

Car Crashes in New York City

Adis Mahmic

Agenda

Hypothesis

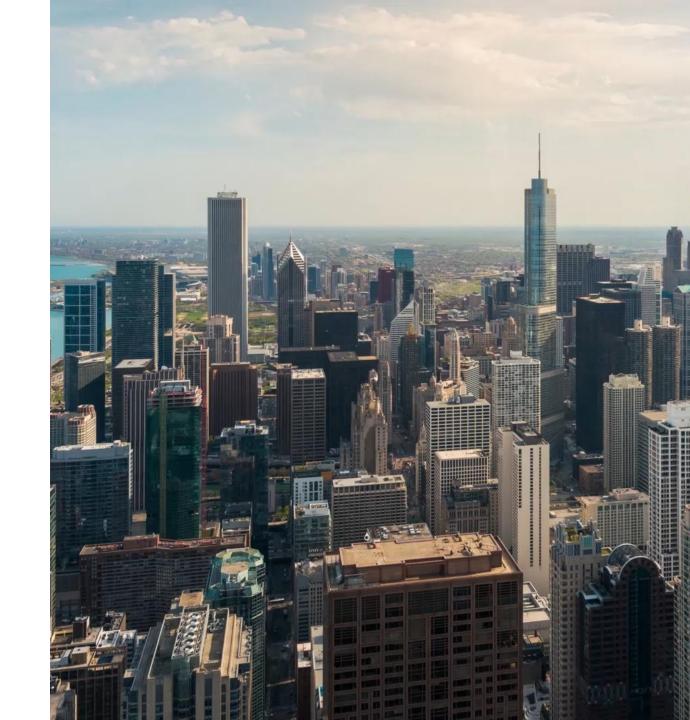
Introduction to data

Cleaning the data

What is Hadoop Map/Reduce?

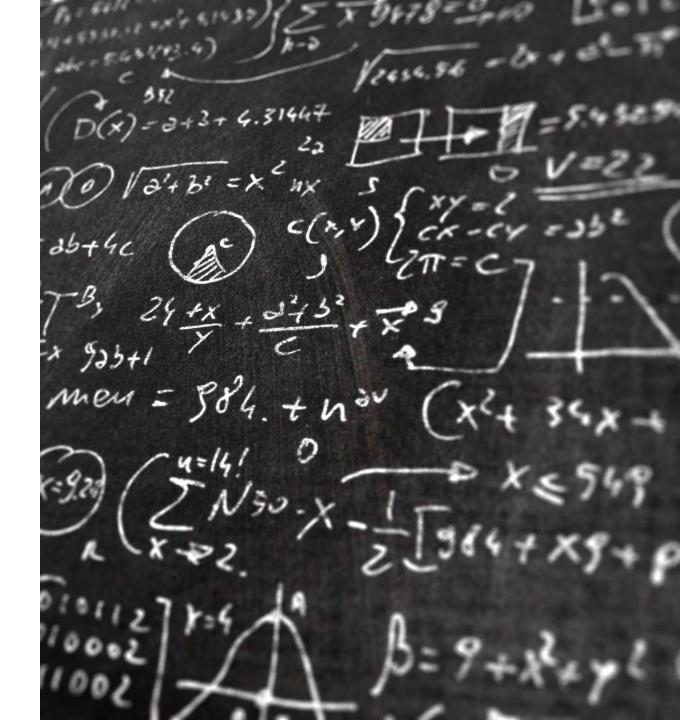
Visual aids

Final tips & takeaways



Hypothesis

Distracted driving is the leading cause of motor accident deaths.



Distracted driving is the leading cause of motor accident deaths.

But what is categorized as distracted driving?





Before analyzing the dataset, my hypothesis is that distracted driving is the number 1 cause of death in car accidents.





