Variable Investigation for

KELOWNA WEATHER-CRASH PROJECT

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1 Summary Statistics

Need to remove dew point temp and wind chill, since they are so correlated with temperature.

Temp...C. Dew.Point.Temp...C. Wind.Chill
Temp...C. 1.0000000 0.9209662 0.9517406
Dew.Point.Temp...C. 0.9209662 1.0000000 0.9312014
Wind.Chill 0.9517406 0.9312014 1.0000000

Summary of all variables:

linker Date.Of.Loss.Year Animal.Flag Crash.Severity Length: 56136 No :54118 Min. :2017 CASUALTY CRASH :11473 Class : character 1st Qu.:2018 Yes: 2018 PROPERTY DAMAGE ONLY:44663 Mode :character Median:2019 Mean :2019 3rd Qu.:2020 Max. :2021

Cyclist.Flag Day.Of.Week Derived.Crash.Configuration No :55725 FRIDAY :9316 REAR END :13024 Yes: 411 MONDAY :8024 SINGLE VEHICLE :12495 SATURDAY:6753 UNDETERMINED :11453 SUNDAY :5464 SIDE IMPACT :11369 THURSDAY:9061 CONFLICTED : 3068 TUESDAY :8728 SIDE SWIPE - SAME DIRECTION: 1833 WEDNESDAY:8790 (Other) : 2894

Heavy.Veh.Flag Intersection.Crash Month.Of.Year Motorcycle.Flag

No:54085 No:31677 JULY: 5152 No:55673 Yes: 2051 Yes:24459 DECEMBER: 5095 Yes: 463

> JANUARY : 5063 AUGUST : 4907 OCTOBER : 4836 JUNE : 4735 (Other) :26348

 Parked.Vehicle.Flag
 Parking.Lot.Flag
 Pedestrian.Flag
 Time.Category

 No :38567
 No :37189
 No :55790
 12:00-14:59:14870

 Yes:17569
 Yes:18947
 Yes: 346
 15:00-17:59:14473

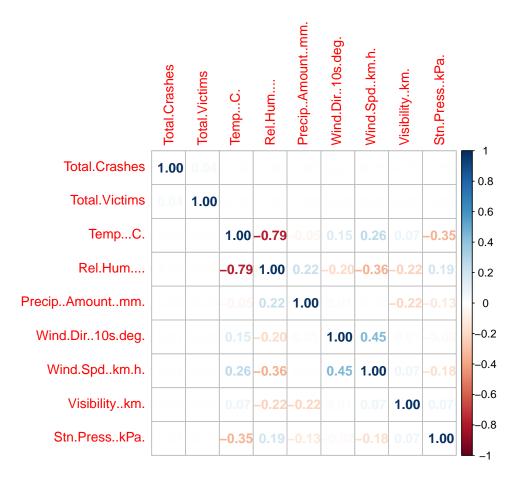
09:00-11:59:11021 18:00-20:59: 5805 06:00-08:59: 5489 21:00-23:59: 2684 (Other) : 1794

Municipality.Name Road.Location.Description Street.Full.Name

:45943 : 6019 KELOWNA UNKNOWN : 2211 HWY 97 WEST KELOWNA: 10193 HWY 97 : 1961 HARVEY AVE : 3168 HARVEY AVE : 1670 HWY 33 : 2064 LAKESHORE RD: 932 GORDON DR : 1921 LOUIE DR : 751 LAKESHORE RD : 1372 HWY 33 715 SPRINGFIELD RD: 1326 :40266 (Other) :47896 (Other)

3 2023

Total.Crashes	Total.Victims	TempC.	Rel.Hum	
Min. :1.000	Min. :0.0000	Min. :-22.43	Min. : 12.67	
1st Qu.:1.000	1st Qu.:0.0000	1st Qu.: 1.60	1st Qu.: 38.00	
Median :1.000	Median :0.0000	Median : 10.37	Median : 62.00	
Mean :1.006	Mean :0.2917	Mean : 10.92	Mean : 60.51	
3rd Qu.:1.000	3rd Qu.:0.0000	3rd Qu.: 20.00	3rd Qu.: 82.33	
Max. :3.000	Max. :9.0000	Max. : 37.73	Max. :100.00	
		NA's :35	NA's :35	
PrecipAmount.	.mm. Wind.Dir10	Os.deg. Wind.Spd.	.km.h. Visibility.	.km.
Min. : 0.0000	O Min. : 1.0	00 Min. :	0.000 Min. : 0.2	20
1st Qu.: 0.0000	0 1st Qu.:15.6	37 1st Qu.:	4.667 1st Qu.:16.3	10
Median : 0.0000	0 Median :19.5	Median:	8.000 Median :16.1	10
Mean : 0.0932	7 Mean :21.1	l6 Mean :1	0.277 Mean :15.1	15
3rd Qu.: 0.0000	0 3rd Qu.:31.0	00 3rd Qu.:1	3.667 3rd Qu.:16.3	10
Max. :12.0000	0 Max. :36.0	00 Max. :5	1.333 Max. :16.3	10
	NA's :4020	NA's :3	5 NA's :36	
Stn.PresskPa.	Fog Freezi	ing.Rain Snow	Rain Thunders	storms
Min. :94.08	0:52106 0:5613	0:52325	0:50075 0:56002	
1st Qu.:96.10	1: 4030 1:	2 1: 3811	1: 6061 1: 134	
Median :96.51				
Mean :96.56				
3rd Qu.:96.90				
Max. :99.33				



