

# Boat Safety-Sutow Brett

July 28, 2021

```
[3]: #Boat Safety#  
#Setup#  
import pandas as pd  
import numpy as np  
import matplotlib.pyplot as plt  
import seaborn as sns  
import squarify as sq  
import statsmodels.api as sm
```

```
[4]: #Loads Data#  
VesselAccidents= pd.read_csv('/Users/Brett/Desktop/Vessel Type Accidents 2020.  
→csv')  
Factors= pd.read_csv('/Users/Brett/Desktop/2020 Factors for Accident.csv')  
PersonalWaterCraft= pd.read_csv('/Users/Brett/Desktop/watercraft.csv')  
AccidentType= pd.read_csv('/Users/Brett/Desktop/Accident Type Boating Datam2020.  
→csv')  
Accidents2001= pd.read_csv('/Users/Brett/Desktop/Data since 2001.csv')
```

```
[41]: #Prints Heads#  
print(VesselAccidents)  
print(Factors)  
print(PersonalWaterCraft)  
print(AccidentType)  
print(Accidents2001)
```

	Type of Boat	Drownings	Other Deaths	Total Deaths	Total Injuries
0	Open Motorboat	260	116	376	1520
1	Personal Watercraft	19	47	66	896
2	Cabin Motorboat	16	17	33	298
3	Pontoon	53	14	67	232
4	Canoe/Kayak	131	23	154	117
	Crash Reason	Accidents	Deaths	Injuries	
0	Alcohol Use	296	115	260	
1	Drug Use	12	8	2	
2	Excessive Speed	418	32	345	
3	Failure to Vent	54	5	89	
4	Improper Lookout	578	28	409	
5	Inadqueate Onboard Navigation Lights	21	0	16	

6	Navigation Rules Violation	316	26	220
7	Operator Inattention	664	55	383
8	Operator Inexperience	612	56	343
9	Restricted Vision	67	2	47
10	Sharp Turn	67	7	66
11	Starting in Gear	4	0	2

	Year	Fatalities	Injured persons	Accidents	Sales	Number in use
0	1987	5	156	376	29000.0	92756.0
1	1988	20	254	650	48000.0	126881.0
2	1989	20	402	844	64000.0	178510.0
3	1990	28	532	1162	72000.0	241376.0
4	1991	26	708	1513	68000.0	305915.0
5	1992	34	730	1650	79000.0	372283.0
6	1993	35	915	2236	107000.0	454545.0
7	1994	56	1338	3002	142000.0	600000.0
8	1995	68	1617	3986	200000.0	760000.0
9	1996	57	1837	4099	191000.0	900000.0
10	1997	84	1812	4070	176000.0	1000000.0
11	1998	78	1743	3607	130000.0	1180000.0
12	1999	66	1614	3374	106000.0	1200000.0
13	2000	68	1580	3268	92000.0	1230000.0
14	2001	50	1424	2562	80900.0	1220000.0
15	2002	71	1362	2225	79300.0	1220000.0
16	2003	57	1228	1994	80600.0	1170000.0
17	2004	56	952	1664	79500.0	1250000.0
18	2005	65	1007	1692	80200.0	1230000.0
19	2006	68	919	1631	82200.0	1190000.0
20	2007	67	982	1655	79900.0	1190000.0
21	2008	45	920	1459	62600.0	1240000.0
22	2009	42	878	1332	44500.0	1330000.0
23	2010	38	776	1221	41600.0	1270000.0
24	2011	44	764	1158	42900.0	1270000.0
25	2012	58	721	1111	38500.0	1250000.0
26	2013	36	601	954	39400.0	1270000.0
27	2014	34	592	891	47900.0	1200000.0
28	2015	33	623	1023	54900.0	NaN
29	2016	46	675	1072	59000.0	NaN
30	2017	46	624	1028	NaN	NaN
31	2018	42	634	1055	69000.0	NaN
32	2019	46	614	1062	73000.0	NaN

	Accident Type	Number of Accidents	Number of Deaths \
0	Collision with recreational vessel	1379	66
1	Flooding/Swamping	589	84
2	Collision with fixed object	542	62
3	Grounding	484	14
4	Falls overboard	335	181

Number of Injuries

0		831		
1		128		
2		389		
3		255		
4		161		
	Year	Deaths	Injuries	Accidents
0	2001	681	4274	6419
1	2002	750	4062	5705
2	2003	703	3888	5438
3	2004	676	3363	4904
4	2005	697	3451	4969
5	2006	710	3474	4967
6	2007	685	3673	5191
7	2008	709	3331	4789
8	2009	736	3358	4730
9	2010	672	3153	4604
10	2011	758	3081	4588
11	2012	651	3000	4515
12	2013	560	2620	4062
13	2014	610	2678	4064
14	2015	626	2613	4158
15	2016	701	2903	4463
16	2017	658	2629	4291
17	2018	633	2511	4145
18	2019	613	2559	4168
19	2020	767	3191	5265

```
[42]: #Looks at the detailed described information for each dataset#
Accidents2001.describe()
```

```
[42]:
```

	Year	Deaths	Injuries	Accidents
count	20.00000	20.000000	20.000000	20.000000
mean	2010.50000	679.800000	3190.600000	4771.750000
std	5.91608	53.818995	518.517766	612.881449
min	2001.00000	560.000000	2511.000000	4062.000000
25%	2005.75000	646.500000	2665.750000	4260.250000
50%	2010.50000	683.000000	3172.000000	4667.000000
75%	2015.25000	709.250000	3456.750000	5024.500000
max	2020.00000	767.000000	4274.000000	6419.000000

```
[43]: VesselAccidents.describe()
```

```
[43]:
```

	Drownings	Other Deaths	Total Deaths	Total Injuries
count	5.00000	5.000000	5.000000	5.000000
mean	95.80000	43.400000	139.200000	612.600000
std	102.83336	42.606338	139.770168	590.156589
min	16.00000	14.000000	33.000000	117.000000

25%	19.00000	17.000000	66.000000	232.000000
50%	53.00000	23.000000	67.000000	298.000000
75%	131.00000	47.000000	154.000000	896.000000
max	260.00000	116.000000	376.000000	1520.000000

```
[44]: Factors.describe()
```

```
[44]:
```

	Accidents	Deaths	Injuries
count	12.000000	12.000000	12.000000
mean	259.083333	27.833333	181.833333
std	255.614219	33.999554	160.859528
min	4.000000	0.000000	2.000000
25%	45.750000	4.250000	39.250000
50%	181.500000	17.000000	154.500000
75%	458.000000	37.750000	343.500000
max	664.000000	115.000000	409.000000

```
[45]: PersonalWaterCraft.dropna()
PersonalWaterCraft.describe()
```

```
[45]:
```

	Year	Fatalities	Injured persons	Accidents	Sales \
count	33.00000	33.000000	33.000000	33.000000	32.000000
mean	2003.00000	48.151515	955.575758	1837.151515	82496.875000
std	9.66954	18.313453	455.549807	1064.888026	43173.808401
min	1987.00000	5.000000	156.000000	376.000000	29000.000000
25%	1995.00000	35.000000	624.000000	1062.000000	53175.000000
50%	2003.00000	46.000000	878.000000	1513.000000	76000.000000
75%	2011.00000	65.000000	1338.000000	2236.000000	84650.000000
max	2019.00000	84.000000	1837.000000	4099.000000	200000.000000

	Number in use
count	2.800000e+01
mean	9.265095e+05
std	4.308375e+05
min	9.275600e+04
25%	5.636362e+05
50%	1.190000e+06
75%	1.232500e+06
max	1.330000e+06

```
[46]: AccidentType.describe()
```

```
[46]:
```

	Number of Accidents	Number of Deaths	Number of Injuries
count	5.000000	5.000000	5.000000
mean	665.800000	81.400000	352.800000
std	409.987439	61.406840	285.863954
min	335.000000	14.000000	128.000000

25%	484.000000	62.00000	161.000000
50%	542.000000	66.00000	255.000000
75%	589.000000	84.00000	389.000000
max	1379.000000	181.00000	831.000000

```
[47]: #Creates Regression Analysis for deaths since 2001. Provides outlook for the
      ↪ dat we are working with#
```

```
Accidents2001['LogDeaths']= np.log(Accidents2001).Deaths
X1 = Accidents2001.Year
X1 = sm.add_constant(X1)
y1 = Accidents2001.LogDeaths
mod = sm.OLS(y1,X1)
res = mod.fit()
print(res.summary())
```