⊿ A	В С	D	Е	F		н			К	L N	М	N	0	P	Q	R S T U V	w x
CRASH DATE CRA	ASH TIME BOROUGH	ZIP CODE	LATITUDE	LONGITUDE	LOCATION	ON STREET NAME	CROSS STF	OFF STREE N	NUMBER (NUM	1BER (NUM	IBER (NU	MBER (CONTRIBL CONTRIBL CONTRIBL CONTRIBL CO	NTRIBL COLLISION VEHI				
9/11/2021	2:39					WHITESTONE EXPRESSWAY	20 AVENUE	E	2	0	0	0	0	0	2	Aggressive Unspecified	4455765 Seda
3/26/2022	11:45					QUEENSBORO BRIDGE UPPER			1	0	0	0	0	0	1	0 Pavement Slippery	4513547 Seda
11/1/2023	1:29 BROOKLYN	11230	40.62179	-73.970024	(40.62179, -73.970024)	OCEAN PARKWAY	AVENUE K		1	0	0	0	0	0	1	0 UnspecificUnspecificUnspecified	4675373 Mop
6/29/2022	6:55					THROGS NECK BRIDGE			0	0	0	0	0	0	0	0 Following Unspecified	4541903 Seda
9/21/2022	13:21					BROOKLYN BRIDGE			0	0	0	0	0	0	0	Passing T Unspecified	4566131 Stati
4/26/2023	13:30					WEST 54 STREET			0	0	0	0	0	0	0	0 Unspecific Unspecified	4623759 Seda
11/1/2023	7:12					HUTCHINSON RIVER PARKWAY			0	0	0	0	0	0	0	0 Following Driver Inattention/Distraction	4675709 Seda
11/1/2023	8:01					WEST 35 STREET	HENRY HU	JDSON RIVE	0	0	0	0	0	0	0	0 Failure to Yield Right-of-Way	4675769 Seda
0 4/26/2023	22:20							61 Ed k	0	0	0	0	0	0	0	0 Unspecified	4623865 Seda
9/11/2021	9:35 BROOKLYN	11208	40.667202	-73.8665	(40.667202, -73.8665)			1211 LO	0	0	0	0	0	0	0	0 Unspecified	4456314 Seda
2 12/14/2021	8:13 BROOKLYN		40.683304	-73.917274	(40.683304, -73.917274)	SARATOGA AVENUE	DECATUR S		0	0	0	0	0	0	0	0	4486609
3 4/14/2021	12:47				(10100001, 101001011, 1,	MAJOR DEEGAN EXPRESSWAY RAMP			0	0	0	0	0	0	0	0 Unspecific Unspecified	4407458 Dum
4 12/14/2021	17:05		40.709183	-73.956825	(40.709183, -73.956825)	BROOKLYN QUEENS EXPRESSWAY			0	0	0	0	0	0	0	0 Passing Tunspecified	4486555 Seda
5 12/14/2021	8:17 BRONX	10475	40.86816		(40.86816, -73.83148)			344 BAY	2	0	0	0	0	0	2	0 Unspecific Unspecified	4486660 Seda
6 12/14/2021	21:10 BROOKLYN	11207	40.67172		(40.67172, -73.8971)			2047 PI	0	0	0	0	0	0	0	Driver Inex Unspecified	4487074 Seda
7 12/14/2021	14:58 MANHATTAN	10017	40.75144		(40.75144, -73.97397)	3 AVENUE	EAST 43 ST		0	0	0	0	0	0	0	Passing T Unspecified	4486519 Seda
8 12/13/2021	0:34	10017	40.701275		(40.701275, -73.88887)	MYRTLE AVENUE	L/101 40 01	TICE!	0	0	0	0	0	0	0	Passing o Unspecified	4486934 Stati
9 12/14/2021	16:50 QUEENS	11/113	40.675884		(40.675884, -73.75577)	SPRINGFIELD BOULEVARD	EAST GATE	Ε ΡΙ Δ7Δ	0	0	0	0	0	0	0	0 Turning In Unspecified	4487127 Seda
0 12/14/2021	8:30	11410	40.070004	-70.70077	(40.070004, -70.70077)	broadway		treet -west 8	0	0	0	0	0	0	0	0 Unsafe La Unspecified	4486634 Stati
1 12/14/2021	0:59		40.59662	74 00231	(40.59662, -74.00231)	BELT PARKWAY	west ou su	eet-westt	0	0	0	0	0	0	0	0 Unsafe Speed	4486564 Seda
2 12/14/2021	23:10 QUEENS	11434	40.66684		(40.66684, -73.78941)	NORTH CONDUIT AVENUE	150 STREET	<u></u>	2	0	0	0	0	0	2	0 Reaction t Unspecified	4486635 Seda
	17:58 BROOKLYN		40.68158		, , , , , , , , , , , , , , , , , , , ,	NORTH CONDOIT AVENUE		480 DE/	0	0	0	0	0	0	0	·	4486604 Tank
3 12/14/2021	20:03 BROOKLYN	11217 11226	40.65068		(40.68158, -73.97463) (40.65068, -73.95881)			878 FLA	4	0	0	0	0	0	4	0 Passing Tunspecified	4486991 Seda
4 12/14/2021		11220	40.00000	-/3.93001	(40.60066, -75.90661)	MEEKED AVENUE			3	0	0	0	0	0	3	0 Steering Failure	
5 12/14/2021	1:28	40400	40.07000	70.004606	(40.07000 70.004000)	MEEKER AVENUE	LORIMER S		3	0	0	0	0	0	3	0 Traffic Cor Unspecified	4486284 Statio
6 12/11/2021	19:43 BRONX	10463	40.87262		(40.87262, -73.904686)	WEST KINGSBRIDGE ROAD	HEATH AVE	ENUE	1			0	•	•	0	0 Unspecific Unspecified	4487040 Statio
