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"Factual information (such as measurements or statistics) used as a basis for reasoning, discussion, or calculation"

https://www.merriam-webster.com/dictionary/data



Module 2 Objectives

- Appreciate some common issues associated with assembling data.
- Investigate how assembling data is related to framing a question and calculating the results.
- Execute some fundamental data assembly tasks.



FACT Framework

I

- Frame the question
- Assemble the data
- Calculate the results
- Tell others the results



Framing a Question Influences:

- Whether or not you will spend time supporting the organization's goals
- Whether you even need to use data
- If you do could benefit from data, then it will influence the data that is assembled.



Frame a Question That

- Considers organization's goals
- Is informed by domain knowledge
- Leads to action



Bad Examples of Framing a Question

Why are things bad?

Why are sales down?



Good Examples of Framing a Question

• In what regions are sales lower than expected?

 What factors caused a decline in sales for regions in which sales are lower than expected?



Great Examples of Framing a Question

 What factors are most influential in identifying regions that have sales that are statistically lower than expected?

 What factors cause a statistically significant decline in sales for regions in which sales are lower than expected?



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Steps for Assembling Data

- Finding data
- Extract, transform, load (ETL)
- Data wrangling



Chief Data Officers "have been chartered with improving the efficiency and value-generating capacity of their organization's information ecosystem. That is, they've been asked to lead their organization in treating and leveraging information with the same discipline as its other, more traditional assets."



A Few Data Sources on the Web

www.data.gov

www.google.com/publicdata/directory

aws.amazon.com/opendata/public-datasets/

<u>docs.microsoft.com/en-us/azure/sql-database/sql-database-public-</u>data-sets

https://www.kaggle.com/datasets

https://data.world/

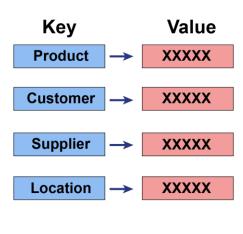
https://www.gapminder.org/data/



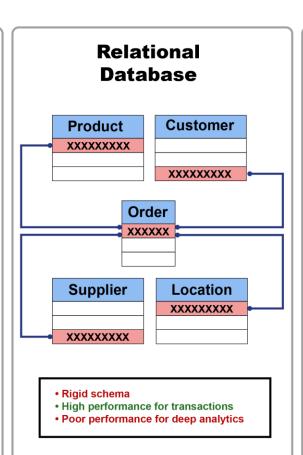
ETL

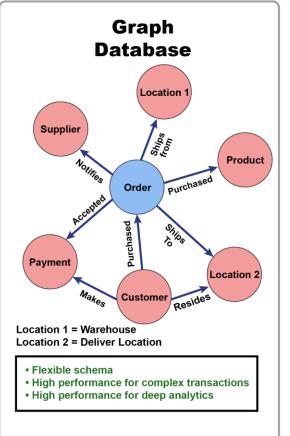
- Extract
- Transform
- Load

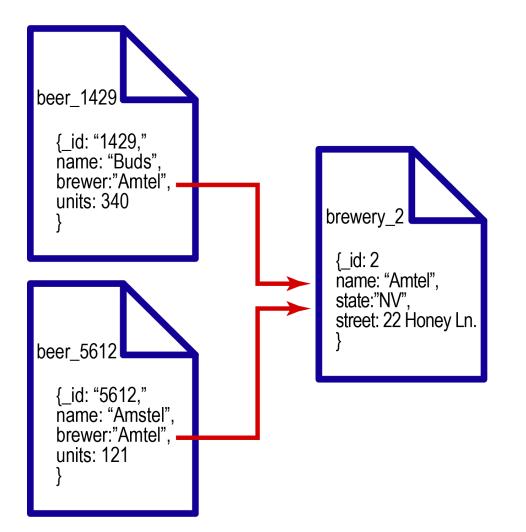
Key-Value Database



- · Highly fluid schema/no schema
- High performance for simple transactions
- · Poor performance deep analytics







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Data Wrangling

- Cleaning data
- Combining data with other data
- Cleaning data again
- Combining data with other data again
- Cleaning again
- Then changing its shape



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Summary Statistics = Descriptive Statistics

Examples of Summary Statistics:

- Minimum
- Mean
- Median
- Mode
- Maximum
- Variance
- Standard Deviation
- Range



Sprinkler Sales

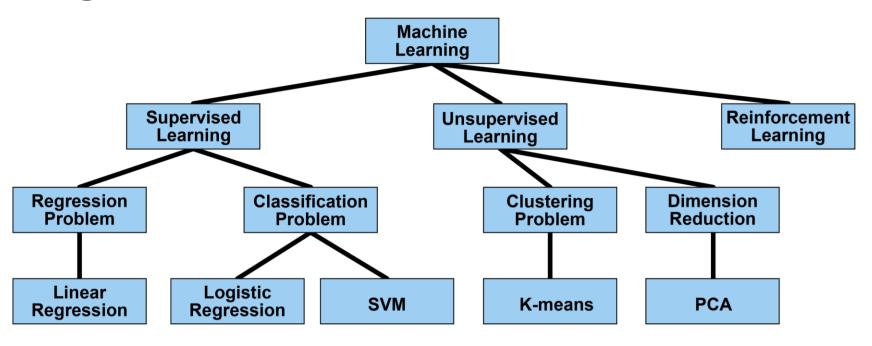
	Abnormal Sales	Abnormal Temp.	Abnormal Precip.
Northwest	15	5	-7.5
Midwest	5	2	-2.5
Northeast	-50	-17	25
East Coast	-60	-20	30
Southeast	-80	-27	40
South	-40	-13	20
Southwest	10	3	-5
Central Plains	0	0	0
Rocky Mountains	20	7	-10
West Coast	50	17	-25

Sprinkler Sales Model

Weekly Sales = 250 - 500*Precip + 250*Temp – 46*Wind



Categories of Machine Learning Algorithms



Considerations for Selecting an **Algorithm**

- Tradeoff between accuracy and the time to create the model
- How well does the algorithm deal with:
 - Nonlinearity
 - High dimensionality
 - Multicollinearity
 - Constant stream of new data
- Ability to explain the model to others



How Is Model Accuracy Evaluated

 Using a "loss" function that measures the difference between the right answers and the predicted answer

 Creating a model on a "training" dataset and then evaluating the performance on a separate "testing" dataset





Data Types in This Lesson

- Character strings
- Numeric
- Datetimes
- Factors

Console Terminal × Jobs ×

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Terminal V
```

```
~/ ~
```

- > as.numeric('\$5,678.34')
- [1] NA

Warning message:

NAs introduced by coercion



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```
Console Terminal × Jobs ×
~/ 🖈
> as.numeric('5678.34')
[1] 5678.34
```



Dates and Times

- Stored in a special integer format that displays them as dates
- Number of days that have passed since the start of a specific epoch
- March 3, 2005 is stored as the integer 38,415 in Excel.
- Timestamps represent the number of seconds that have passed since the start of an epoch.



What does 03/04/05 represent?

March 4, 2005

April 3, 2005

April 5, 2003

Additional Considerations for Dates and Times

3

- Time zones
- Daylight savings time
- Leap year
- Number of work days in a quarter
- Weekends
- Holidays