NA's

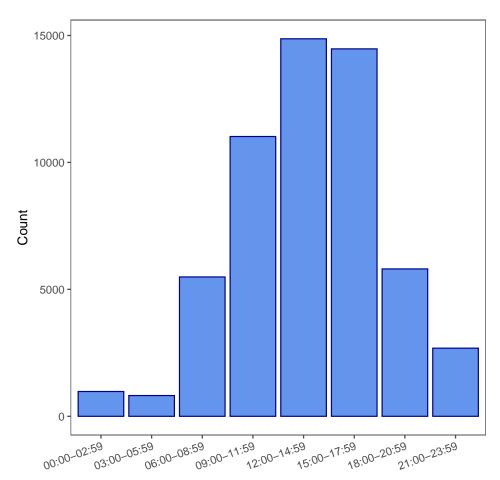
:35

4 2023

2 Accidents over Time

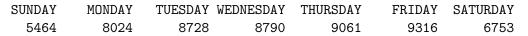
2.1 Throughout the Day

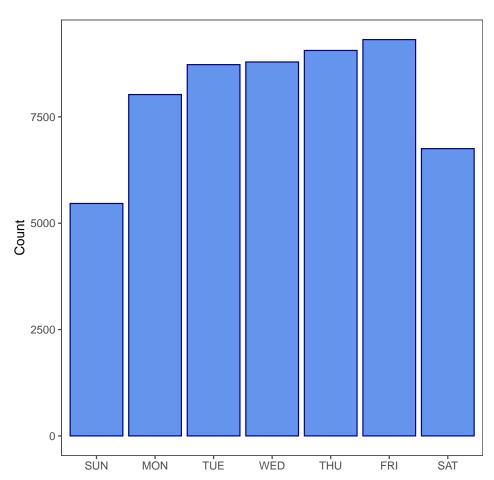
00:00-02:59 03:00-05:59 06:00-08:59 09:00-11:59 12:00-14:59 15:00-17:59 977 817 5489 11021 14870 14473 18:00-20:59 21:00-23:59 5805 2684



2.2 Day of the Week

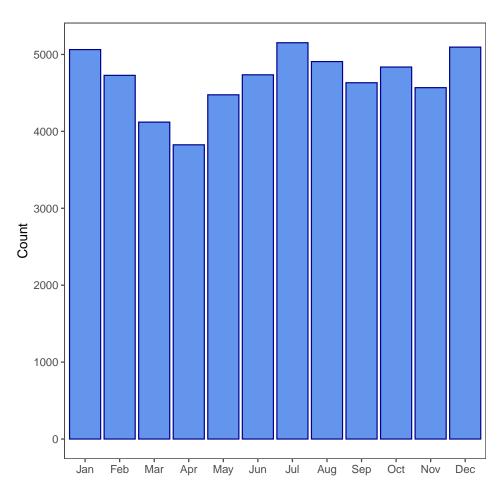
Distribution of accidents throughout the week:





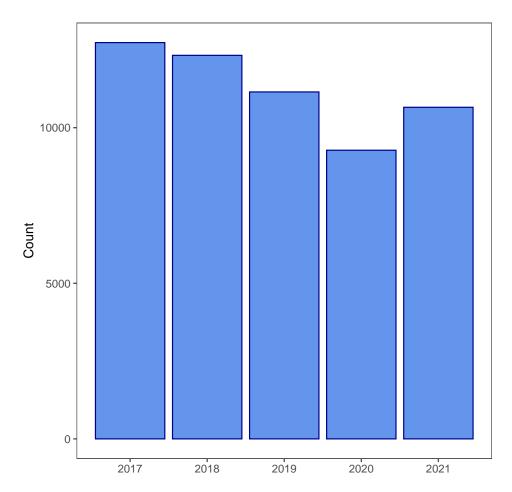
2.3 Month of the Year

JANUARY	FEBRUARY	MARCH	APRIL	MAY	JUNE	JULY	AUGUST
5063	4728	4120	3825	4475	4735	5152	4907
SEPTEMBER	OCTOBER	NOVEMBER	DECEMBER				
4632	4836	4568	5095				