7 12/14/2021	14:30	40004	40.783268		(40.783268, -73.82485)	WHITESTONE EXPRESSWAY		000 11/5	0	0	0	0	0	0		0 Following Unspecific Unspecified	4486537 Statio
8 12/11/2021	4:45 MANHATTAN	10001	40.748917		(40.748917, -73.993546)	LONG IN AND EVEREGOMAN		232 WE	0	0	0	0	0	0	0	0 Following Unspecified	4486905 Statio
9 12/14/2021	5:46	44070	40.744644		(40.744644, -73.77041)	LONG ISLAND EXPRESSWAY	04 41/5111		1	0	0	0	0	0	1	0 Other Veh Other Vehicular	4487122 Statio
0 12/13/2021	6:30 QUEENS	11372			(40.75373, -73.88505)	82 STREET	34 AVENUE	E	0	0	0	0	0	0	0	0 Unspecified	4486967 Seda
1 12/14/2021	3:43		40.804375		(40.804375, -73.93742)	LEXINGTON AVENUE		<u> </u>	1	0	1	0	0	0	0	0 Unspecified	4486304 Stati
2 12/13/2021	17:40 STATEN ISLAND		40.63165		(40.63165, -74.08762)	VICTORY BOULEVARD	WOODSTO					_	_	0	1	0 Unspecific Unspecified	4487001 Seda
3 12/14/2021	17:31 BROOKLYN	11230	40.623104		(40.623104, -73.95809)	EAST 18 STREET	AVENUE K		1	0	1	0	0	0	0	0 Unspecified	4486516 Seda
4 12/14/2021	20:13 BROOKLYN	11215	40.66576		(40.66576, -73.9845)			366 12	0	0	0	0	0	0	0	0 Passing ToUnspecified	4486605 Seda
5 12/14/2021	12:54 BROOKLYN	11217			(40.687534, -73.9775)	FULTON STREET	SAINT FELI		1	0	0	0	1	0	0	0 Unspecific Unspecified	4487052 Seda
6 12/14/2021	17:15 BROOKLYN	11211	40.710957		(40.710957, -73.951126)	GRAND STREET	UNION AV		1	0	0	0	0	0	1	0 Passing o Unspecified	4486556 Bus
7 12/14/2021	22:49 BRONX	10455	40.81813		(40.81813, -73.910126)			713 EA(0	0	0	0	0	0	0	Driver Inat Unspecified	4486875 Taxi
8 12/12/2021	9:00 QUEENS	11385	40.70447	-73.90148	(40.70447, -73.90148)			59-14 67	0	0	0	0	0	0	0	Passing To Unspecified	4486933 Stati
9 12/14/2021	16:25		40.784615	-73.953964	(40.784615, -73.953964)	EAST 93 STREET			1	0	0	0	1	0	0	Driver Inal Driver Inattention/Distraction	4486581 Van
0 11/2/2023	9:20					35 AVENUE			0	0	0	0	0	0	0	Accelerator Defective	4675877 Statio
1 4/14/2021	14:30					EASTCHESTER ROAD	PELHAM P	PARKWAY N	0	0	0	0	0	0	0	Driver Inat Unspecified	4407520 Bus
2 12/16/2021	6:59					KINGSLAND AVENUE	MEEKER AV	VENUE	1	0	1	0	0	0	0	Traffic Control Disregarded	4486960
3 4/27/2023	15:40					WILLIAMSBURG BRIDGE OUTER ROADWA			1	0	0	0	0	0	1	Driver Inat Unspecified	4624078 Seda
4 9/22/2022	16:16 QUEENS	11418	40.698257	-73.82632	(40.698257, -73.82632)	123 STREET	89 AVENUE	E	1	0	0	0	0	0	0	0 Passing o Unspecified	4566408 Seda
5 1/12/2023	21:00 BROOKLYN	11208						97-16 DF	0	0	0	0	0	0	0	0 Driver Inat Unspecified	4598234 Stati
6 6/29/2022	16:00					WILLIAMSBURG BRIDGE OUTER ROADWA			1	0	0	0	0	0	1	Driver Inat Unspecified	4542336 Moto
7 4/15/2021	16:15					HUTCHINSON RIVER PARKWAY			0	0	0	0	0	0	0	0 Pavement Slippery	4407665 Stati
8 7/7/2021	11:42					THROGS NECK BRIDGE			1	0	0	0	0	0	1	0 Unsafe La Unspecified	4456591 Seda
9 4/27/2023	22:13					PELHAM PARKWAY SOUTH	WILLIAMSI	BRIDGE RO.	0	0	0	0	0	0	0	Driver Inat Unspecified	4624101 Seda
0 7/12/2022	17:50 BROOKLYN	11225	40.663303	-73.96049	(40.663303, -73.96049)			44 EMF	0	0	0	0	0	0	0	0 Oversized Unspecified	4545699 Seda
1 3/23/2022	10:00							71 EAS	0	0	0	0	0	0	0	0 Pedestrian/Bicyclist/Other Pedestrian Error/	Confusic 4512922 Bike
2 7/9/2021	0:43		40.720535	-73.88885	(40.720535, -73.88885)	ELIOT AVENUE			0	1	0	1	0	0	0	0 Unspecified	4456659 Bus
4/24/2022	16:45		40.607685		(40.607685, -74.13892)	STATEN ISLAND EXPRESSWAY			1	0	0	0	0	0	1	0 Driver Inal Unspecified	4521660 Stati
4 4/24/2022	4:49		40.855972		(40.855972, -73.869896)	BOSTON ROAD	BRONX PA	ARK EAST	0	0	0	0	0	0	0	0 UnspecificUnspecified	4521759 Stati
4/22/2022	17:17		40,790276		(40.790276, -73.9396)	EAST 107 STREET			1	0	1	0	0	0	0	Traffic Control Disregarded	4522226 E-Bik

