



ISTA 331 | Machine Learning

# Arizona Crime Data

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# Dataset – FBI Crime Data (1985-2019)

DATASET

MODEL

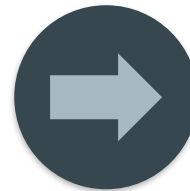
RESULTS

QUESTIONS

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[https://crime-data-explorer.fr.cloud.gov/explorer/state/arizona/crime-total\\_property.cs](https://crime-data-explorer.fr.cloud.gov/explorer/state/arizona/crime-total_property.cs)

	A	B	C	D
1	Year	Rate	Location	
2	2015	2500.5	United States	
3	1985	4666.4	United States	
4	2000	3618.3	United States	
5	1997	4316.5	United States	
6	1998	4052.5	United States	
7	1999	3743.6	United States	
8	2001	3658.1	United States	
9	2002	3630.6	United States	
10	2003	3591.2	United States	
11	2004	3514.1	United States	
12	2005	3431.5	United States	
13	2006	3346.6	United States	
14	2007	3276.4	United States	
15	2008	3214.6	United States	
16	2009	3041.3	United States	
17	2010	2845.0	United States	



```
===== Total Property Crime Rates =====
      Rate      Location
Year
1985  4666.4  United States
1985  6513.7    Arizona
1986  6663.1    Arizona
1986  4881.8  United States
1987  6576.0    Arizona
1987  4963.0  United States
1988  6861.2    Arizona
1988  5054.0  United States
1989  7460.2    Arizona
1989  5107.1  United States
1990  7236.4    Arizona
1990  5073.1  United States
1991  6734.9    Arizona
1991  5140.2  United States
1992  4903.7  United States
1992  6357.8    Arizona
1993  4740.0  United States
1993  6716.7    Arizona
1994  7221.4    Arizona
1994  4660.2  United States
1995  4590.5  United States
1995  7500.1    Arizona
1996  6435.5    Arizona
1996  4451.0  United States
1997  6571.3    Arizona
1997  4316.5  United States
1998  5997.0    Arizona
1998  4852.5  United States
```

