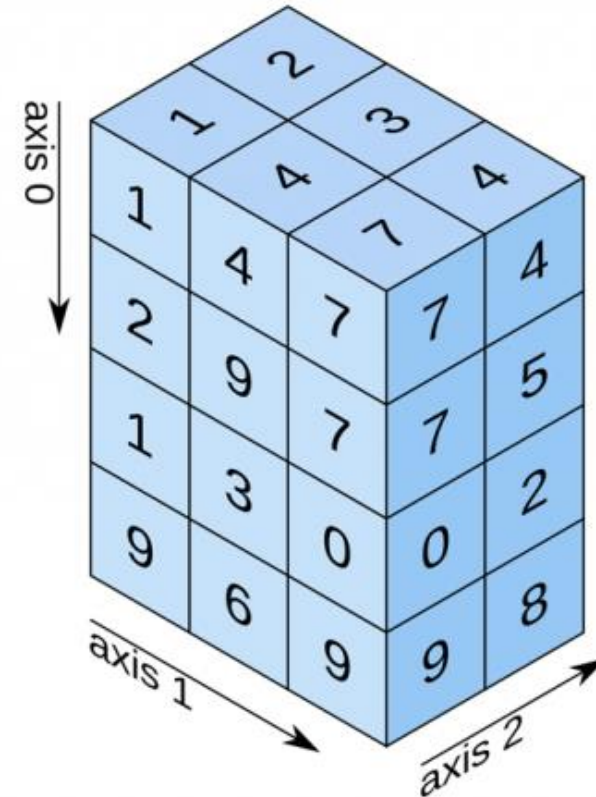
shape: (4,)

### 2D array



shape: (2, 3)

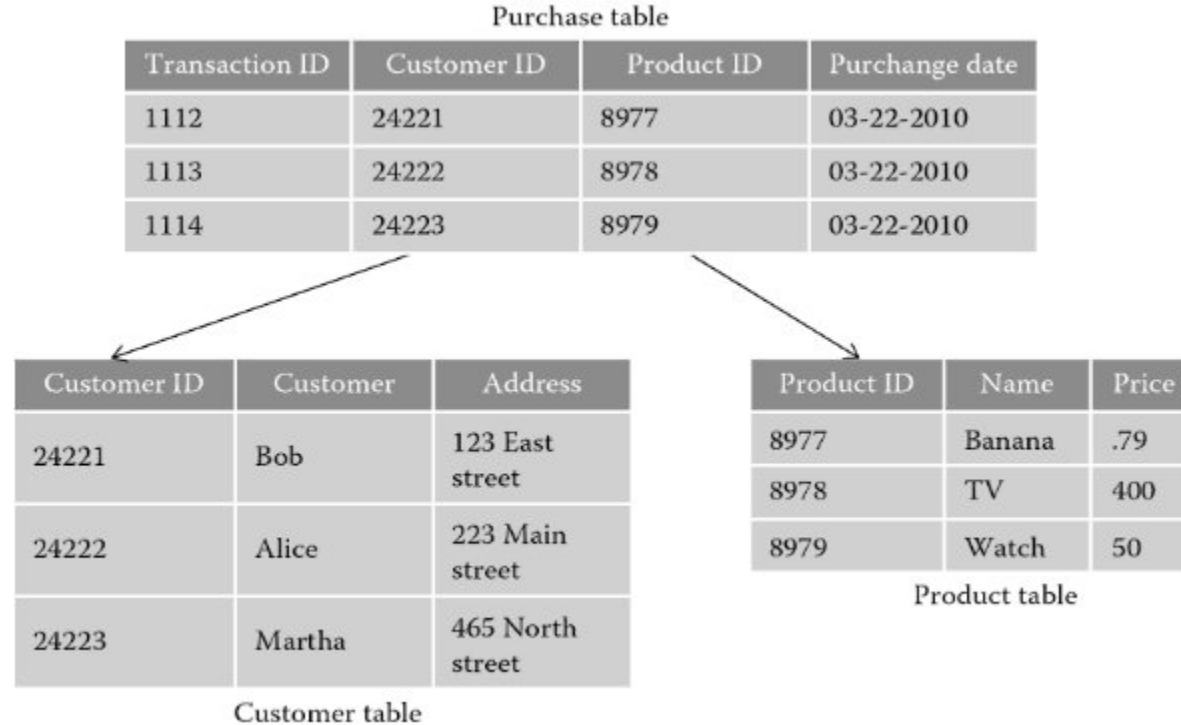
### 3D array



shape: (4, 3, 2)