2.4 Over the Years

2017 2018 2019 2020 2021 12734 12324 11148 9275 10655

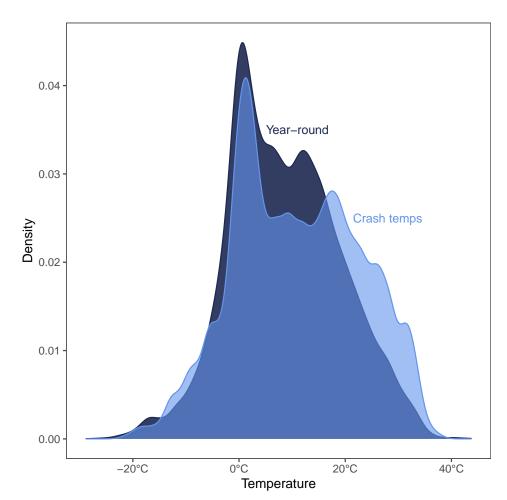


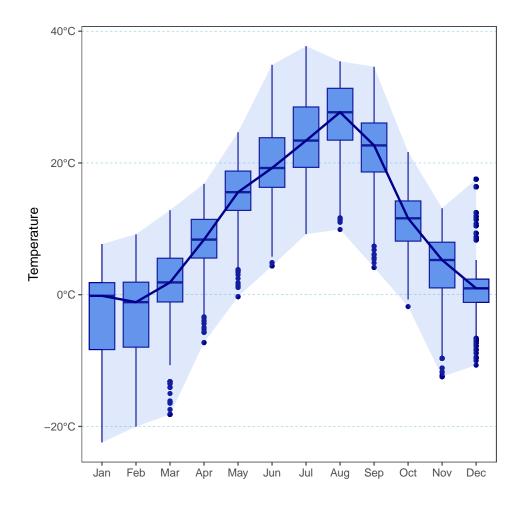
 $\begin{array}{c} {\rm Jonah~Edmundson} \\ 8 \end{array}$

3 Distributions of Weather Variables

3.1 Temperature

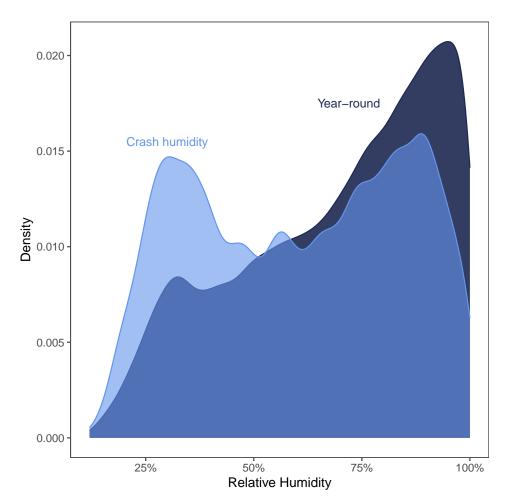
Avg.temp. Avg.crash.temp. 1 8.511442 10.91872

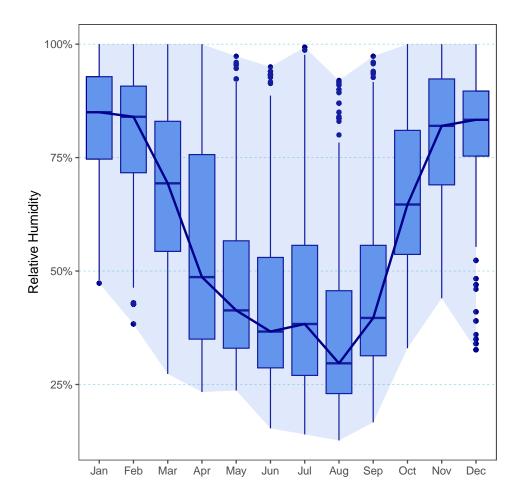




3.2 Relative Humidity

Avg.humidity Avg.crash.humidity 69.32555 60.50743





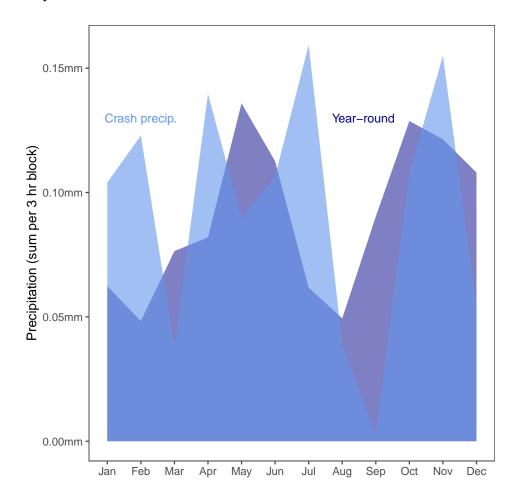
3.3 Precipitation

Avg.precipitation Avg.crash.precipitation 1 0.08996575 0.09326635

Rounded table of precipitation values:

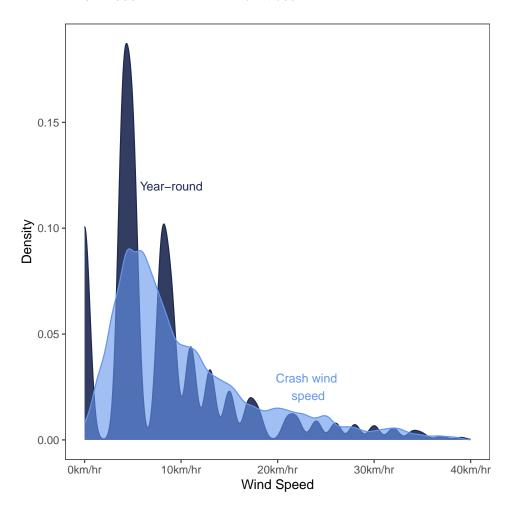
53658 1174

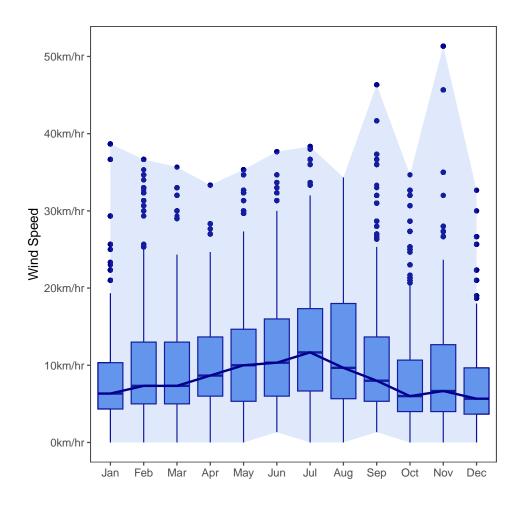
Many are 0...