# Arizona Crime Data (1985-2019) – Stackplot Visualization

DATASET

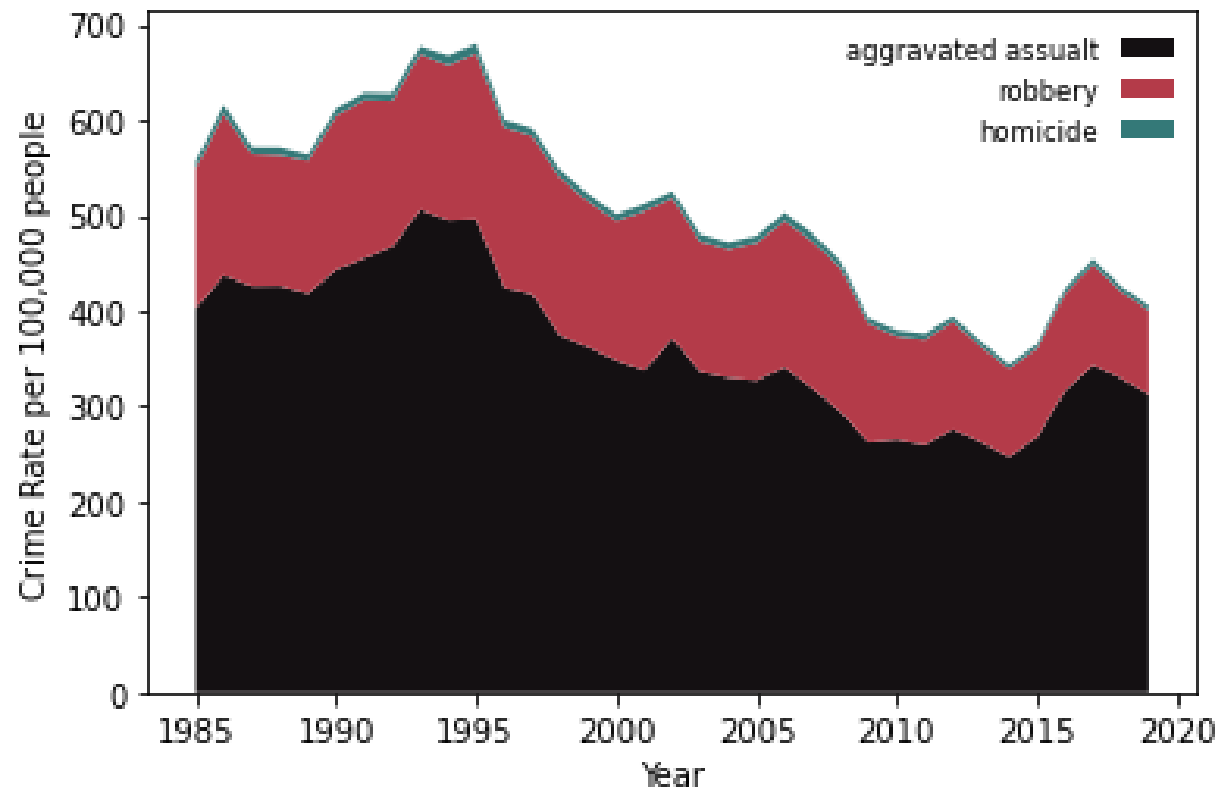
MODEL

RESULTS

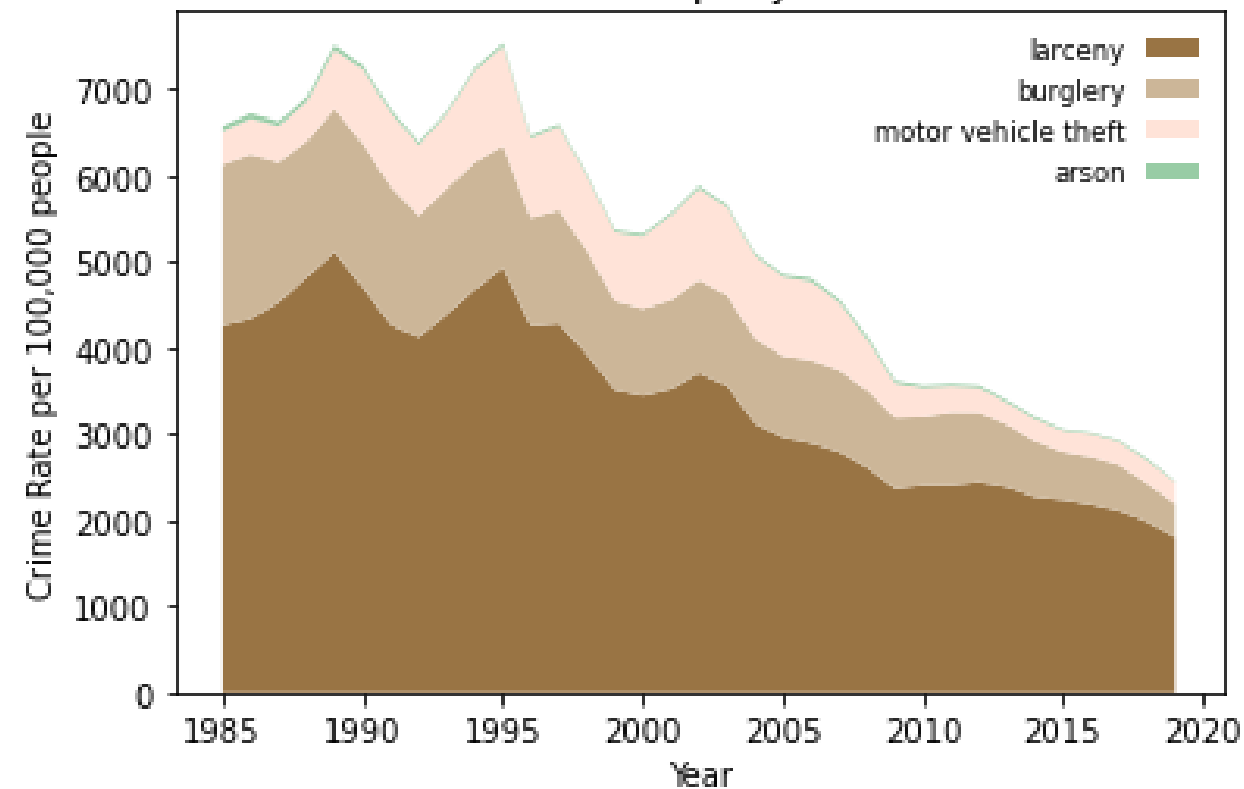
QUESTIONS

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## Arizona Violent Crime