#### OLS Regression Results

```
=====
Dep. Variable:          LogDeaths    R-squared:                0.125
Model:                  OLS          Adj. R-squared:            0.076
Method:                 Least Squares   F-statistic:              2.564
Date:                  Tue, 27 Jul 2021   Prob (F-statistic):       0.127
Time:                  17:54:47          Log-Likelihood:           23.816
No. Observations:      20              AIC:                    -43.63
Df Residuals:          18              BIC:                    -41.64
Df Model:               1
Covariance Type:       nonrobust
=====
```

	coef	std err	t	P> t	[0.025	0.975]
const	16.1978	6.045	2.680	0.015	3.498	28.898
Year	-0.0048	0.003	-1.601	0.127	-0.011	0.002

```
=====
Omnibus:                 1.733    Durbin-Watson:              1.552
Prob(Omnibus):           0.420    Jarque-Bera (JB):          0.418
Skew:                    0.037    Prob(JB):                  0.811
Kurtosis:                 3.704    Cond. No.                  7.01e+05
=====
```

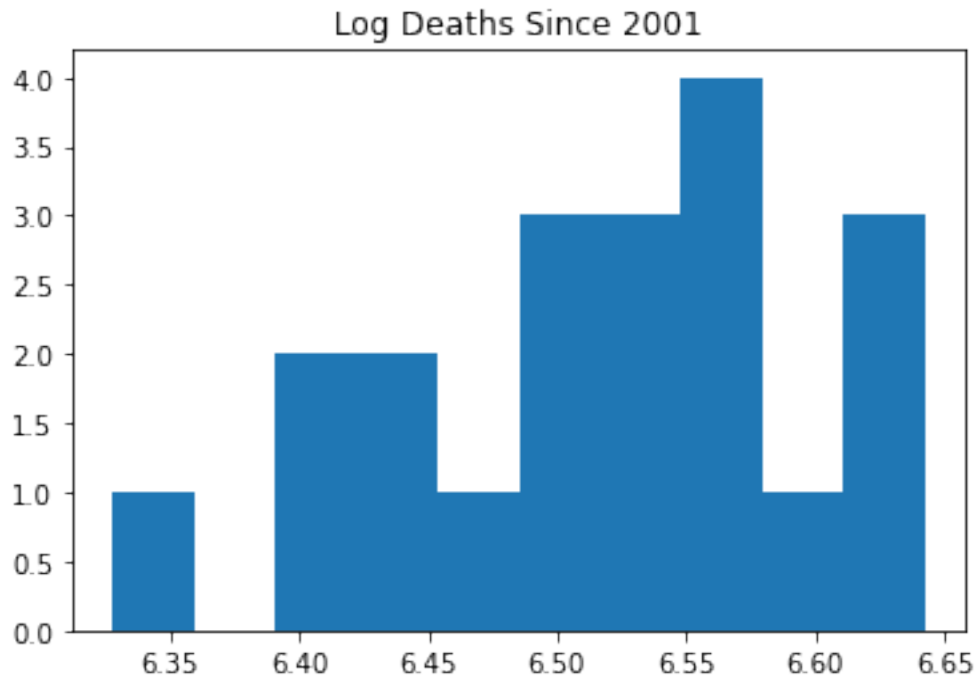
#### Notes:

- [1] Standard Errors assume that the covariance matrix of the errors is correctly specified.
- [2] The condition number is large, 7.01e+05. This might indicate that there are strong multicollinearity or other numerical problems.

```
[48]: #Plots Histogram for above data#
      plt.hist(y1, bins = 10)
```

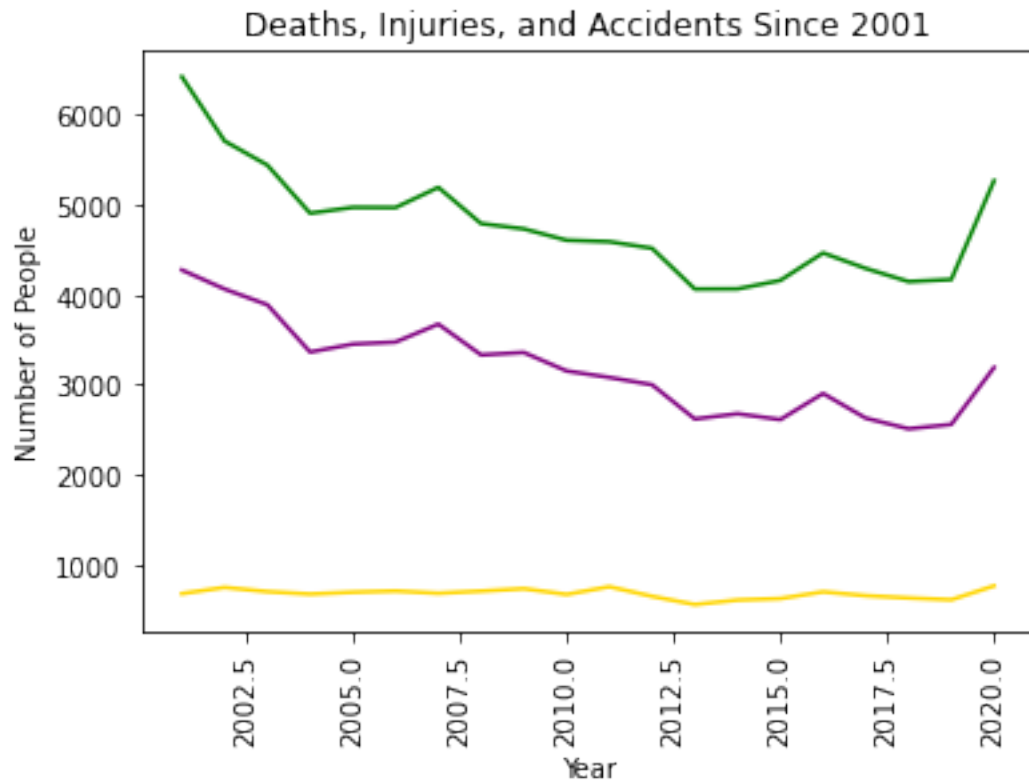
```
plt.title('Log Deaths Since 2001')
```

```
[48]: Text(0.5, 1.0, 'Log Deaths Since 2001')
```



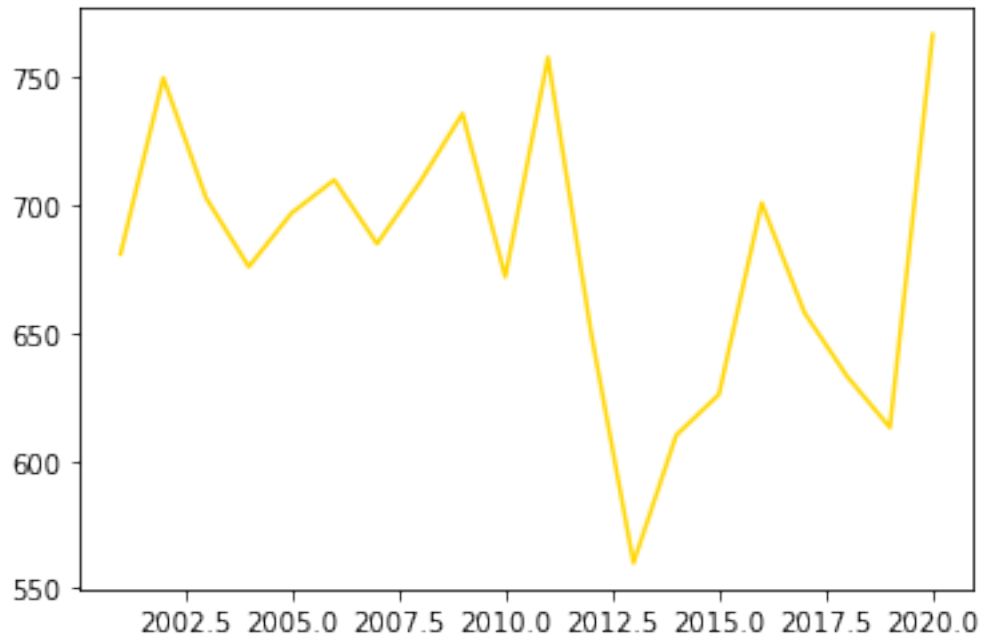
```
[20]: #Shows graph of data over the years#
x1= Accidents2001.Year
y2= Accidents2001.Deaths
y3=Accidents2001.Accidents
y4= Accidents2001['Injuries ']
plt.title('Deaths, Injuries, and Accidents Since 2001')
plt.xlabel('Year')
plt.ylabel('Number of People')
plt.xticks(rotation=90)
plt.plot(x1,y2, color= 'gold')
plt.plot(x1,y3, color= 'green')
plt.plot(x1,y4, color= 'purple')
print("Legend: Green is Accidents, Purple is Injuries, Gold is Deaths")
```

Legend: Green is Accidents, Purple is Injuries, Gold is Deaths



```
[70]: x1= Accidents2001.Year  
      y2= Accidents2001.Deaths  
      plt.plot(x1,y2, color= 'gold')
```