3.4 Wind Speed

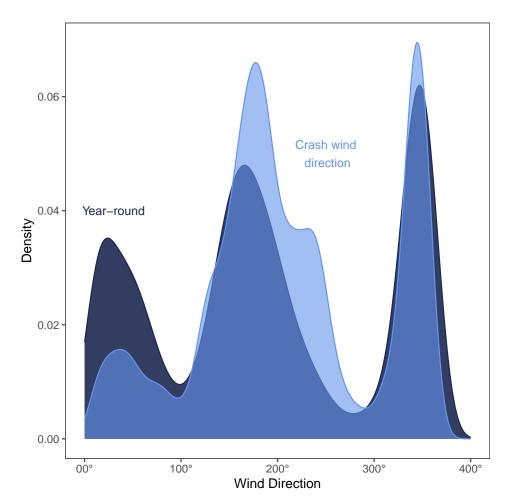
Avg.wind.speed Avg.crash.wind.speed 1 8.41538 10.27689

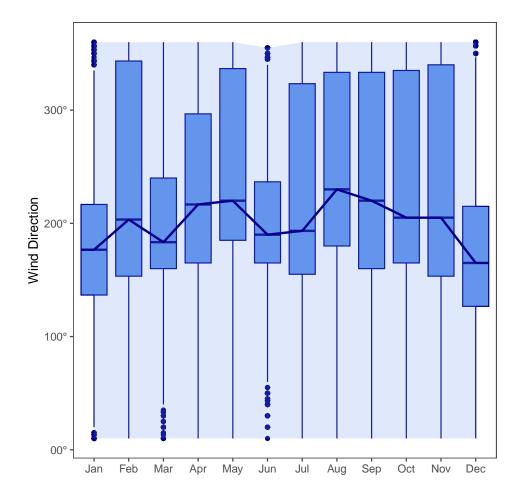




3.5 Wind Direction

Avg.wind.dir. Avg.crash.wind.dir.
1 19.1302 21.163



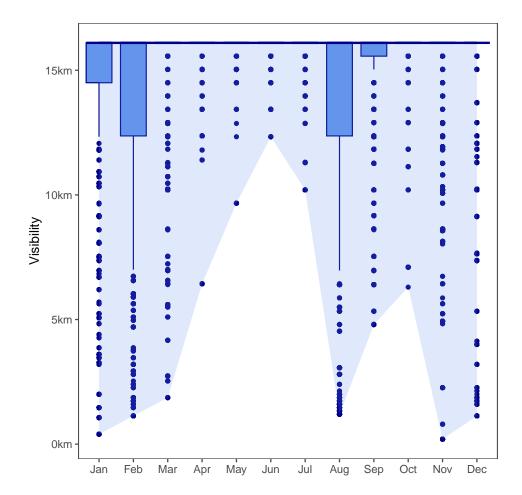


3.6 Visibility

Avg.visibility Avg.crash.visibility 1 15.10429 15.14964

Very little differences in visibility...

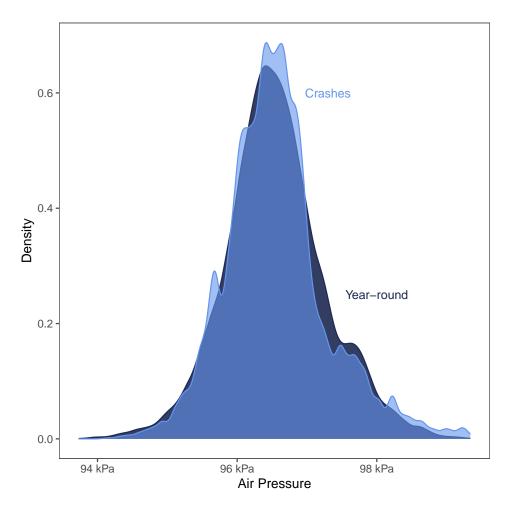
Density plot isn't helpful because cases are so spread out.



18 2023

3.7 Air Pressure

Avg.air.pressure Avg.crash.air.pressure 1 96.55096 96.56156



4 Crash Subtypes

4.1 All Combined

19

Number of crashes: 56136

Number of intersection crashes: 24459 (43.6%)

Number of casualty crashes: 11473 (20.4%)

Top 5 most common streets:

 HWY 97
 HARVEY AVE
 HWY 33
 GORDON DR LAKESHORE RD

 6019
 3168
 2064
 1921
 1372

Avg. victims per year: 3275

Months of the year: (same as above)

JANUARY FEBRUARY MARCH APRIL MAY JUNE JULY AUGUST 5063 4728 4120 3825 4475 4735 5152 4907 SEPTEMBER OCTOBER NOVEMBER DECEMBER

4632 4836 4568 5095

Days of the week: (same as above)

SUNDAY MONDAY TUESDAY WEDNESDAY THURSDAY FRIDAY SATURDAY 5464 8024 8728 8790 9061 9316 6753

Avg. Temperature: (same as above)

Avg.temp. Avg.crash.temp. 1 8.511442 10.91872

Avg Relative Humidity: (same as above)