## Arizona Property Crime



# Arizona Crime Data (1985-2019) - Totals

DATASET

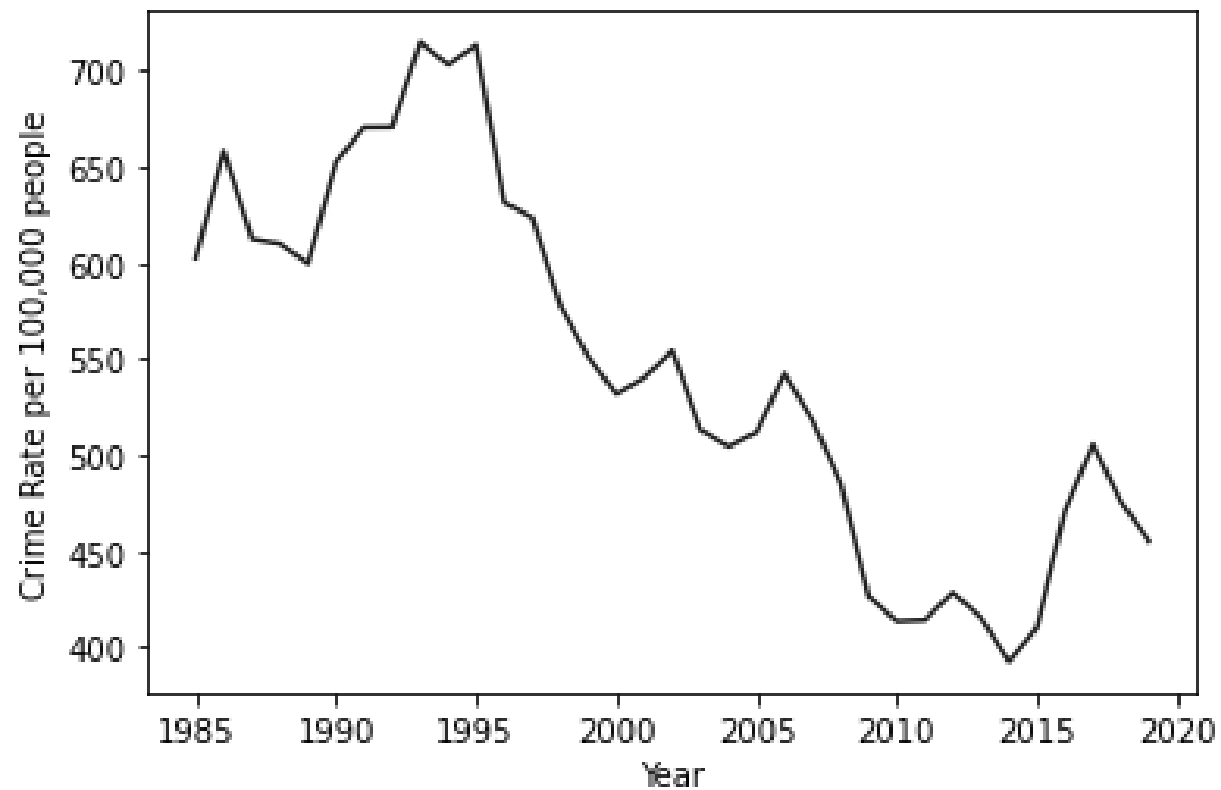
MODEL

RESULTS

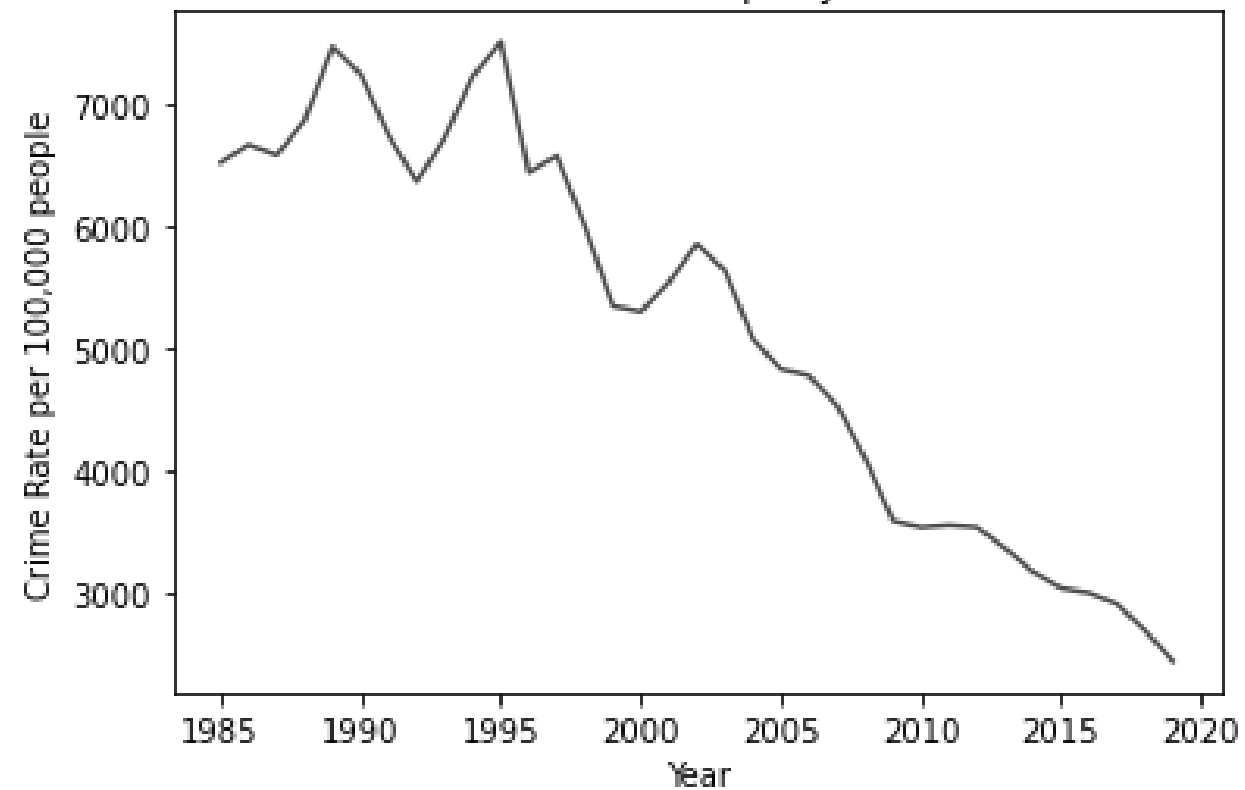
QUESTIONS

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## Arizona Total Violent Crime