В	C
NUMBER OF MOTORIST KILLED	CONTRIBUTING FACTOR VEHICLE 1
0	Aggressive Driving/Road Rage
0	Pavement Slippery
0	Unspecified
0	Following Too Closely
0	Passing Too Closely
0	Unspecified
0	Following Too Closely
0	Failure to Yield Right-of-Way
0	Unspecified
0	Passing Too Closely
0	Unspecified
0	Driver Inexperience
0	Passing Too Closely
0	Passing or Lane Usage Improper
0	Turning Improperly
0	Unsafe Lane Changing
0	Unsafe Speed
0	Reaction to Uninvolved Vehicle
0	Passing Too Closely
0	Steering Failure
0	Traffic Control Disregarded
0	Unspecified
0	Following Too Closely
0	Following Too Closely
0	Other Vehicular
0	Unspecified
0	Passing Too Closely
0	Unspecified
0	Passing or Lane Usage Improper

- The Motor Crash Collisions dataset was created by the New York
 Police Department and is used to keep records of each and every car
 crash that occurs in New York.
- Each row in the Dataset represents a police-reported crash in NYC, capturing key details about the incident such as contributing factor, street, and number of people injured.
- The main columns we are looking at is number of people killed and contributing factor.

What is our dataset?



Using Head Command

```
amahm@AdisSurface MINGW64 ~/Downloads/Adis GGC/Data Intensive/Motor-Vehicle-Collisions (main)
$ head Motor_Crash_Collisions_Extracted.csv
NUMBER OF PERSONS INJURED, NUMBER OF PERSONS KILLED, NUMBER OF PEDESTRIANS INJURED, NUMBER OF PEDESTRIANS KILLED, NUMBER OF MOTORIST INJURED, NUMBER OF MOTORIST KILL ED, CONTRIBUTING FACTOR VEHICLE 1, CONTRIBUTING FACTOR VEHICLE 2
2,0,0,0,2,0,Aggressive Driving/Road Rage, Unspecified
1,0,0,0,1,0,Pavement Slippery,
1,0,0,0,1,0,Unspecified
0,0,0,0,0,0,Following Too Closely, Unspecified
0,0,0,0,0,0,Unspecified, Unspecified
0,0,0,0,0,0,Following Too Closely, Driver Inattention/Distraction
0,0,0,0,0,0,Failure to Yield Right-of-Way,
0,0,0,0,0,0,Unspecified,
```

Using Awk Command

```
Adis@DESKTOP-F36S3P0 MINGW64 ~/MotorVehicleCollisions (main)
$ awk -F, '{print $18 "," $19}' Motor_Crash_Collisions.csv > motorist_killed_factors.csv

Adis@DESKTOP-F36S3P0 MINGW64 ~/MotorVehicleCollisions (main)
$ head motorist_killed_factors.csv

NUMBER OF MOTORIST KILLED,CONTRIBUTING FACTOR VEHICLE 1

0,Aggressive Driving/Road Rage

0,Pavement Slippery

0,Unspecified

0,Following Too Closely

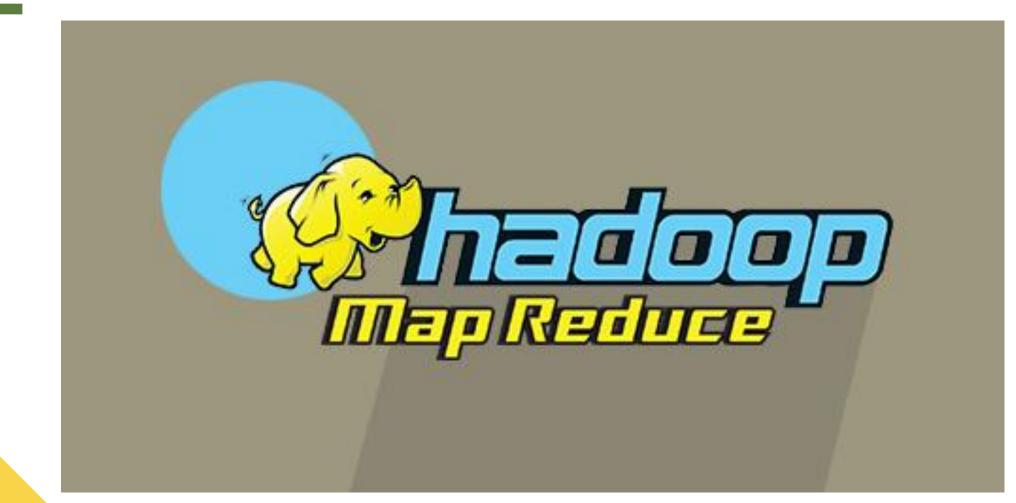
0,Unspecified

0,Following Too Closely

0,Failure to Yield Right-of-Way

0,Unspecified
```