Avg.humidity Avg.crash.humidity 1 69.32555 60.50743

Avg. Precipitation Amount (mm): (same as above)

Avg.precipitation Avg.crash.precipitation 1 0.08996575 0.09326635

20

Avg. Wind Speed (km/h): (same as above)

Avg.wind.speed Avg.crash.wind.speed 1 8.41538 10.27689

Avg. Visibility (km): (same as above)

Avg.visibility Avg.crash.visibility 1 15.10429 15.14964

Top 5 Most Common Crash Types:

REAR END SINGLE VEHICLE UNDETERMINED SIDE IMPACT CONFLICTED 13024 12495 11453 11369 3068

21 2023

4.2 Cyclist	Crashes
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Number of crashes: 411

Number of intersection crashes: 328 (79.8%)

Number of casualty crashes: 332 (80.8%)

Top 5 most common streets:

GORDON DR LAKESHORE RD HWY 97 BERNARD AVE HWY 33 40 23 21 19 18

Avg. victims per year: 72

Months of the year:

FEBRUARY	MARCH	APRIL	MAY	JUNE	JULY	AUGUST
11	18	24	45	48	53	68
OCTOBER	NOVEMBER	DECEMBER				
36	30	16				
	11 OCTOBER	11 18 OCTOBER NOVEMBER	11 18 24 OCTOBER NOVEMBER DECEMBER	11 18 24 45 OCTOBER NOVEMBER DECEMBER	11 18 24 45 48 OCTOBER NOVEMBER DECEMBER	11 18 24 45 48 53 OCTOBER NOVEMBER DECEMBER

Days of the week:

SUNDAY	MONDAY	TUESDAY	WEDNESDAY	THURSDAY	FRIDAY	SATURDAY
32	52	78	75	65	78	31

. _

Avg. Temperature:

Avg.temp. Avg.crash.temp. Avg.cyclist.crash.temp.
1 8.511442 10.91872 17.02561

Avg Relative Humidity:

Avg.humidity Avg.crash.humidity Avg.cyclist.crash.humidity 69.32555 60.50743 50.07967

Avg. Precipitation Amount (mm):

Avg.precipitation Avg.crash.precipitation Avg.cyclist.crash.precipitation 0.02998858 0.2797991 0.08126521

Avg. Wind Speed (km/h):

22 2023

Avg.wind.speed Avg.crash.wind.speed Avg.cyclist.crash.wind.speed 1 8.41538 10.27689 10.45772 _____ Avg. Visibility (km): Avg.visibility Avg.crash.visibility Avg.cyclist.crash.visibility 1 15.10429 15.14964 15.40862 _____ Top 5 Most Common Crash Types: SINGLE VEHICLE UNDETERMINED 318 SIDE IMPACT SIDE SWIPE - SAME DIRECTION 21 1 CONFLICTED

4 0	A • 1	α 1
4.3	Anımal	Crashes
4.0	Aiiiiiai	Crasnes

Number of crashes: 2018

Number of intersection crashes: 686 (34%)

Number of casualty crashes: 130 (6.4%)

Top 5 most common streets:

HWY 97 HWY 33 WESTSIDE RD LAKESHORE RD BOUCHERIE RD 366 272 194 71 52

Avg. victims per year: 30

Months of the year:

JUNE JANUARY FEBRUARY MARCH APRIL MAY JULY AUGUST 127 152 152 135 153 126 143 158 SEPTEMBER OCTOBER NOVEMBER DECEMBER 182 257 280 153

Days of the week:

SUNDAY MONDAY TUESDAY WEDNESDAY THURSDAY FRIDAY SATURDAY 244 307 284 312 303 329 239

Avg. Temperature:

Avg.temp. Avg.crash.temp. Avg.animal.crash.temp.
1 8.511442 10.91872 8.280433

Avg Relative Humidity:

Avg.humidity Avg.crash.humidity Avg.animal.crash.humidity 1 69.32555 60.50743 70.59081

Avg. Precipitation Amount (mm):

Avg.precipitation Avg.crash.precipitation Avg.animal.crash.precipitation 0.08996575 0.09326635 0.08062438

Avg. Wind Speed (km/h):

24 2023

SINGLE VEHICLE UNDETERMINED REAR END SIDE IMPACT CONFLICTED 2005 7 3 2 1

Number of crashes: 2051

Number of intersection crashes: 932 (45.4%)

Number of casualty crashes: 365 (17.8%)

Top 5 most common streets:

HWY 97 HWY 33 HARVEY AVE HWY 97 N GORDON DR 310 77 73 58 47

Avg. victims per year: 100

Months of the woor

Months of the year:

JANUARY FEBRUARY MARCH APRIL MAY JUNE JULY AUGUST 157 197 187 173 145 116 182 181 SEPTEMBER OCTOBER NOVEMBER DECEMBER 185 170 184 174

Days of the week:

SUNDAY MONDAY TUESDAY WEDNESDAY THURSDAY FRIDAY SATURDAY 56 370 378 365 380 402 100

Avg. Temperature:

Avg.temp. Avg.crash.temp. Avg.heavy.crash.temp. 1 8.511442 10.91872 10.61056

Avg Relative Humidity:

Avg.humidity Avg.crash.humidity Avg.heavy.crash.humidity 1 69.32555 60.50743 61.85107