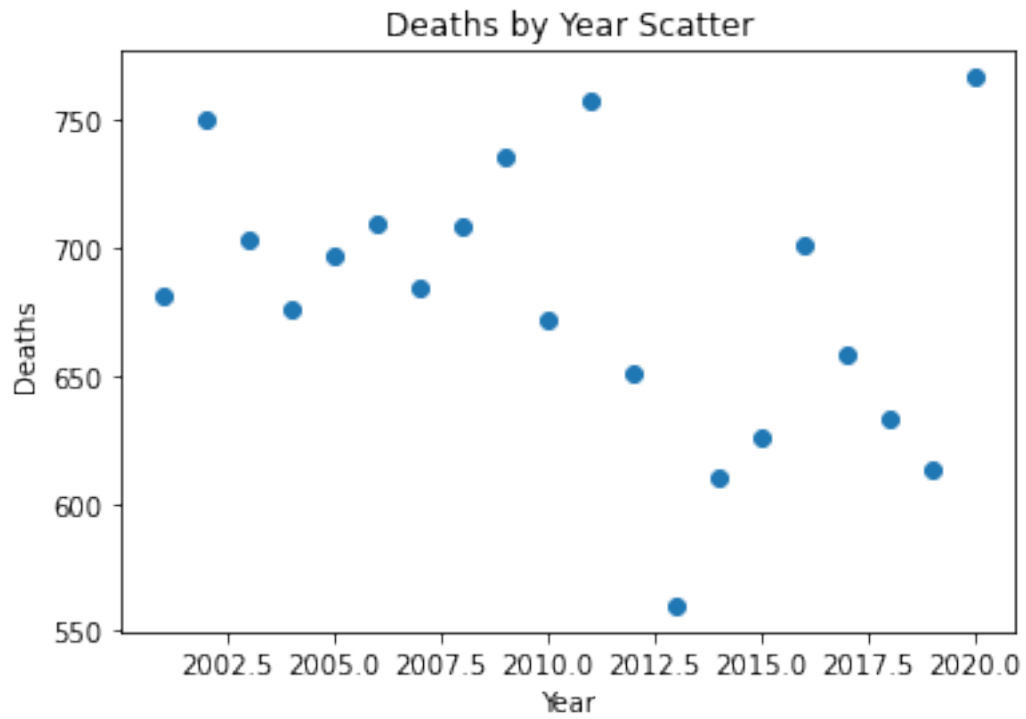
```
[70]: [<matplotlib.lines.Line2D at 0x7f8582e14820>]
```



```
[64]: plt.scatter(x=Accidents2001['Year'], y=Accidents2001['Deaths'])  
plt.xlabel('Year')  
plt.ylabel('Deaths')  
plt.title('Deaths by Year Scatter')
```

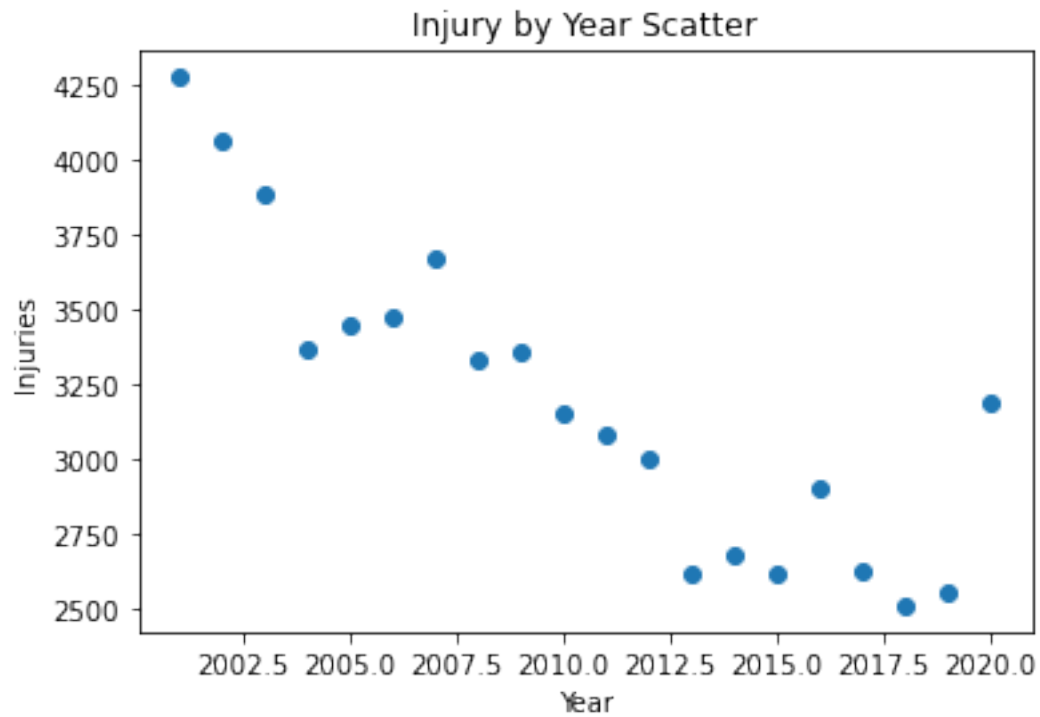
```
[64]: Text(0.5, 1.0, 'Deaths by Year Scatter')
```





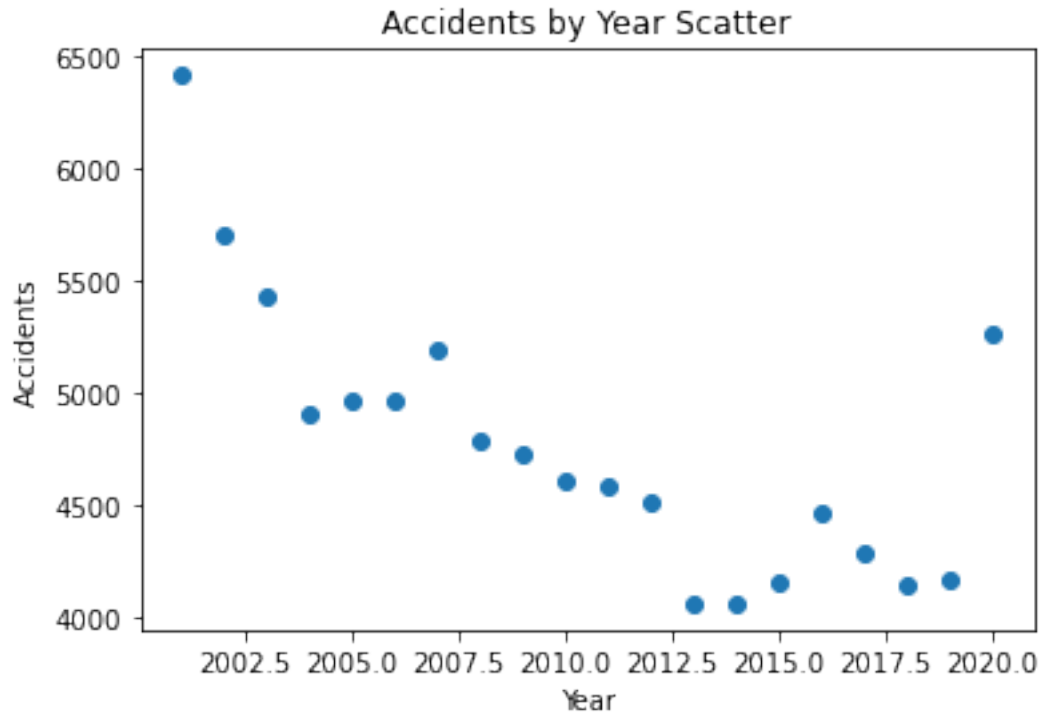
```
[66]: plt.scatter(x=Accidents2001['Year'], y=Accidents2001['Injuries '])  
plt.xlabel('Year')  
plt.ylabel('Injuries')  
plt.title('Injury by Year Scatter')
```

```
[66]: Text(0.5, 1.0, 'Injury by Year Scatter')
```



```
[71]: plt.scatter(x=Accidents2001['Year'], y=Accidents2001['Accidents'])  
plt.xlabel('Year')  
plt.ylabel('Accidents')  
plt.title('Accidents by Year Scatter')
```

```
[71]: Text(0.5, 1.0, 'Accidents by Year Scatter')
```



```
[50]: #Personal Watercrafts#
PersonalWaterCraft['LogDeaths']= np.log(PersonalWaterCraft).Fatalities
X1 = PersonalWaterCraft.Year
X1 = sm.add_constant(X1)
y1 = PersonalWaterCraft.LogDeaths
mod = sm.OLS(y1,X1)
res = mod.fit()
print(res.summary())
```

```

                                OLS Regression Results
=====
Dep. Variable:                  LogDeaths    R-squared:                  0.112
Model:                            OLS        Adj. R-squared:              0.083
Method:                 Least Squares    F-statistic:                  3.893
Date:                Tue, 27 Jul 2021    Prob (F-statistic):           0.0574
Time:                  17:54:49    Log-Likelihood:              -23.742
No. Observations:                  33    AIC:                          51.48
Df Residuals:                      31    BIC:                          54.48
Df Model:                            1
Covariance Type:                nonrobust
=====