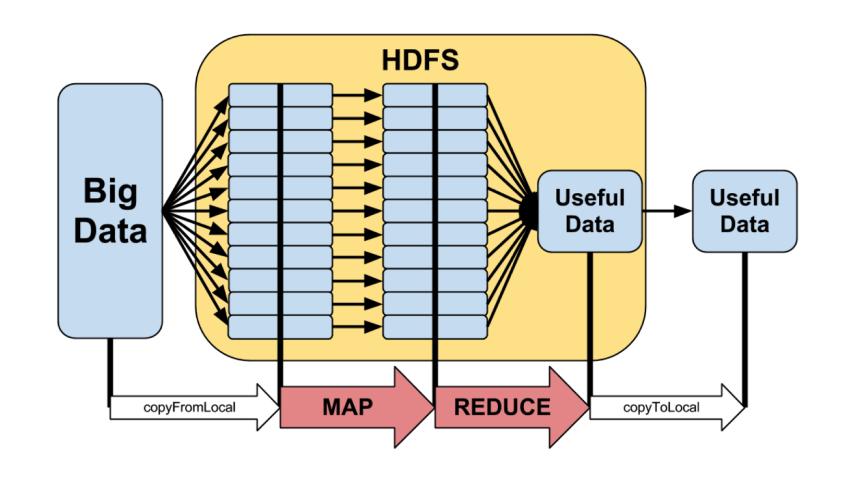
Hadoop Map Reduce



Hadoop Map Reduce API

- Map Reduce is a programming model that uses parallel processing to speed large scale data processing.
- Enables massive scalability within a Hadoop cluster.
- Map task takes set of data and converts it into key value pairs.
- Reduce task takes output from the map task and aggregates values within the same key and processes the data into a final set of key value pairs.

- 1. Data is collected.
- 2. Mapper class maps data into key value pairs.
- 3. Data is stored in Hadoop Distributed File System.
- 4. Reducer reduces key value pairs into final key value pairs.



Map Reduce Example

Mapper Class

Purpose: Analyze vehicle crash data to identify key contributing factors associated with motorist fatalities.

Extracts "Contributing Factor Vehicle 1" and "Number of Motorist Killed"

Emits key-value pairs:

Key = Contributing

Value = Number of Motorists Killed

```
import ...
public class CrashMapper extends MapReduceBase implements Mapper<LongWritable, Text, Text, IntWritable> { 1usage
    private boolean isHeader = true;
    private int killedIndex = -1; 4 usages
    private int factorIndex = -1; 4 usages
    public void map(LongWritable key, Text value, OutputCollector<Text, IntWritable> output, Reporter reporter) throws IOException {
        String line = value.toString();
        String[] fields = line.split( regex: ",(?=(?:[^*]*)",*[^*]*", | limit: -1); // CSV-safe
        if (isHeader) {
            for (int \underline{i} = 0; \underline{i} < fields.length; \underline{i}++) {
                String col = fields[i].trim().toUpperCase();
                } else if (col.equals("CONTRIBUTING FACTOR VEHICLE 1")) {
        if (killedIndex != -1 && factorIndex != -1 && fields.length > Math.max(killedIndex, factorIndex)) {
                String killedStr = fields[killedIndex].trim();
                String factor = fields[factorIndex].trim();
                int killed = Integer.parseInt(killedStr.isEmpty() ? "0" : killedStr);
                if (!factor.isEmpty() && !factor.equalsIgnoreCase( anotherString: "Unspecified")) {
                    output.collect(new Text(factor), new IntWritable(killed));
            } catch (NumberFormatException e) {
                 // skip malformed rows
```

Reducer Class

```
/♠ Dr. Price
        // Description:
        // aggregates the number of motorist fatalities based on the contributing
        // factor for each vehicle involved in a crash. It sums the total number of
        // of which factors are associated with the most fatalities.
       > import ...
        // Reducer class: receives (key, list of values) and outputs (key, aggregated value)
        public class CrashReducer extends MapReduceBase implements Reducer<Text, IntWritable, Text, IntWritable> { 2usages
28 @ @
            public void reduce(Text key, Iterator<IntWritable> values, OutputCollector<Text, IntWritable> output, Reporter reporter)
                    throws IOException {
                int totalDeaths = 0;
                while (values.hasNext()) {
                    totalDeaths += values.next().get();
                output.collect(key, new IntWritable(totalDeaths));
```