Avg. Precipitation Amount (mm):

Avg.precipitation Avg.crash.precipitation Avg.heavy.crash.precipitation 0.08996575 0.09326635 0.09780595

Avg. Wind Speed (km/h):

26 2023

Avg.wind.speed Avg.crash.wind.speed Avg.heavy.crash.wind.speed 1 8.41538 10.27689 9.744303

Avg. Visibility (km):

Avg.visibility Avg.crash.visibility Avg.heavy.crash.visibility 1 15.10429 15.14964 15.04907

Top 5 Most Common Crash Types:

UNDETERMINED SIDE IMPACT REAR END SINGLE VEHICLE CONFLICTED 546 422 392 330 137

4.5 Motorcycle Crashes									
Number of crashes: 463									
Number of intersection crashes: 288 (62.2%)									
Number of casualty crashes: 275 (59.4%)									
Top 5 most common streets:									
HWY 97 HARVEY AVE HWY 33 WESTSIDE RD KLO RD 67 22 20 13 11									
Avg. victims per year: 66									
Months of the year:									
JANUARY FEBRUARY MARCH APRIL MAY JUNE JULY AUGUST 0 4 17 43 51 71 97 71 SEPTEMBER OCTOBER NOVEMBER DECEMBER 61 39 9 0									
Days of the week:									
SUNDAY MONDAY TUESDAY WEDNESDAY THURSDAY FRIDAY SATURDAY 65 49 58 57 69 90 75									
Avg. Temperature:									

Avg.temp. Avg.crash.temp. Avg.motorcycle.crash.temp. 1 8.511442 10.91872 19.28287

Avg Relative Humidity:

Avg.humidity Avg.crash.humidity Avg.motorcycle.crash.humidity 69.32555 60.50743 45.53852

Avg. Precipitation Amount (mm):

Avg.precipitation Avg.crash.precipitation Avg.motorcycle.crash.precipitation 1 0.08996575 0.09326635 0.0762419

Avg. Wind Speed (km/h):

28 2023

Avg.wind.speed Avg.crash.wind.speed Avg.motorcycle.crash.wind.speed 1 8.41538 10.27689 11.33549

Avg. Visibility (km):

Avg.visibility Avg.crash.visibility Avg.motorcycle.crash.visibility 1 15.10429 15.14964 15.54327

Top 5 Most Common Crash Types:

SIDE IMPACT SINGLE VEHICLE REAR END UNDETERMINED CONFLICTED 111 102 101 86 38

29

46	Parke	$d \mathbf{V}$	ehic	le C	rashes

Number of crashes: 17569

Number of intersection crashes: 2790 (15.9%)

Number of casualty crashes: 353 (2%)

Top 5 most common streets:

HARVEY AVE HWY 97 LAKESHORE RD LOUIE DR GORDON DR 1221 760 520 473 446

Avg. victims per year: 92

1487

Months of the year:

JANUARY FEBRUARY MARCH APRIL MAY JUNE JULY AUGUST 1589 1415 1369 1271 1439 1566 1629 1607 SEPTEMBER OCTOBER NOVEMBER DECEMBER

1449

Days of the week:

SUNDAY MONDAY TUESDAY WEDNESDAY THURSDAY FRIDAY SATURDAY 1948 2518 2615 2649 2664 2780 2395

1432

Avg. Temperature:

Avg.temp. Avg.crash.temp. Avg.parked.crash.temp.
1 8.511442 10.91872 11.32006

1316

Avg Relative Humidity:

Avg.humidity Avg.crash.humidity Avg.parked.crash.humidity 1 69.32555 60.50743 59.20128

Avg. Precipitation Amount (mm):

Avg.precipitation Avg.crash.precipitation Avg.parked.crash.precipitation 0.08996575 0.09326635 0.08685184

Avg. Wind Speed (km/h):

Avg.wind.speed Avg.crash.wind.speed Avg.parked.crash.wind.speed 1 8.41538 10.27689 10.38783

30

Avg. Visibility (km):

Avg.visibility Avg.crash.visibility Avg.parked.crash.visibility 1 15.10429 15.14964 15.1956

Top 5 Most Common Crash Types:

UNDETERMINED SIDE IMPACT
7156 5519
REAR END CONFLICTED
1501 852

SIDE SWIPE - SAME DIRECTION

31 2023

4 💆	TD 1 / *	α 1
4.7	Pedestrian	Crasnes

Number of crashes: 346

Number of intersection crashes: 220 (63.6%)

Number of casualty crashes: 289 (83.5%)

Top 5 most common streets:

HARVEY AVE GORDON DR HWY 97 HWY 33 BANKS RD 26 22 22 12 11

Avg. victims per year: 69

Months of the year:

JANUARY	FEBRUARY	MARCH	APRIL	MAY	JUNE	JULY	AUGUST
35	13	21	19	27	28	28	32
SEPTEMBER	OCTOBER	NOVEMBER	DECEMBER				
34	40	33	36				

Days of the week:

SUNDAY MONDAY TUESDAY WEDNESDAY THURSDAY FRIDAY SATURDAY 33 44 39 66 57 65 42

Avg. Temperature:

Avg.temp. Avg.crash.temp. Avg.pedestrian.crash.temp. 1 8.511442 10.91872 10.77013

Avg Relative Humidity:

Avg.humidity Avg.crash.humidity Avg.pedestrian.crash.humidity 1 69.32555 60.50743 63.38247

