# COMP 499 Introduction to Data Analytics

Lecture 6 — Data Cleaning

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## Overview of Lecture

- 1. Data Cleaning
- 2. Data Compatibility
- 3. Missing Data
- 4. Outliers
- 5. Remove Duplicates
- 6. Consistency of Data

# Data Cleaning

#### Data Cleaning

detecting and correcting corrupt or inaccurate records

#### Error

is information lost in data acquisition

#### Artifact

systematic problem arising from data processing

#### Sniff Test

look closely to see if something may be wrong

# **Data Cleaning Process**

**Iterative** 

Keep raw data from data acquisition

You need a reference data set you will need to re-process it many times

Script your cleaning steps to refine and re-run your process

# Data Compatibility

## Comparing apples to apples

- unit conversions on numbers
- ► character code representations
- name unification
- ▶ time unification
- ▶ date unification
- ▶ financial unification

... And normalize to same scale Z-scores

# Missing Data

Delete observations or columns that have missing values

## Imputation — assign a value by inference

- ▶ fixed value, eg zero
- ▶ mean value (of column values)
- random value from randon observations
- by interpolation from similar observations by linear regression or machine learning

# **Outliers**

# **Duplicates**

## Remove duplicates

Duplicates arise due to merging multiple data sets

# Consistency of Data

#### Cluster/sort data values

To bring together duplicate and similar data values to make it easy to see differences/errors (See OpenRefine video 1 of 3)

#### Cluster observations

To bring together duplicate and similar observations to make it easy to see differences/errors

#### Check for consistency

Differences need to be investigated