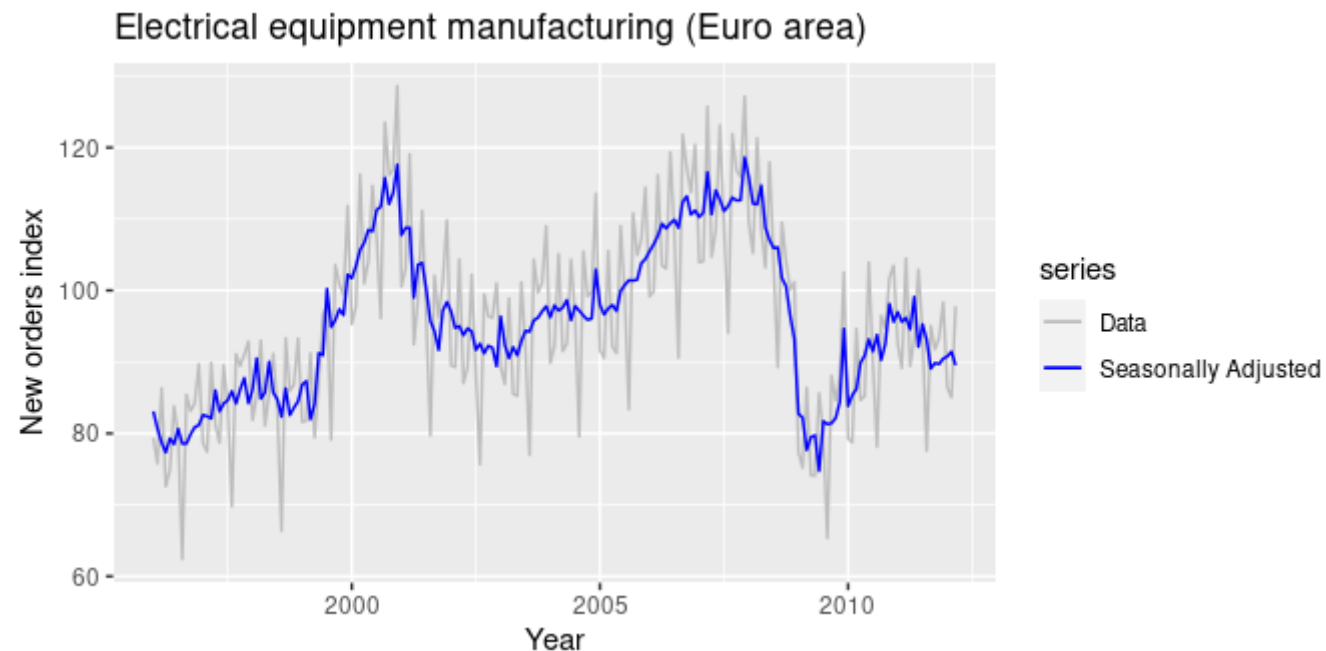
# RELATIONAL TABLES

- Multiple tables of data interrelated by key columns (what would be primary or foreign keys for a SQL user).



# TIME SERIES

- Time series data is a collection of quantities that are assembled over even intervals in time and ordered chronologically. The time interval at which data is collection is generally referred to as the time series frequency [3].