Avg. Precipitation Amount (mm):

Avg.precipitation Avg.crash.precipitation Avg.pedestrian.crash.precipitation 0.08996575 0.09326635 0.09364162

Avg. Wind Speed (km/h):

Avg.wind.speed Avg.crash.wind.speed Avg.pedestrian.crash.wind.speed 8.41538 10.27689 9.628131 _____ Avg. Visibility (km): Avg.visibility Avg.crash.visibility Avg.pedestrian.crash.visibility 1 15.10429 15.14964 15.20434 _____

Top 5 Most Common Crash Types:

SINGLE VEHICLE UNDETERMINED SIDE IMPACT CONFLICTED REAR END 273 53 5 4

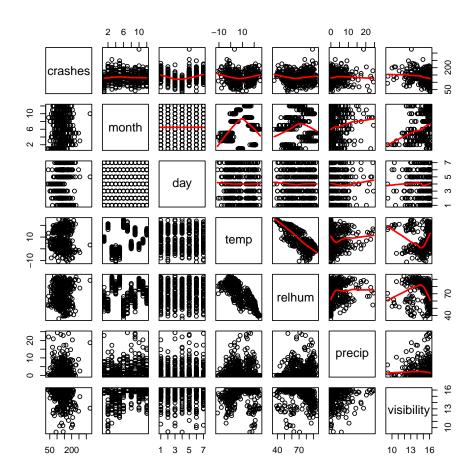
5 Regression/Neural Network Dataset

As opposed to linking the weather to each crash, this dataset links (some) crash data to the weather on each individual day (ie. the reverse). This is desirable if we want to predict the # of crashes and # of victims per day based on weather conditions.

Notice that rows are a bit weird/unintuitive for this dataset. Each row is a unique weekday in each month, and so actually represents the sum of all of these weekdays (ex. Fridays in October, Mondays in December, etc.). This is the case because the crash dataset was anonymized.

Variables:

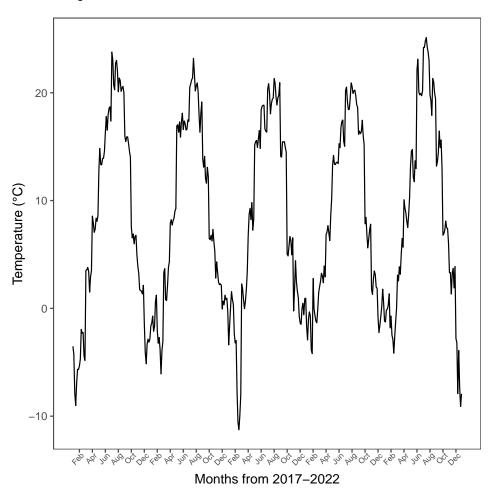
[1]	"linker"	"month"	"day"	"temp"	"relhum"
[6]	"precip"	"wind.dir"	"wind.spd"	"visibility"	"pressure"
[11]	"crashes"	"victims"	"parked"	"HWY97"	"HARVEY"
[16]	"HWY33"	"GORDON"			