## Arizona Total Property Crime



# Model 1 – Simple Linear Regression using OLS

DATASET

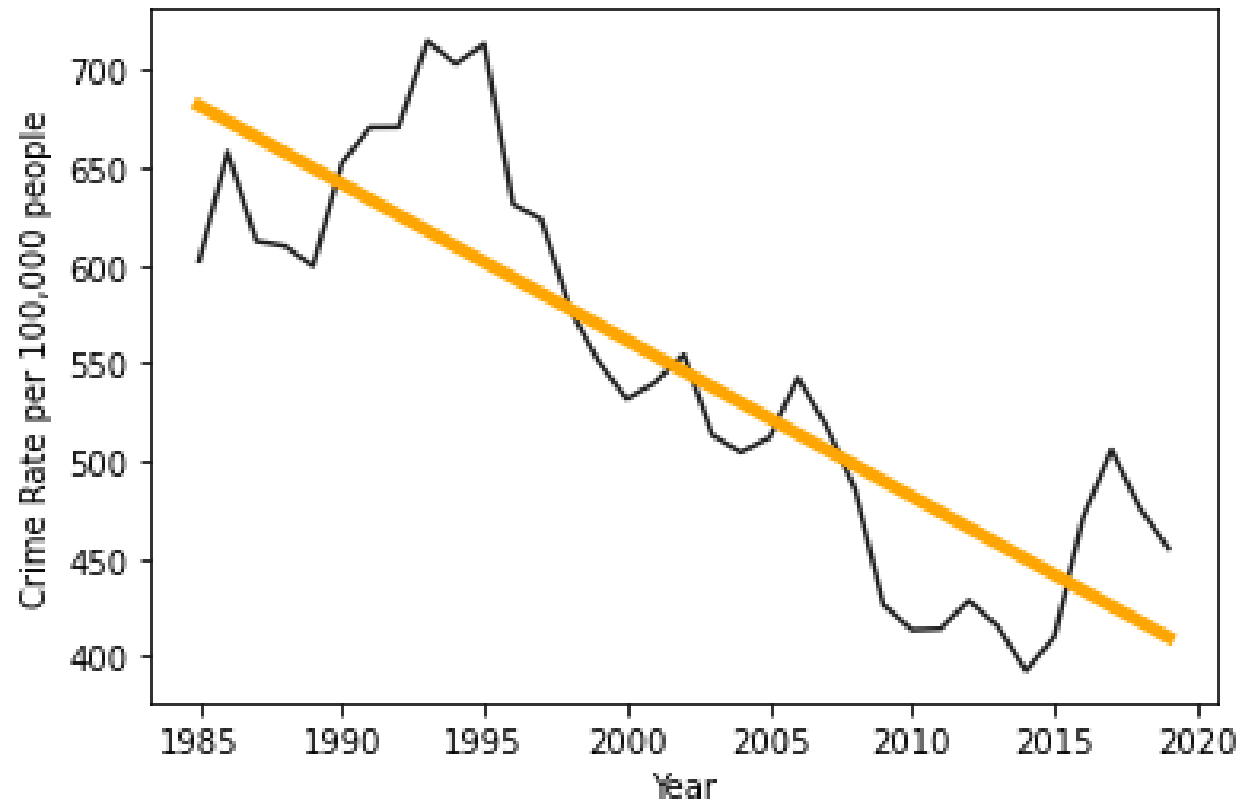
MODEL

RESULTS

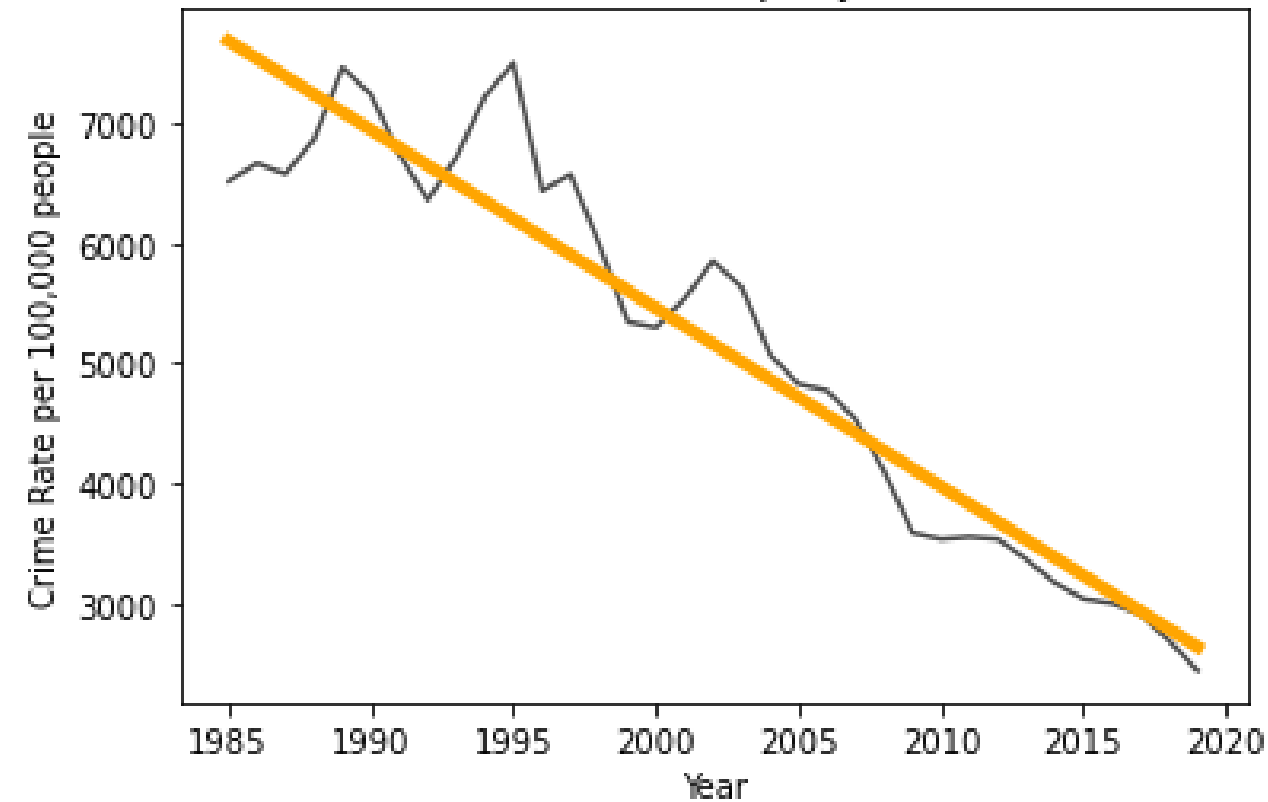
QUESTIONS

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Arizona Total Violent Crime



Arizona Total Property Crime



# Model 1 – Simple Linear Regression using OLS

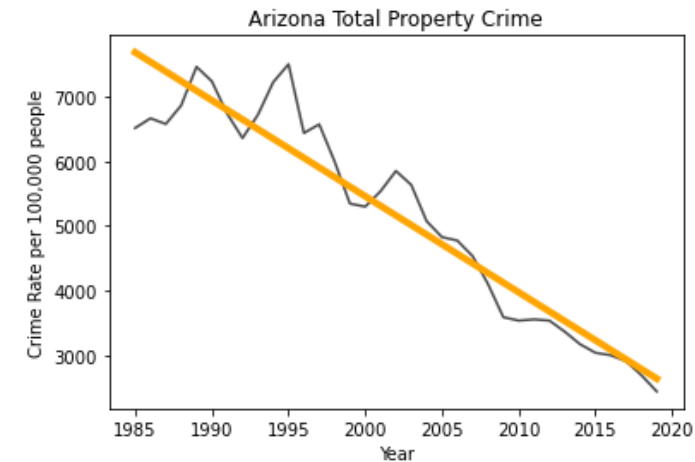
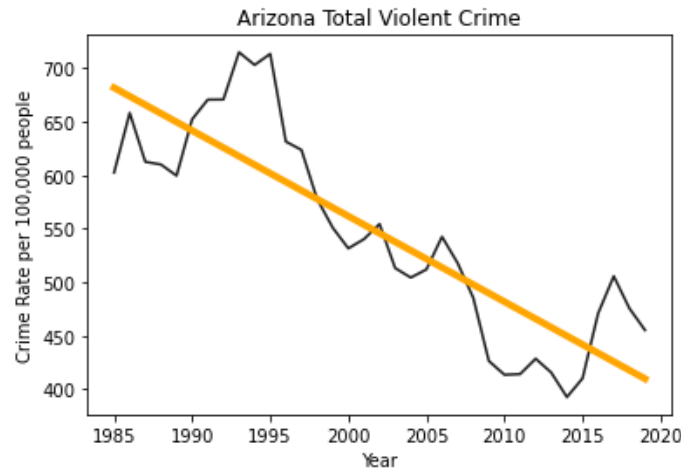
DATASET

MODEL

RESULTS

QUESTIONS

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OLS Regression Results						
=====						
Dep. Variable:	y	R-squared:	0.722			
Model:	OLS	Adj. R-squared:	0.714			
Method:	Least Squares	F-statistic:	85.72			
Date:	Sun, 06 Dec 2020	Prob (F-statistic):	1.07e-10			
Time:	06:02:02	Log-Likelihood:	-186.67			
No. Observations:	35	AIC:	377.3			
Df Residuals:	33	BIC:	380.5			
Df Model:	1					
Covariance Type:	nonrobust					
=====						
	coef	std err	t	P> t	[0.025	0.975]
-----						
const	1.656e+04	1729.775	9.574	0.000	1.3e+04	2.01e+04
x1	-7.9994	0.864	-9.258	0.000	-9.757	-6.242
=====						
Omnibus:	2.298	Durbin-Watson:	0.412			
Prob(Omnibus):	0.317	Jarque-Bera (JB):	2.029			
Skew:	0.489	Prob(JB):	0.363			
Kurtosis:	2.341	Cond. No.	3.97e+05			
=====						