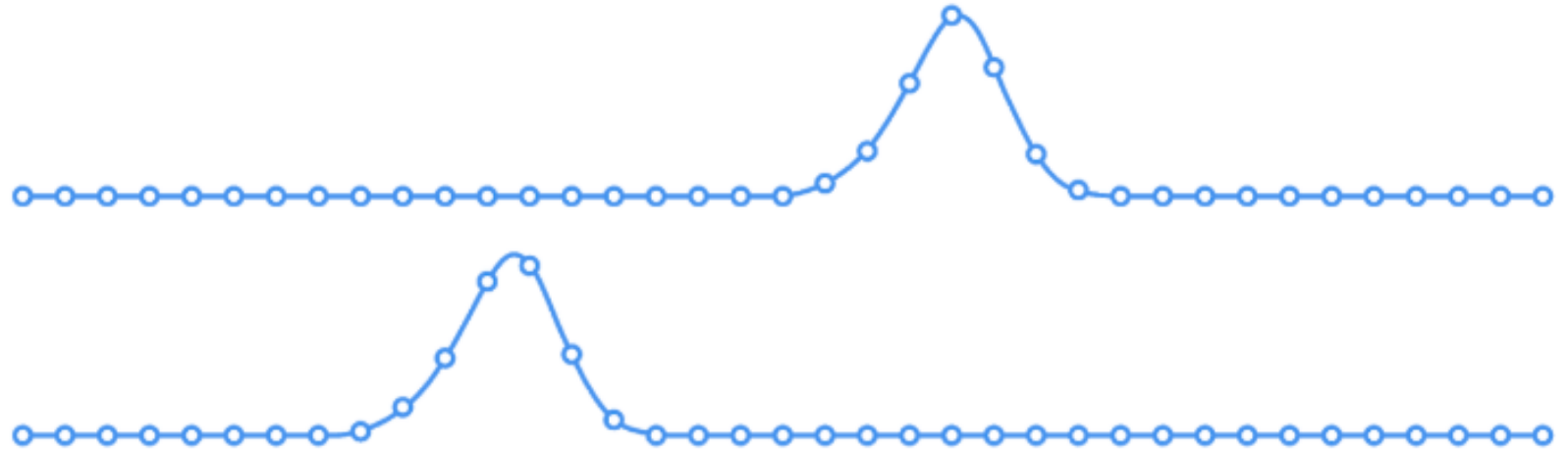




# TIME SERIES

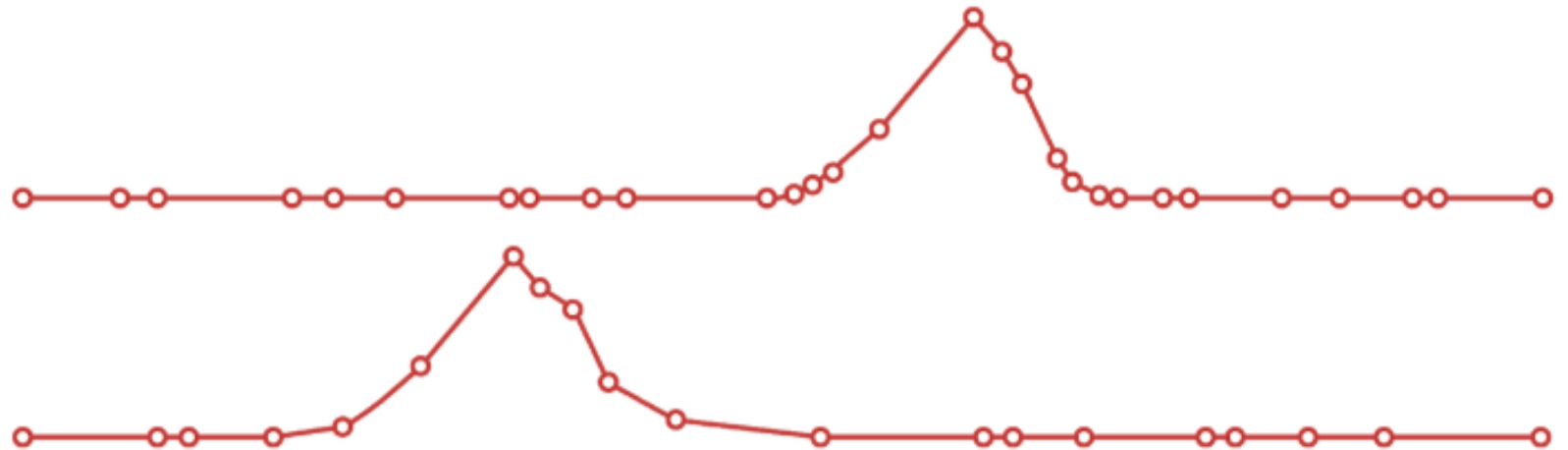
## Metrics (Regular)

Measurements gathered at regular time intervals



## Events (Irregular)

Measurements gathered at irregular time intervals



# REFERENCES

1. Rosett C.M., Hagerty A. (2021) Data Wrangling. In: Introducing HR Analytics with Machine Learning. Springer, Cham. [https://doi.org/10.1007/978-3-030-67626-1\\_13](https://doi.org/10.1007/978-3-030-67626-1_13)
2. Stefanski, R., Sinha, V. and Poddar, A., 2022. *Data Wrangling in 6 Steps: An Analyst's Guide For Creating Useful Data*. [online] Learn | Hevo. Available at: <https://hevodata.com/learn/data-wrangling/#s2>
3. Tripathi, S., Muhr, D., Brunner, M., Jodlbauer, H., Dehmer, M. and Emmert-Streib, F., 2021. Ensuring the Robustness and Reliability of Data-Driven Knowledge Discovery Models in Production and Manufacturing. *Frontiers in Artificial Intelligence*, 4.