```

	coef	std err	t	P> t	[0.025	0.975]
const	-33.2673	18.771	-1.772	0.086	-71.551	5.017

Year	0.0185	0.009	1.973	0.057	-0.001	0.038
------	--------	-------	-------	-------	--------	-------

---

Omnibus:	18.404	Durbin-Watson:	0.422
Prob(Omnibus):	0.000	Jarque-Bera (JB):	28.486
Skew:	-1.345	Prob(JB):	6.52e-07
Kurtosis:	6.671	Cond. No.	4.21e+05

---

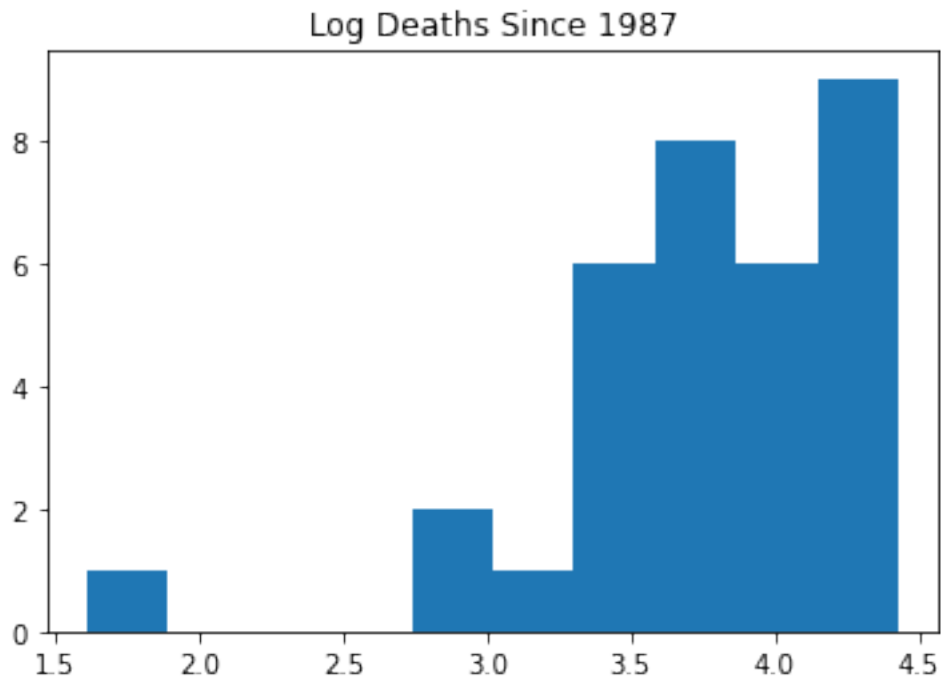
Notes:

[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

[2] The condition number is large, 4.21e+05. This might indicate that there are strong multicollinearity or other numerical problems.

```
[51]: #Plots Histogram for above data#
plt.hist(y1, bins = 10)
plt.title('Log Deaths Since 1987')
```

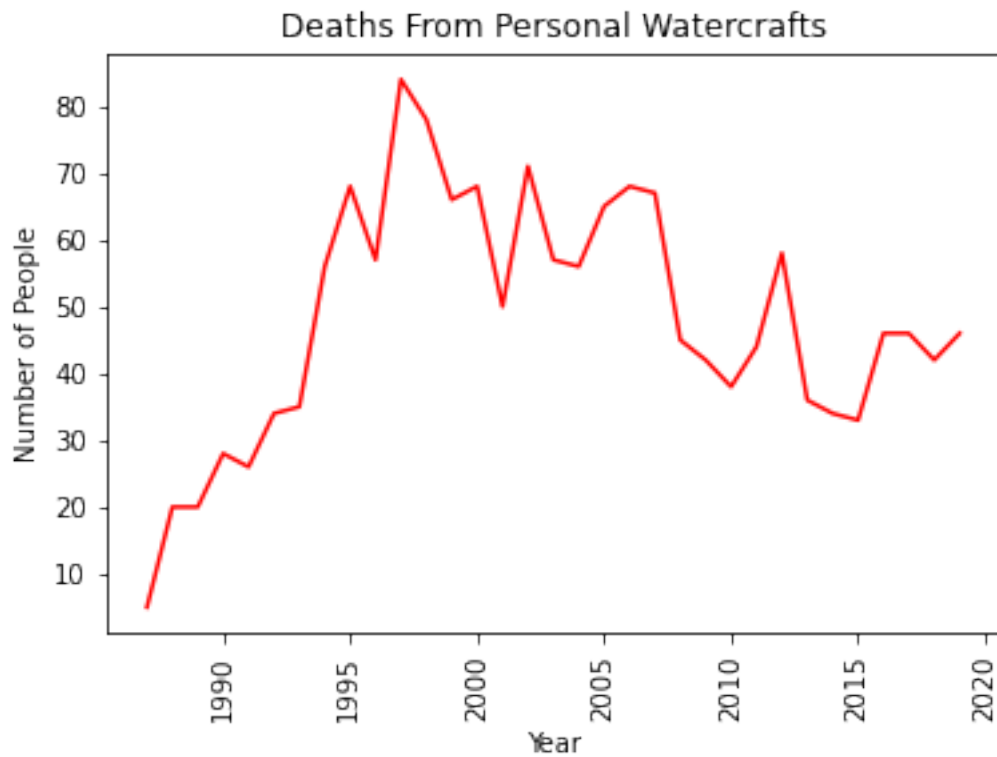
```
[51]: Text(0.5, 1.0, 'Log Deaths Since 1987')
```



```
[52]: #Personal Watercraft Deaths#
x1= PersonalWaterCraft.Year
y2= PersonalWaterCraft.Fatalities
plt.title('Deaths From Personal Watercrafts')
plt.xlabel('Year')
```

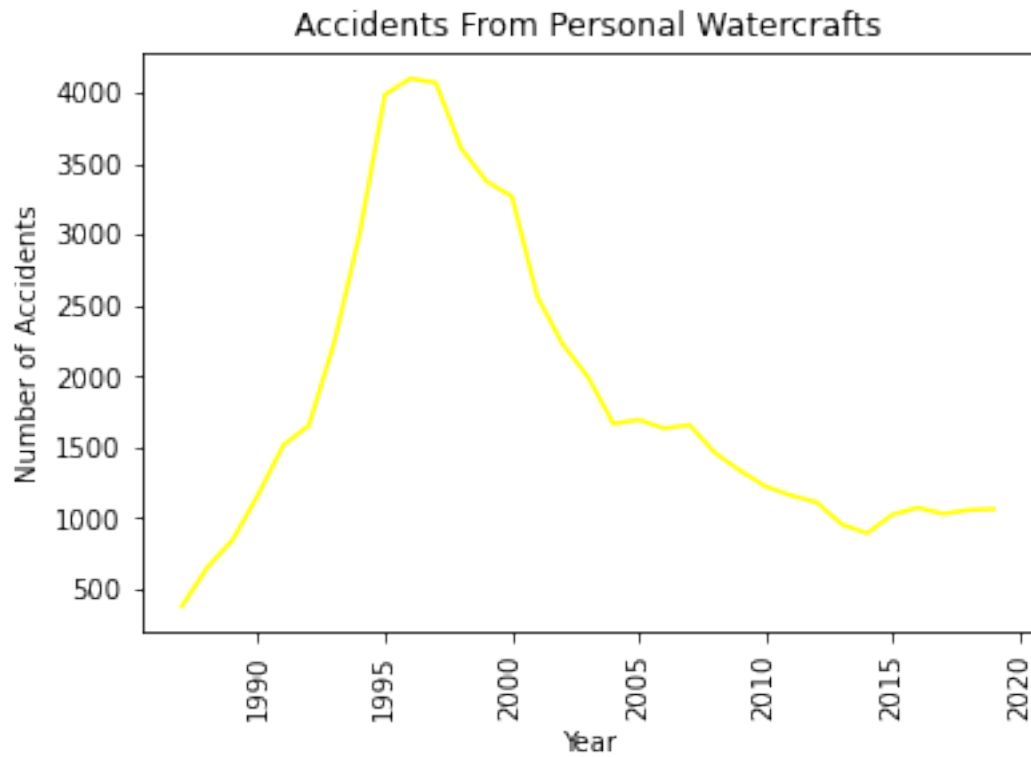
```
plt.ylabel('Number of People')
plt.xticks(rotation=90)
plt.plot(x1,y2, color= 'red')
```

[52]: [<matplotlib.lines.Line2D at 0x7f8581ba3cd0>]