OLS Regression Results						
=====						
Dep. Variable:	y	R-squared:	0.905			
Model:	OLS	Adj. R-squared:	0.902			
Method:	Least Squares	F-statistic:	313.5			
Date:	Sun, 06 Dec 2020	Prob (F-statistic):	2.04e-18			
Time:	06:02:02	Log-Likelihood:	-266.19			
No. Observations:	35	AIC:	536.4			
Df Residuals:	33	BIC:	539.5			
Df Model:	1					
Covariance Type:	nonrobust					
=====						
	coef	std err	t	P> t	[0.025	0.975]
-----						
const	3.022e+05	1.68e+04	18.013	0.000	2.68e+05	3.36e+05
x1	-148.3671	8.380	-17.706	0.000	-165.415	-131.319
=====						
Omnibus:	1.804	Durbin-Watson:	0.498			
Prob(Omnibus):	0.406	Jarque-Bera (JB):	0.787			
Skew:	0.180	Prob(JB):	0.675			
Kurtosis:	3.641	Cond. No.	3.97e+05			
=====						

# Model 2 – 5<sup>th</sup> Degree Polynomial Regression using OLS

DATASET

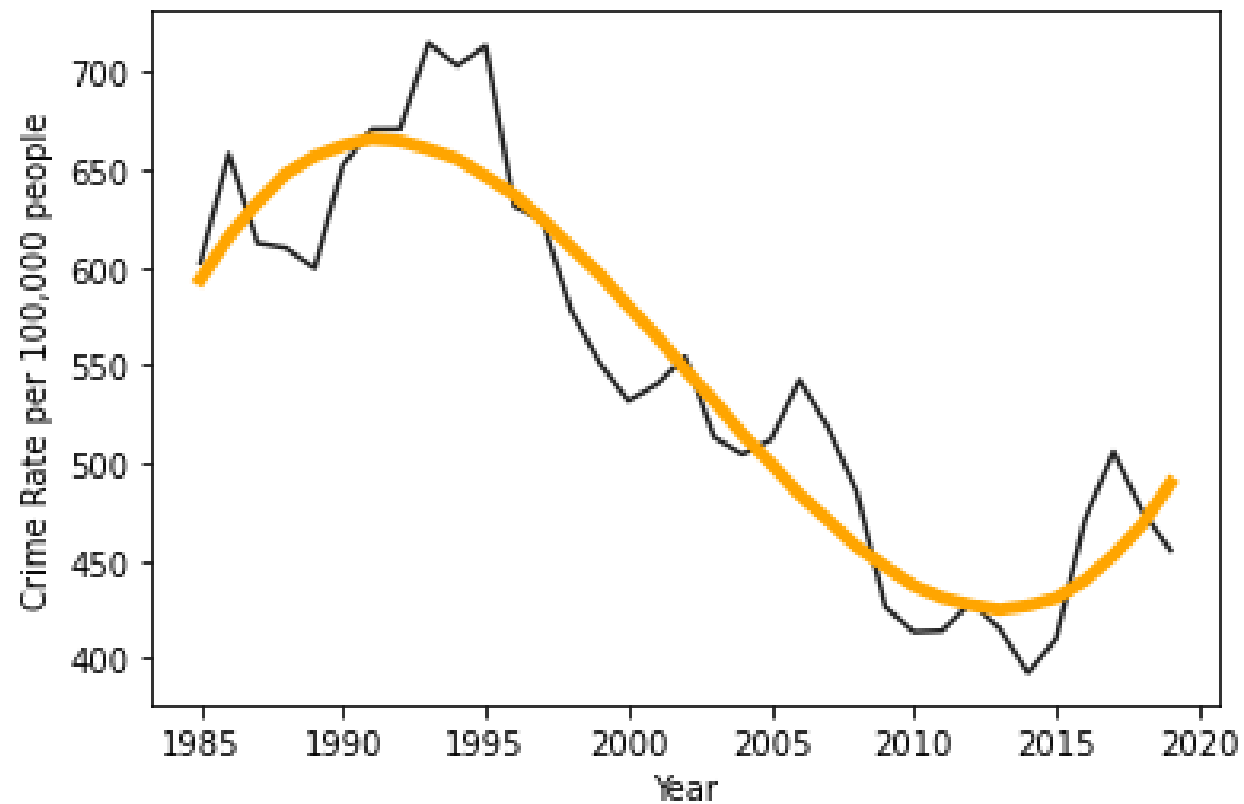
MODEL

RESULTS

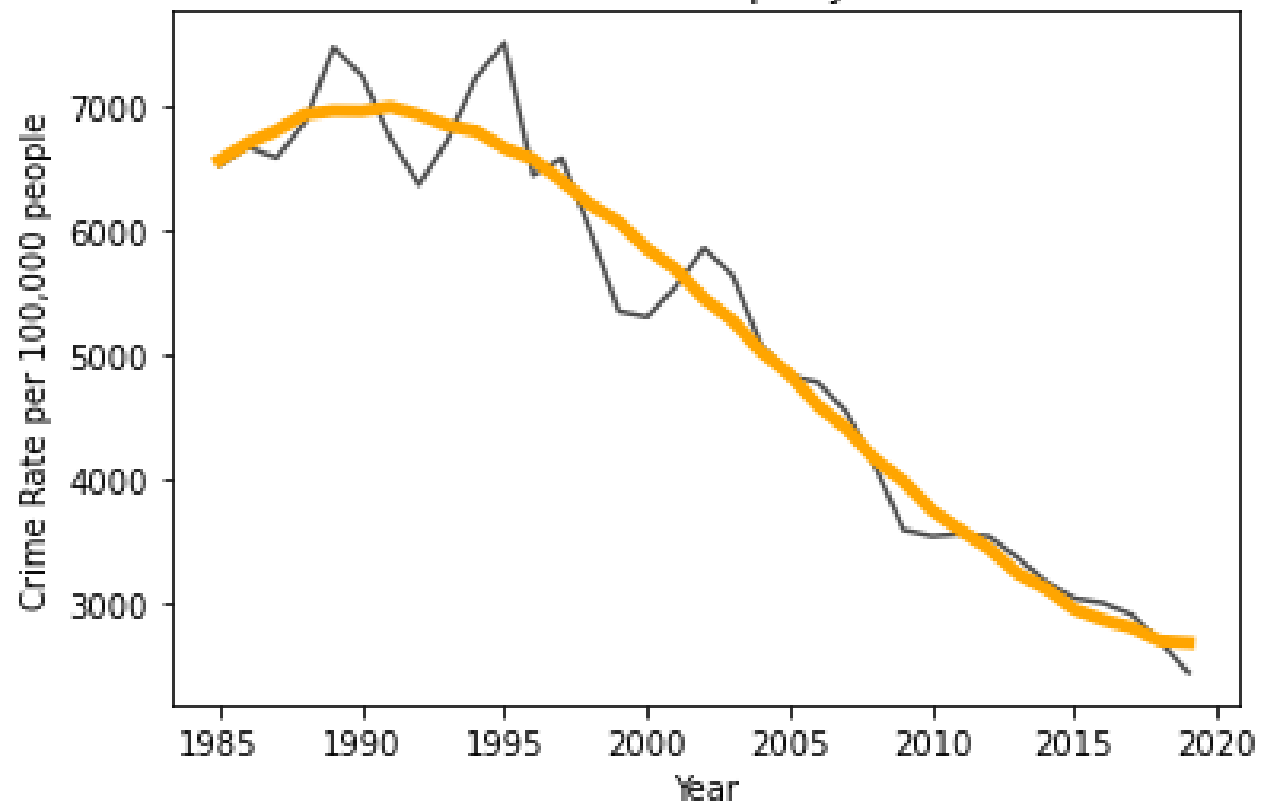
QUESTIONS

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### Arizona Total Violent Crime