34 2023

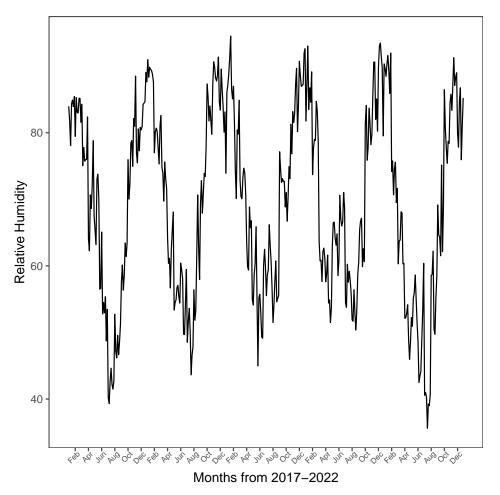
5.1 Weather Variables

5.1.1 Temperature



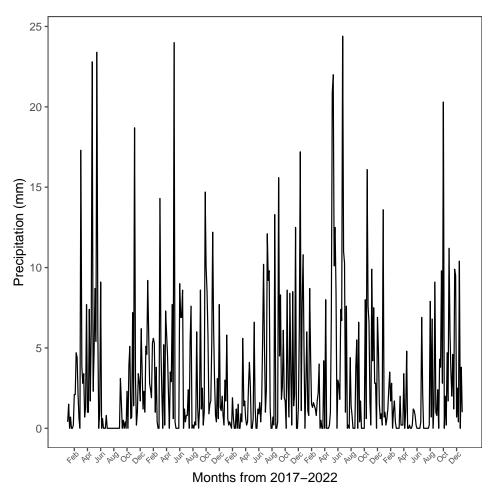
35 2023

5.1.2 Relative Humidity



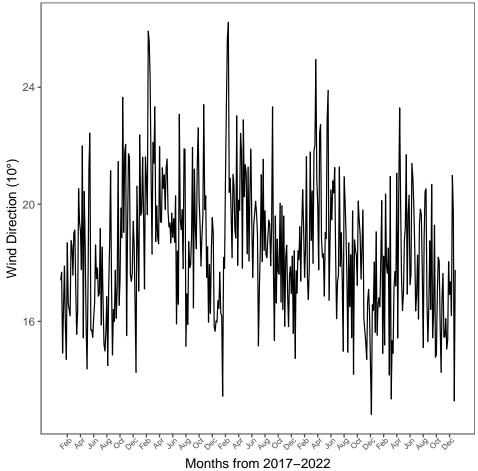
36 2023

5.1.3 Precipitation



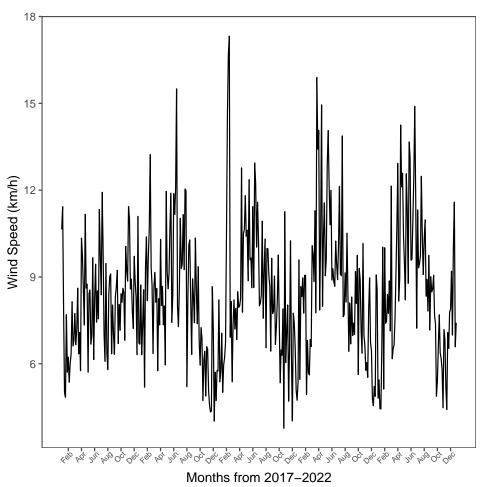
37 2023

5.1.4 Wind Direction



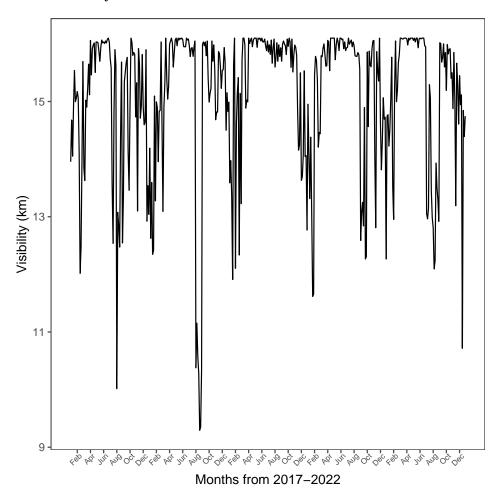
38 2023

5.1.5 Wind Speed



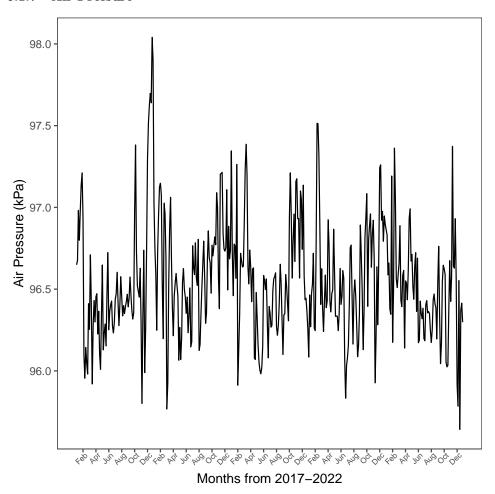
39 2023

5.1.6 Visibility



40 2023

5.1.7 Air Pressure



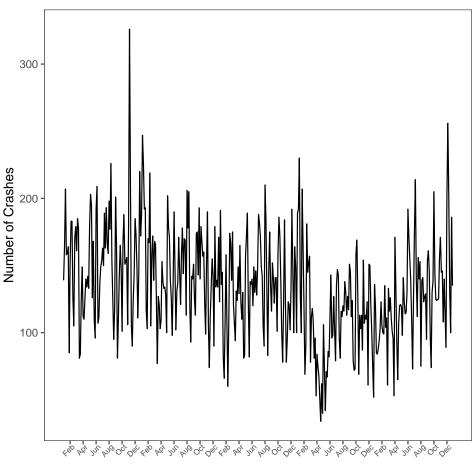
41 2023

5.2 Crash Variables

5.2.1 Number of Crashes

Row with abnormally high number of crashes:

temp relhum precip wind.dir linker monthday 72 2017 NOVEMBER THURSDAY NOVEMBER THURSDAY 3.244167 88.5 18.7 19.20085 wind.spd visibility pressure crashes victims parked HWY97 HARVEY HWY33 72 11.43333 13.09917 95.80075 326 147 70 33 10 21 GORDON



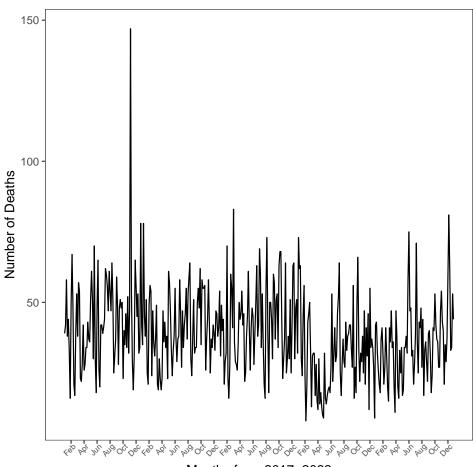
Months from 2017-2022

42 2023

5.2.2 Number of Deaths

Row with abnormally high number of deaths:

linker ${\tt month}$ day temp relhum precip wind.dir 72 2017 NOVEMBER THURSDAY NOVEMBER THURSDAY 3.244167 88.5 18.7 19.20085 wind.spd visibility pressure crashes victims parked HWY97 HARVEY HWY33 72 11.43333 13.09917 95.80075 326 147 70 33 10 GORDON



Months from 2017-2022

5.2.3 Locations