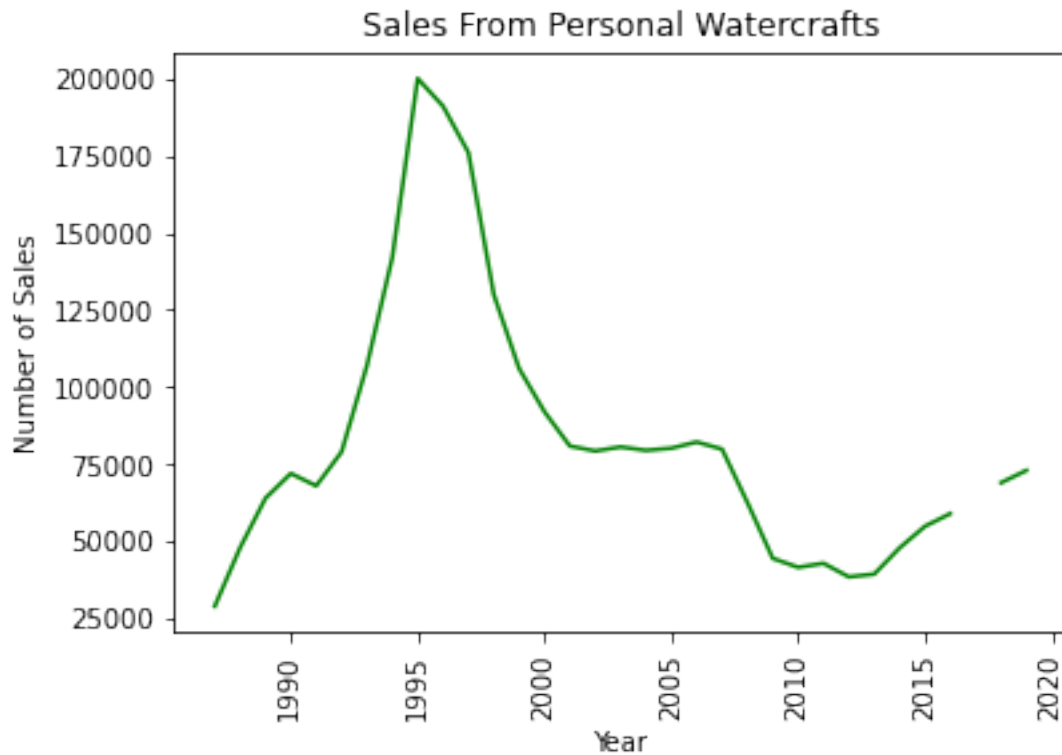
```
[53]: #Personal Watercraft Accidents#
x1= PersonalWaterCraft.Year
y2= PersonalWaterCraft.Accidents
plt.title('Accidents From Personal Watercrafts')
plt.xlabel('Year')
plt.ylabel('Number of Accidents')
plt.xticks(rotation=90)
plt.plot(x1,y2, color= 'yellow')
```

[53]: [<matplotlib.lines.Line2D at 0x7f8581ccc340>]



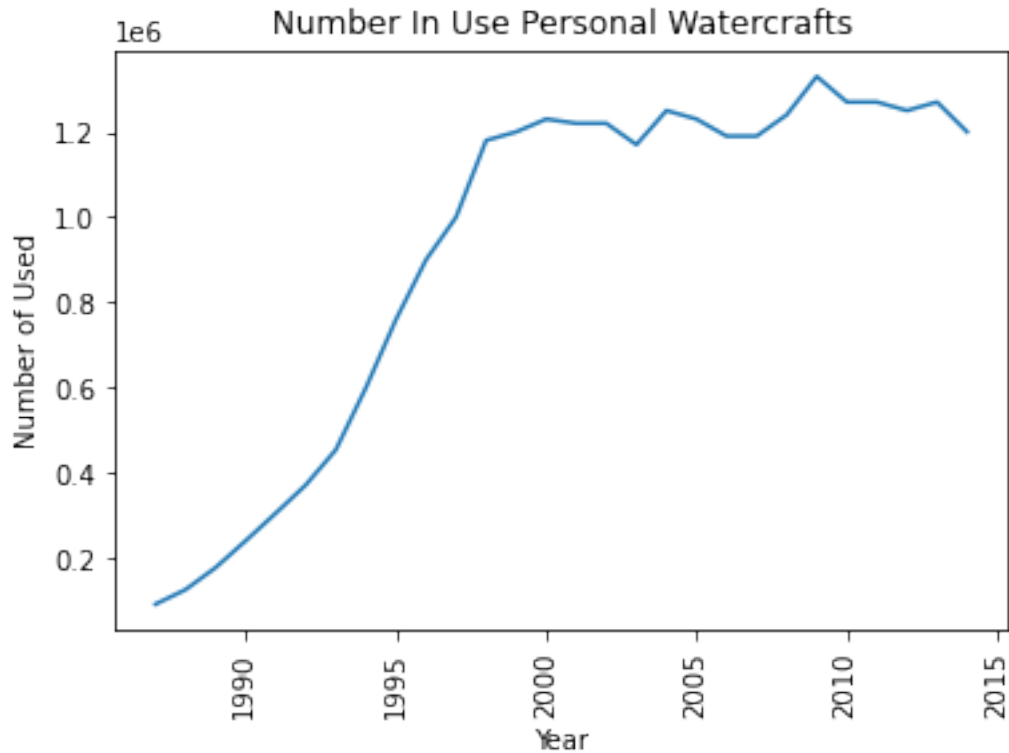
```
[54]: #Sales Personal Watercraft#  
x1= PersonalWaterCraft.Year  
y2= PersonalWaterCraft['Sales']  
plt.title('Sales From Personal Watercrafts')  
plt.xlabel('Year')  
plt.ylabel('Number of Sales')  
plt.xticks(rotation=90)  
plt.plot(x1,y2, color= 'green')
```

```
[54]: [<matplotlib.lines.Line2D at 0x7f8581dc9b20>]
```



```
[55]: #In Use Personal Watercraft#  
x= PersonalWaterCraft.Year  
y= PersonalWaterCraft['Number in use']  
plt.title('Number In Use Personal Watercrafts')  
plt.xlabel('Year')  
plt.ylabel('Number of Used')  
plt.xticks(rotation=90)  
plt.plot(x,y)
```

```
[55]: [<matplotlib.lines.Line2D at 0x7f8581f0a370>]
```



```
[56]: #2020 Reasons#
print(Factors)

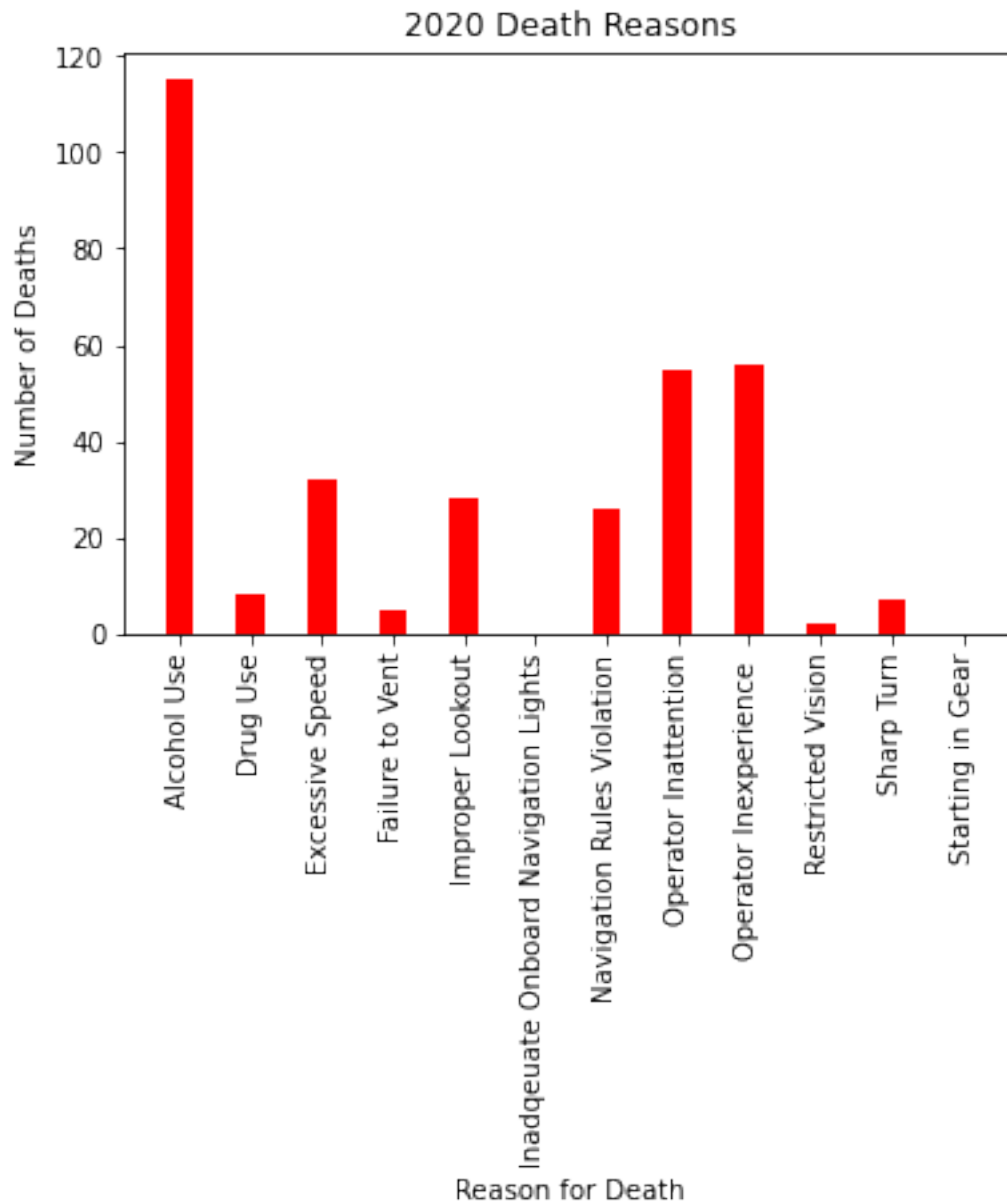
plt.bar(Factors['Crash Reason'], Factors['Deaths'], color='red',
        width = 0.4)

plt.xlabel("Reason for Death")
plt.ylabel("Number of Deaths")
plt.title("2020 Death Reasons")
plt.xticks(rotation=90)
plt.show()
```