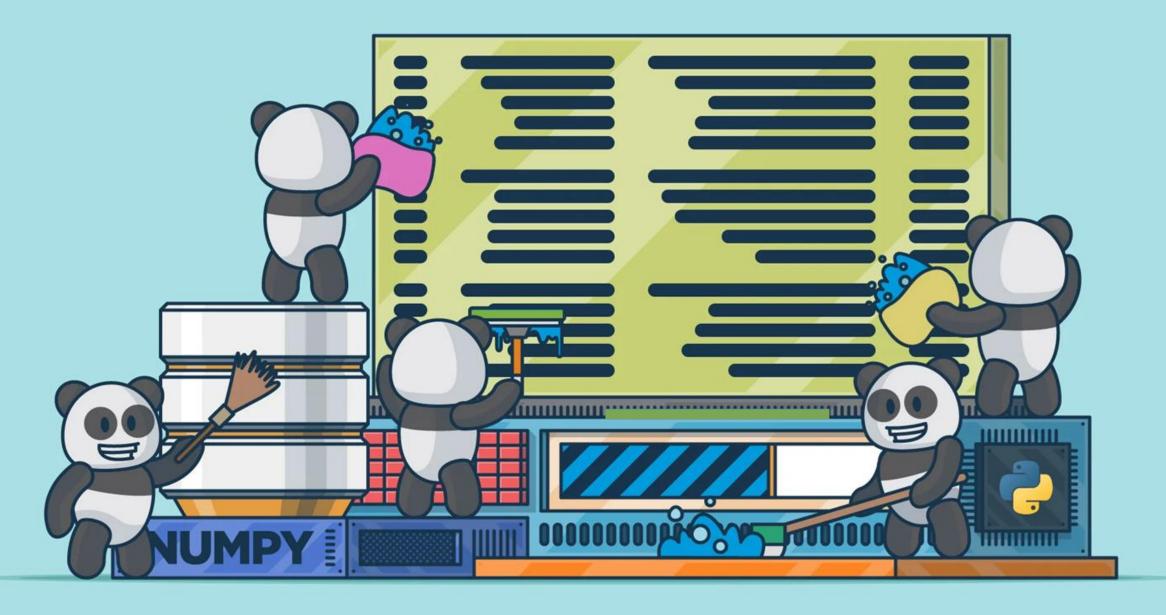
Driver Class

```
/♠ Dr. Price
       public class CrashDriver {
           public static void main(String[] args) throws Exception {
25 ⊳@
               if (args.length != 2) {
                   System.err.println("Usage: CrashDriver <input path> <output path>");
                   System.exit( status: -1);
               JobConf conf = new JobConf(CrashDriver.class);
               conf.setJobName("Motorist Killed by Contributing Factor");
               conf.setMapperClass(CrashMapper.class);
               conf.setReducerClass(CrashReducer.class);
               conf.setCombinerClass(CrashReducer.class);
               conf.setOutputKeyClass(Text.class);
               conf.setOutputValueClass(IntWritable.class);
               conf.setInputFormat(TextInputFormat.class);
               conf.setOutputFormat(TextOutputFormat.class);
               FileInputFormat.setInputPaths(conf, new Path(args[θ]));
               FileOutputFormat.setOutputPαth(conf, new Path(args[1]));
               JobClient.runJob(conf);
```

```
data@4860-01:/home/hadoop$ bin/hdfs dfs -ls CrashOutput
Found 2 items
-rw-r--r-- 1 data supergroup
                                       0 2025-04-09 18:18 CrashOutput/_SUCCESS
-rw-r--r-- 1 data supergroup
                                    1312 2025-04-09 18:18 CrashOutput/part-0000
data@4860-01:/home/hadoop$ bin/hdfs dfs -copyToLocal CrashOutput/part-00000 cras
h.txt
data@4860-01:/home/hadoop$ cat crash.txt
Accelerator Defective
Aggressive Driving/Road Rage
Alcohol Involvement
Animals Action 0
Backing Unsafely
Brakes Defective
Cell Phone (hand-Held) 0
Cell Phone (hands-free) 0
Driver Inattention/Distraction 76
Driver Inexperience
Driverless/Runaway Vehicle
Drugs (illegal) 3
Eating or Drinking
Failure to Keep Right
Failure to Yield Right-of-Way
                               28
Fatigued/Drowsy 0
Fell Asleep
Following Too Closely
Glare 1
Headlights Defective
Illnes 40
Lane Marking Improper/Inadequate
Listening/Using Headphones
Lost Consciousness
```