### Arizona Total Property Crime



# Model 2 – 5<sup>th</sup> Degree Polynomial Regression using OLS

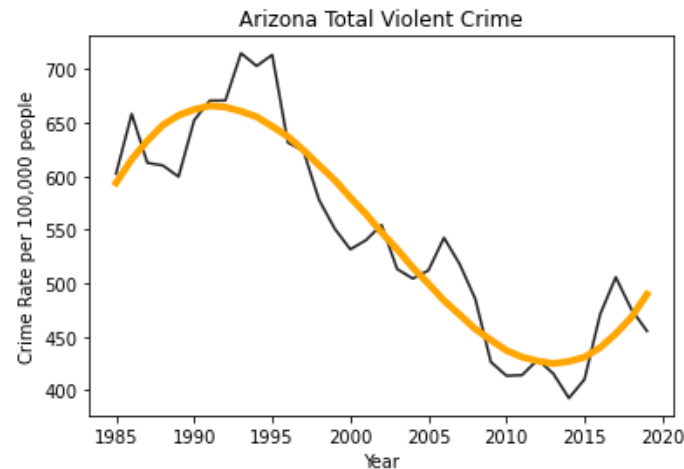
DATASET

MODEL

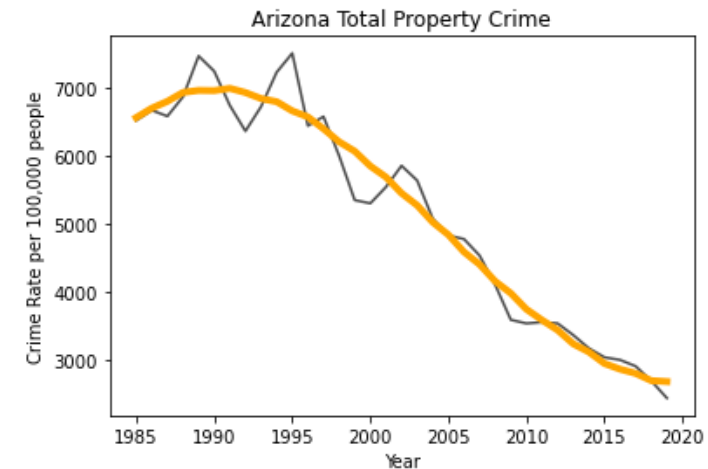
RESULTS

QUESTIONS

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OLS Regression Results						
=====						
Dep. Variable:	y	R-squared:	0.880			
Model:	OLS	Adj. R-squared:	0.864			
Method:	Least Squares	F-statistic:	54.85			
Date:	Sun, 06 Dec 2020	Prob (F-statistic):	2.27e-13			
Time:	06:21:12	Log-Likelihood:	-172.01			
No. Observations:	35	AIC:	354.0			
Df Residuals:	30	BIC:	361.8			
Df Model:	4					
Covariance Type:	nonrobust					
=====						
	coef	std err	t	P> t	[0.025	0.975]
-----						
const	2.645e+07	4.25e+06	6.227	0.000	1.78e+07	3.51e+07
x1	5.631e+05	9e+04	6.256	0.000	3.79e+05	7.47e+05
x2	-281.2715	44.965	-6.255	0.000	-373.101	-189.442
x3	0.0468	0.007	6.255	0.000	0.032	0.062
x4	-3.654e-10	5.2e-09	-0.070	0.944	-1.1e-08	1.03e-08
=====						
Omnibus:	2.451	Durbin-Watson:	0.883			
Prob(Omnibus):	0.294	Jarque-Bera (JB):	1.876			
Skew:	0.402	Prob(JB):	0.391			
Kurtosis:	2.201	Cond. No.	8.25e+14			