	Crash Reason	Accidents	Deaths	Injuries
0	Alcohol Use	296	115	260
1	Drug Use	12	8	2
2	Excessive Speed	418	32	345
3	Failure to Vent	54	5	89
4	Improper Lookout	578	28	409
5	Inadqueate Onboard Navigation Lights	21	0	16
6	Navigation Rules Violation	316	26	220
7	Operator Inattention	664	55	383
8	Operator Inexperience	612	56	343
9	Restricted Vision	67	2	47



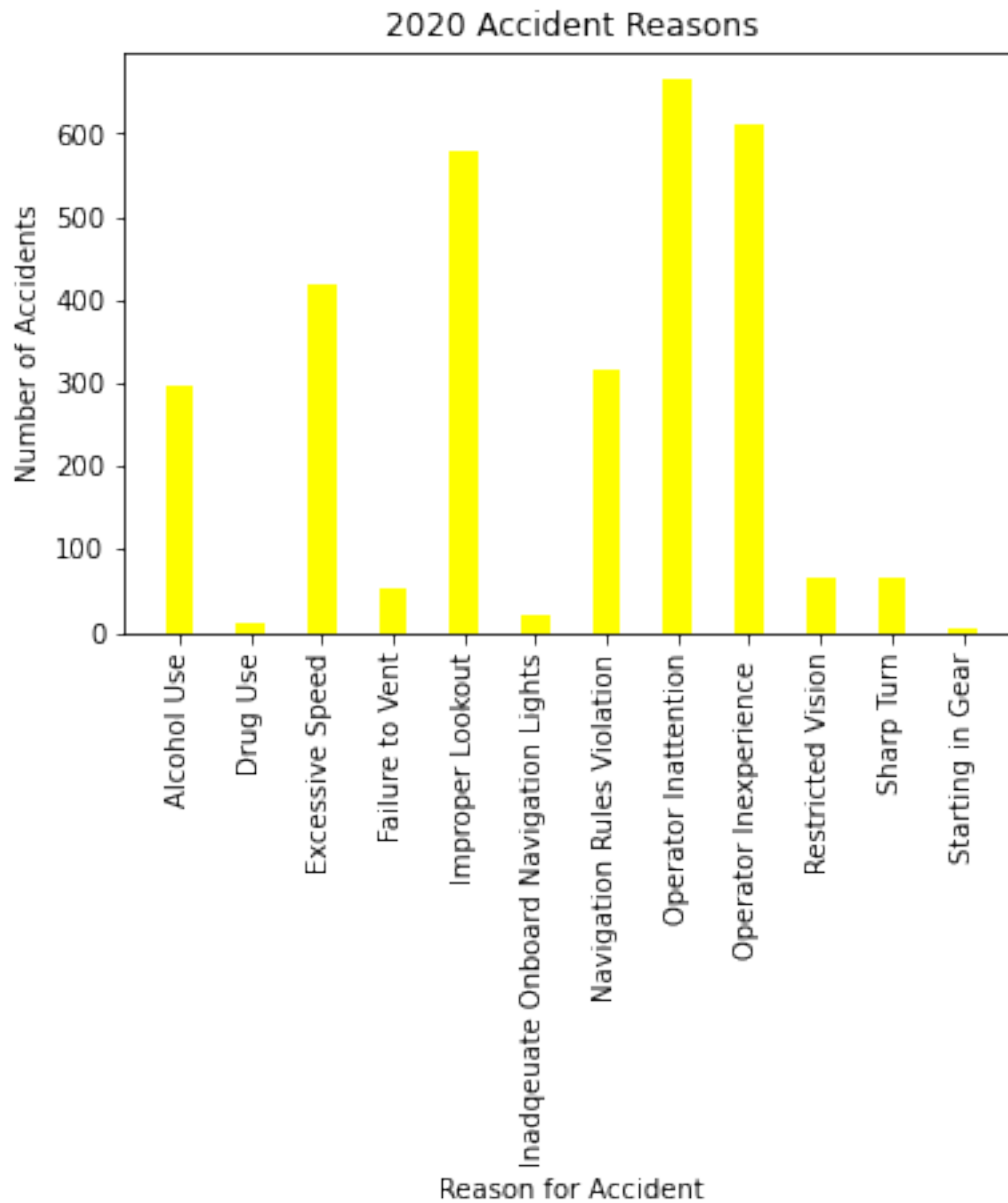
10	Sharp Turn	67	7	66
11	Starting in Gear	4	0	2