ulwal-al-a - uata supergroup 0 2025-04-09 10.10 crasiloutput

Hadoop Output



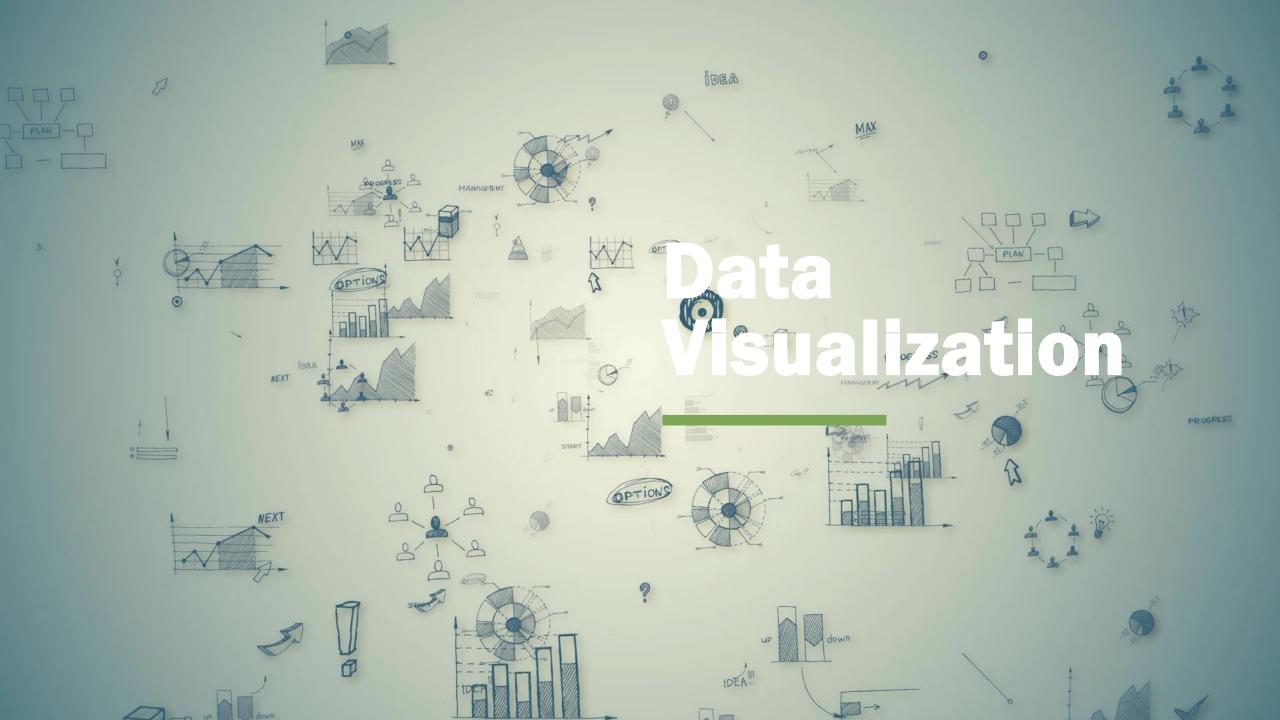
Cleaning the data

Real Python

Pandas Data Cleaning

In order to properly clean my data and ensure that there weren't any blank fields in my dataset, I used pandas to

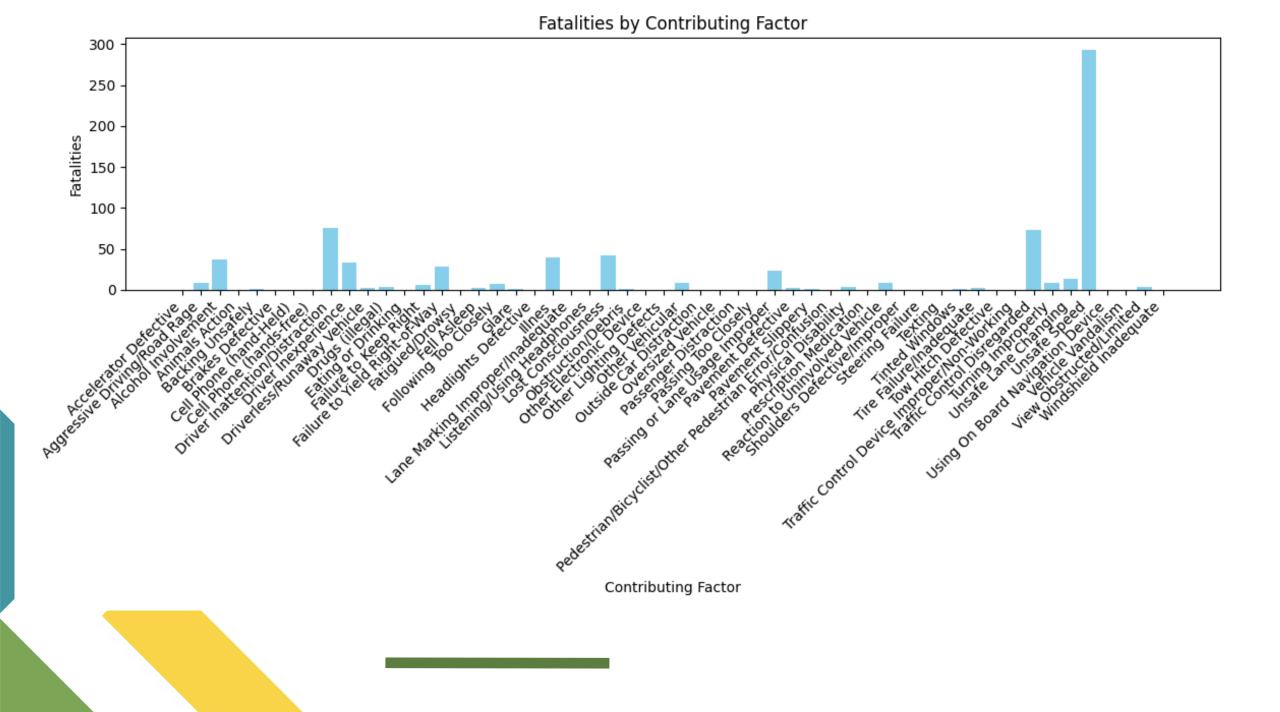
```
# Data Intensive Fundamentals
import pandas as pd
replacement_value = "Unspecified"
column_name = "CONTRIBUTING FACTOR VEHICLE 2"
column_name2 = "CONTRIBUTING FACTOR VEHICLE 1"
df = pd.read_csv("Motor_Crash_Collisions_InitialData.csv")
df[[column_name, column_name2]] = df[[column_name, column_name2]].replace(
    to_replace=["", pd.NA, None, float('nan')], value=replacement_value
df[[column_name, column_name2]] = df[[column_name, column_name2]].fillna(replacement_value)
df.to_csv( path_or_buf: 'Motor_Crash_Collisions_InitialData_cleaned.csv', index=False)
```



Data Visualization.py

To better convey the information extracted from the dataset, matplotlib was used to visualize the data.