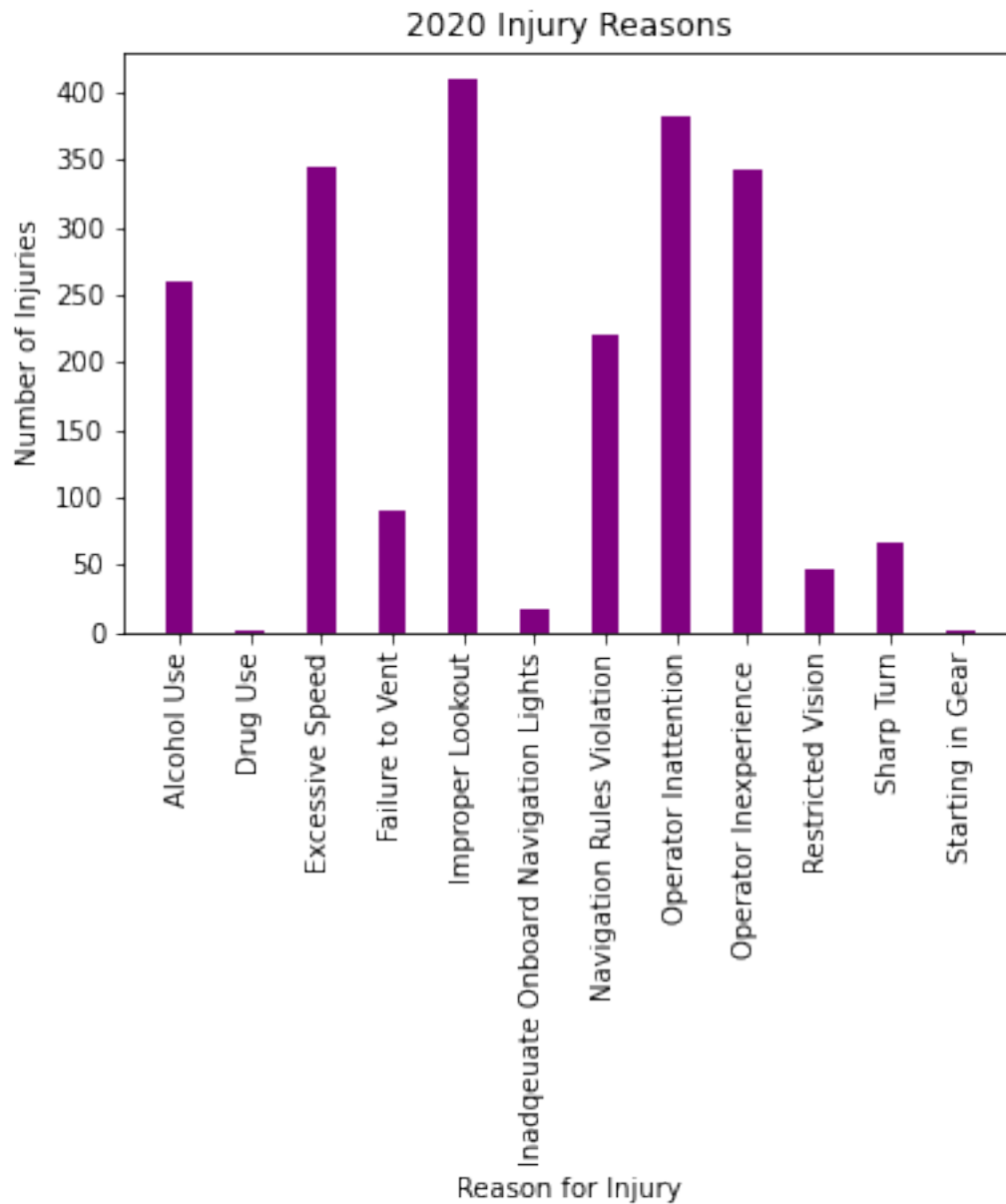
```
[22]: plt.bar(Factors['Crash Reason'], Factors['Accidents'], color='yellow',
           width = 0.4)

plt.xlabel("Reason for Accident")
plt.ylabel("Number of Accidents")
plt.title("2020 Accident Reasons")
plt.xticks(rotation=90)
```

```
plt.show()
```



```
[58]: plt.bar(Factors['Crash Reason'], Factors['Injuries'], color='purple',  
            width = 0.4)  
  
plt.xlabel("Reason for Injury")  
plt.ylabel("Number of Injuries")  
plt.title("2020 Injury Reasons")  
plt.xticks(rotation=90)  
plt.show()
```



```
[59]: #Type of Accidents that occurred in 2020#
print(AccidentType)

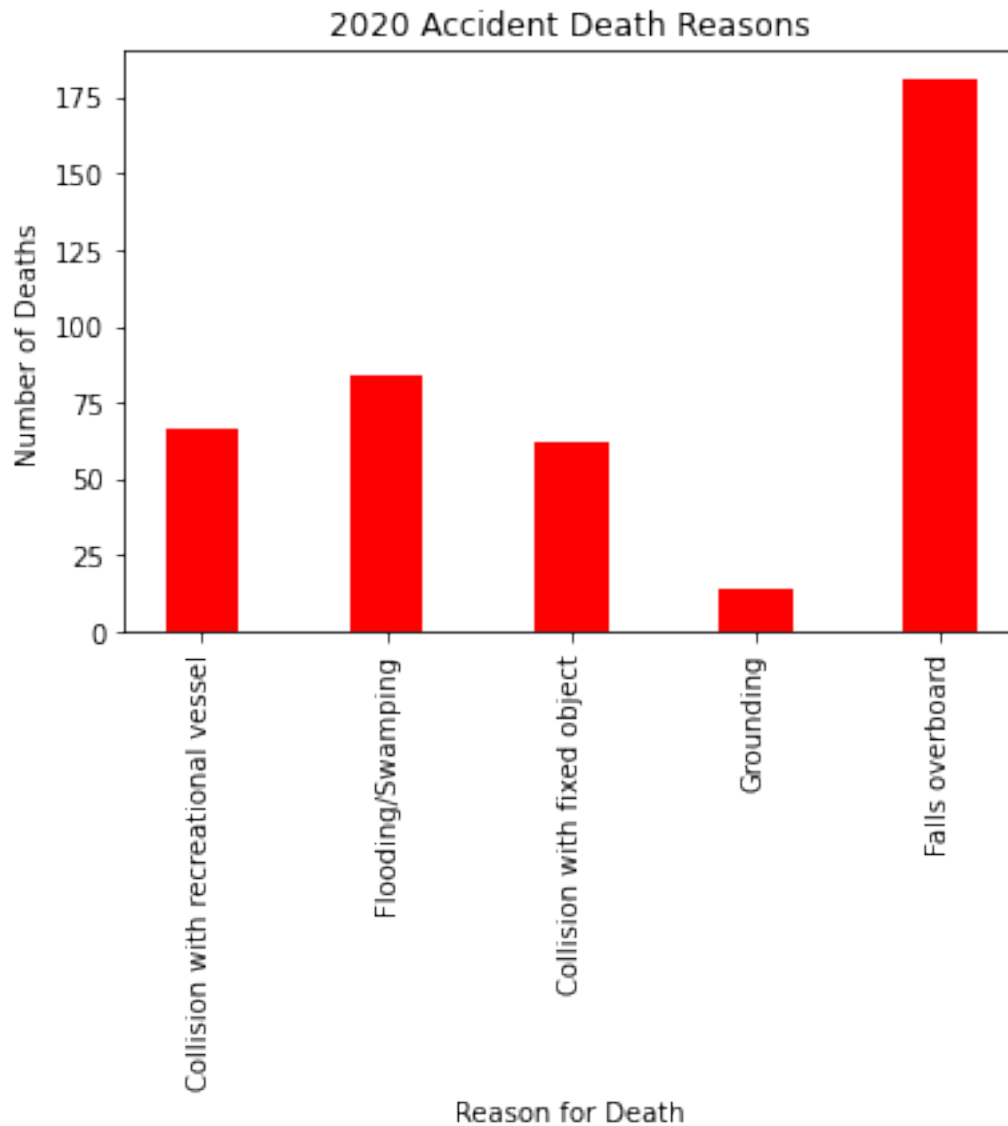
plt.bar(AccidentType['Accident Type'], AccidentType['Number of Deaths'], color='red',
        width = 0.4)

plt.xlabel("Reason for Death")
plt.ylabel("Number of Deaths")
plt.title("2020 Accident Death Reasons")
```

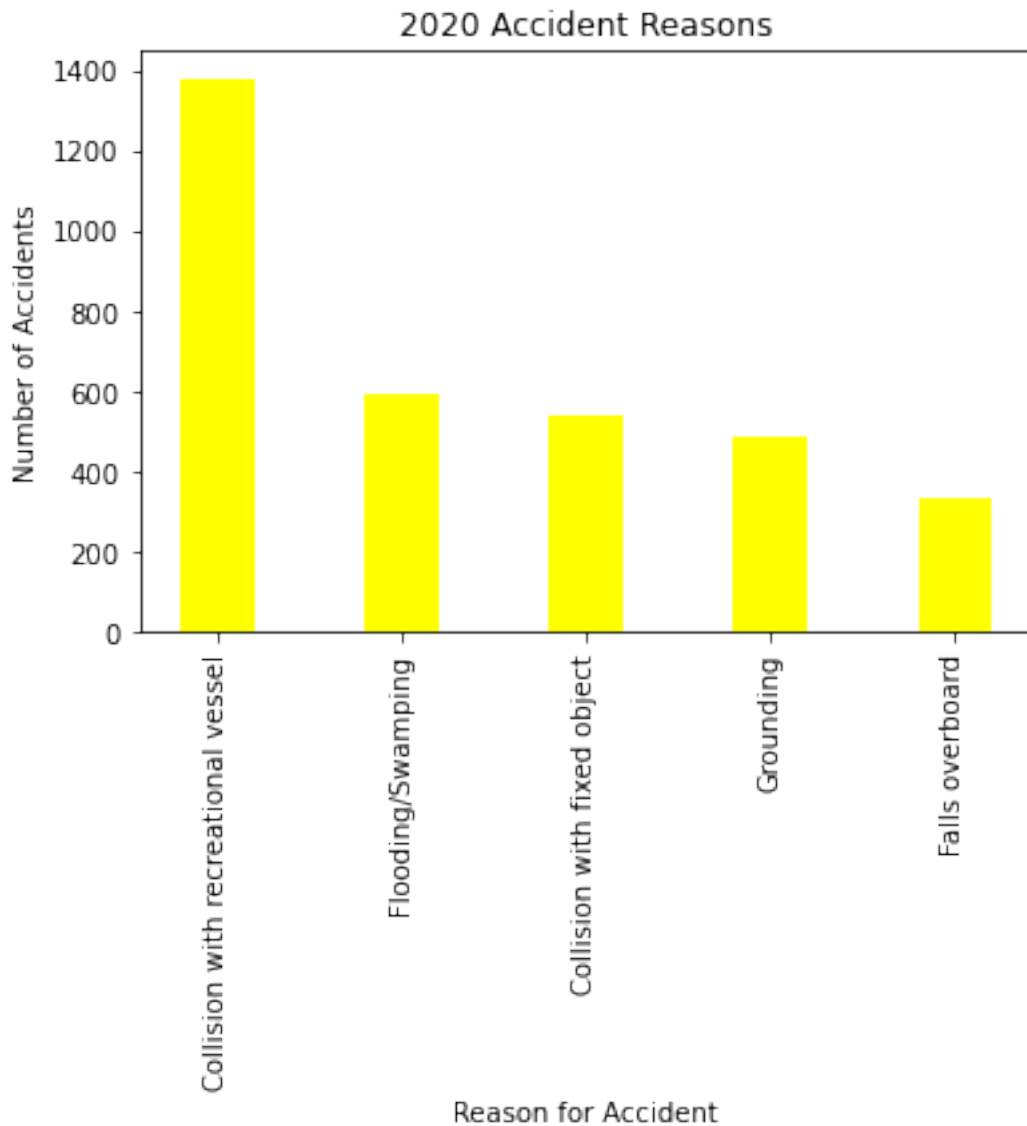
```
plt.xticks(rotation=90)
plt.show()
```