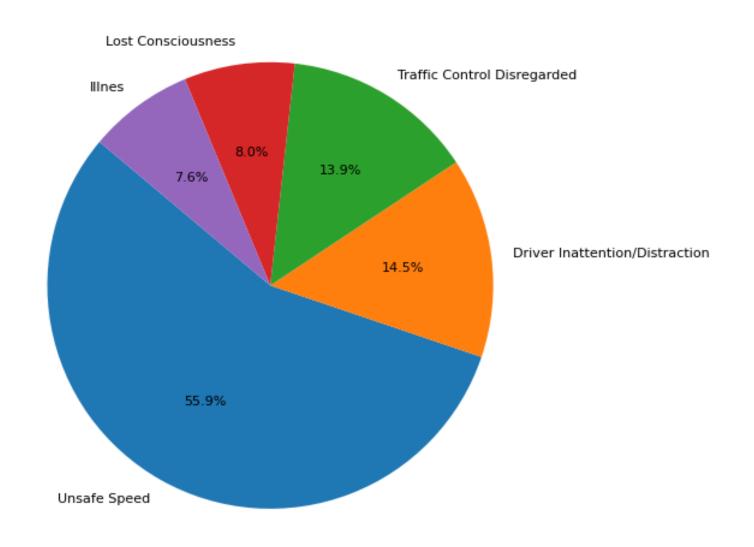
```
DataProcessing.py
                      Property Data Visualization.py × ☐ CrashOutput
                                                                 Data
       import matplotlib.pyplot as plt
      data = {}
       with open("CrashOutput") as f:
           for line in f:
               parts = line.strip().split()
               if len(parts) >= 2:
                   # The last part is the value
                   value = int(parts[-1])
                   # Everything before that is the key (join with space
                   key = " ".join(parts[:-1])
                   data[key] = value
       # Plotting
       plt.figure(figsize=(12, 6)) # Optional: makes the plot wider
       plt.bar(data.keys(), data.values(), color='skyblue')
       plt.xlabel('Contributing Factor')
       plt.ylabel('Fatalities')
       plt.title('Fatalities by Contributing Factor')
       plt.xticks(rotation=45, ha='right') # Tilt labels for readabil
      plt.tight_layout()
       plt.show()
```



Pie Chart

```
# Creating a pie chart of the top 5 contributing factors
top_5 = dict(sorted(data.items(), key=lambda item: item[1], reverse=True)[:5])
plt.figure(figsize=(6, 6))
plt.title('Top 5 Contributing Factors by Fatalities')
plt.pie(
    top_5.values(),
    labels=top_5.keys(),
    autopct='%1.1f%%',
    textprops={'fontsize': 8},
    startangle=140
plt.axis('equal')
plt.tight_layout()
plt.show()
```

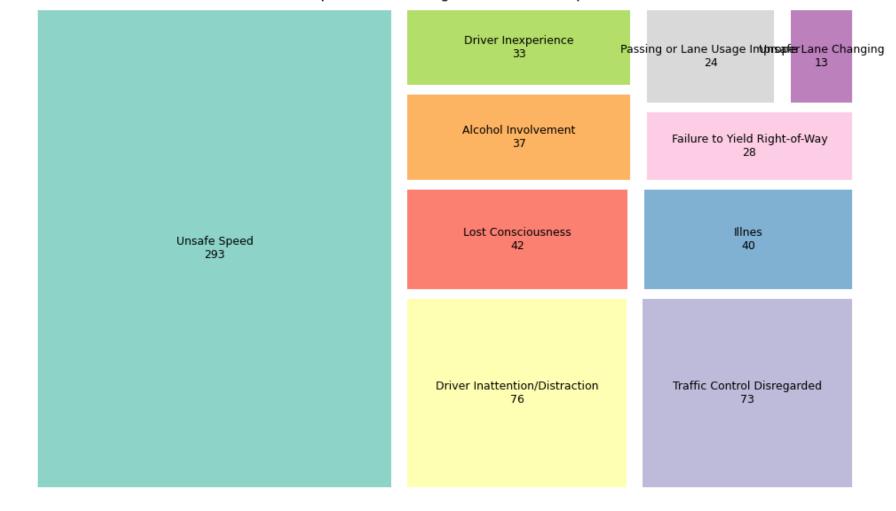
Top 5 Contributing Factors by Fatalities



Tree Map

```
# Tree Map
# Sort data and select top 10
top_items = dict(sorted(data.items(), key=lambda item: item[1], reverse=True)[:10])
sizes = list(top_items.values())
labels = [f'{k}\n{v}' for k, v in top_items.items()]
# Plot treemap
plt.figure(figsize=(10, 6))
squarify.plot(
    sizes=sizes,
    label=labels,
    color=plt.cm.Set3.colors,
    pad=True,
    text_kwargs={'fontsize': 9}
plt.title('Top 10 Contributing Factors - Treemap')
plt.axis('off')
plt.tight_layout()
plt.show()
```

Top 10 Contributing Factors - Treemap



- 1. Unsafe Speeds is concerningly high
- 2. Hypothesis was not too off
- 3. Illness is one of the top 5 leading causes in motor accident fatalities?



Analysis

Conclusion

Although the hypothesis of distracted driving being the leading cause of death in motor collisions was incorrect, with unsafe speed taking first place. Distracted driving was still the second highest contributing factor in motor collision fatalities.

Thankyoul

- Adis Mahmic
- https://github.com/AdisMahmic/ Motor-Vehicle-Collisions

Citations

- https://www.ibm.com/think/topics/mapreduce
- https://github.com/AdisMahmic/Motor-Vehicle-Collisions