	Accident Type	Number of Accidents	Number of Deaths	\
0	Collision with recreational vessel	1379	66	
1	Flooding/Swamping	589	84	
2	Collision with fixed object	542	62	
3	Grounding	484	14	
4	Falls overboard	335	181	

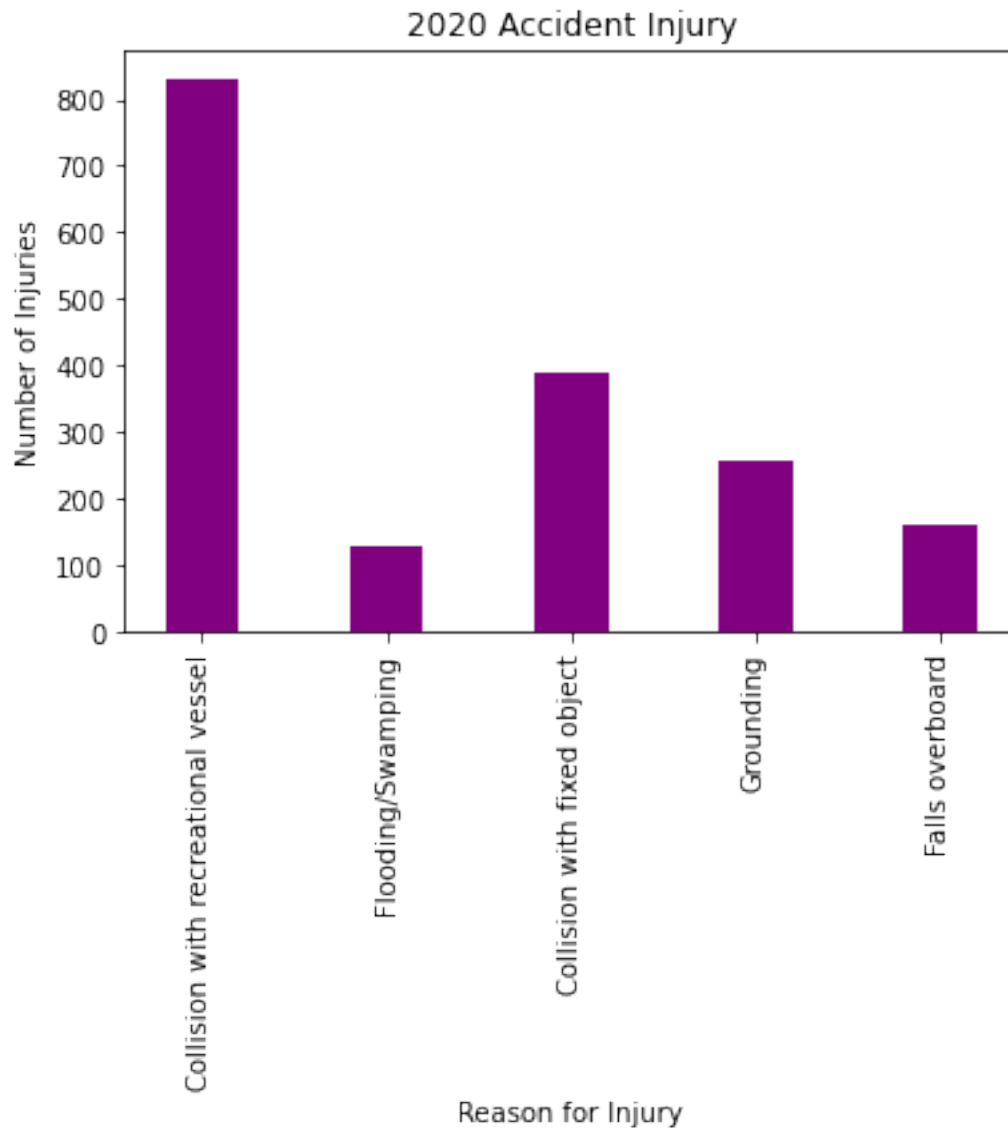
	Number of Injuries
0	831
1	128
2	389
3	255
4	161



```
[60]: plt.bar(AccidentType['Accident Type'], AccidentType['Number of Accidents'],  
             color = 'yellow',  
             width = 0.4)  
  
plt.xlabel("Reason for Accident")  
plt.ylabel("Number of Accidents")  
plt.title("2020 Accident Reasons")  
plt.xticks(rotation=90)  
plt.show()
```



```
[61]: plt.bar(AccidentType['Accident Type'], AccidentType['Number of Injuries'],  
            color = 'purple',  
            width = 0.4)  
  
plt.xlabel("Reason for Injury")  
plt.ylabel("Number of Injuries")  
plt.title("2020 Accident Injury")  
plt.xticks(rotation=90)  
plt.show()
```



```
[63]: #Vessel of Accidents that occurred in 2020#
print(VesselAccidents)
fig, ax = plt.subplots()

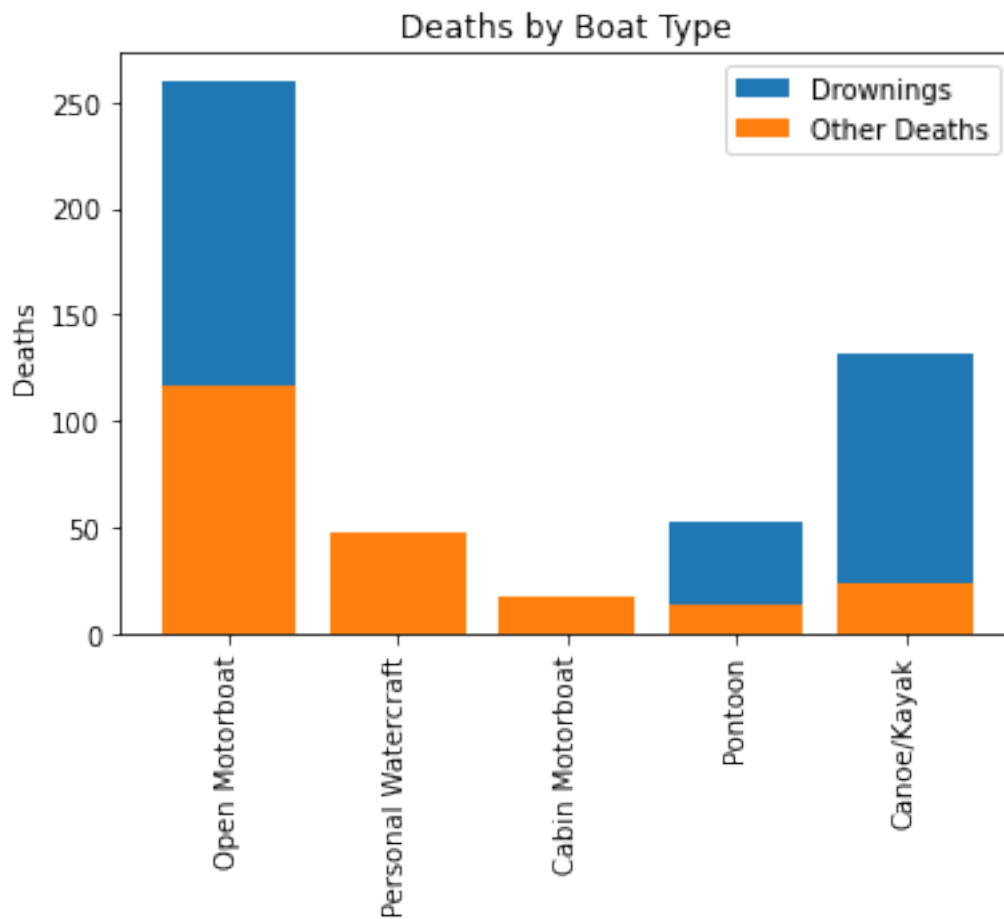
ax.bar(VesselAccidents['Type of Boat'], VesselAccidents['Drownings'],
       ↪label='Drownings')
ax.bar(VesselAccidents['Type of Boat'], VesselAccidents['Other Deaths'],
       ↪label='Other Deaths')

ax.set_ylabel('Deaths')
ax.set_title('Deaths by Boat Type')
ax.legend()
```

```
plt.xticks(rotation=90)
```

```
plt.show()
```

	Type of Boat	Drownings	Other Deaths	Total Deaths	Total Injuries
0	Open Motorboat	260	116	376	1520
1	Personal Watercraft	19	47	66	896
2	Cabin Motorboat	16	17	33	298
3	Pontoon	53	14	67	232
4	Canoe/Kayak	131	23	154	117



```
[ ]:
```