OLS Regression Results						
Dep. Variable:	y	R-squared:	0.962			
Model:	OLS	Adj. R-squared:	0.957			
Method:	Least Squares	F-statistic:	190.4			
Date:	Sun, 06 Dec 2020	Prob (F-statistic):	7.39e-21			
Time:	06:21:12	Log-Likelihood:	-250.07			
No. Observations:	35	AIC:	510.1			
Df Residuals:	30	BIC:	517.9			
Df Model:	4					
Covariance Type:	nonrobust					
	coef	std err	t	P> t	[0.025	0.975]
const	1.754e+08	3.95e+07	4.439	0.000	9.47e+07	2.56e+08
x1	3.98e+06	8.37e+05	4.753	0.000	2.27e+06	5.69e+06
x2	-1984.9769	418.222	-4.746	0.000	-2839.101	-1130.853
x3	0.3300	0.070	4.739	0.000	0.188	0.472
x4	-1.567e-08	4.84e-08	-0.324	0.748	-1.15e-07	8.32e-08
Omnibus:	1.941	Durbin-Watson:	1.184			
Prob(Omnibus):	0.379	Jarque-Bera (JB):	0.902			
Skew:	0.125	Prob(JB):	0.637			
Kurtosis:	3.746	Cond. No.	8.25e+14			



# Model 3 – Log transformation of linear regression using OLS

DATASET

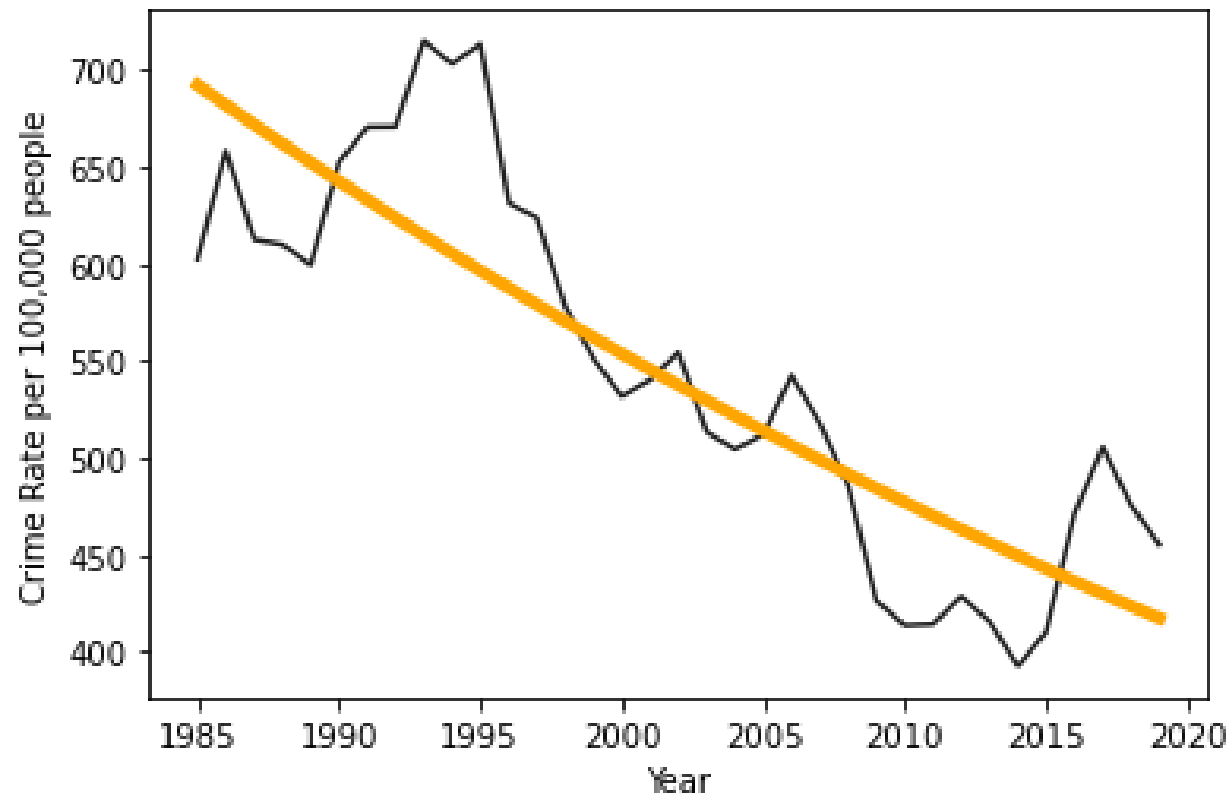
MODEL

RESULTS

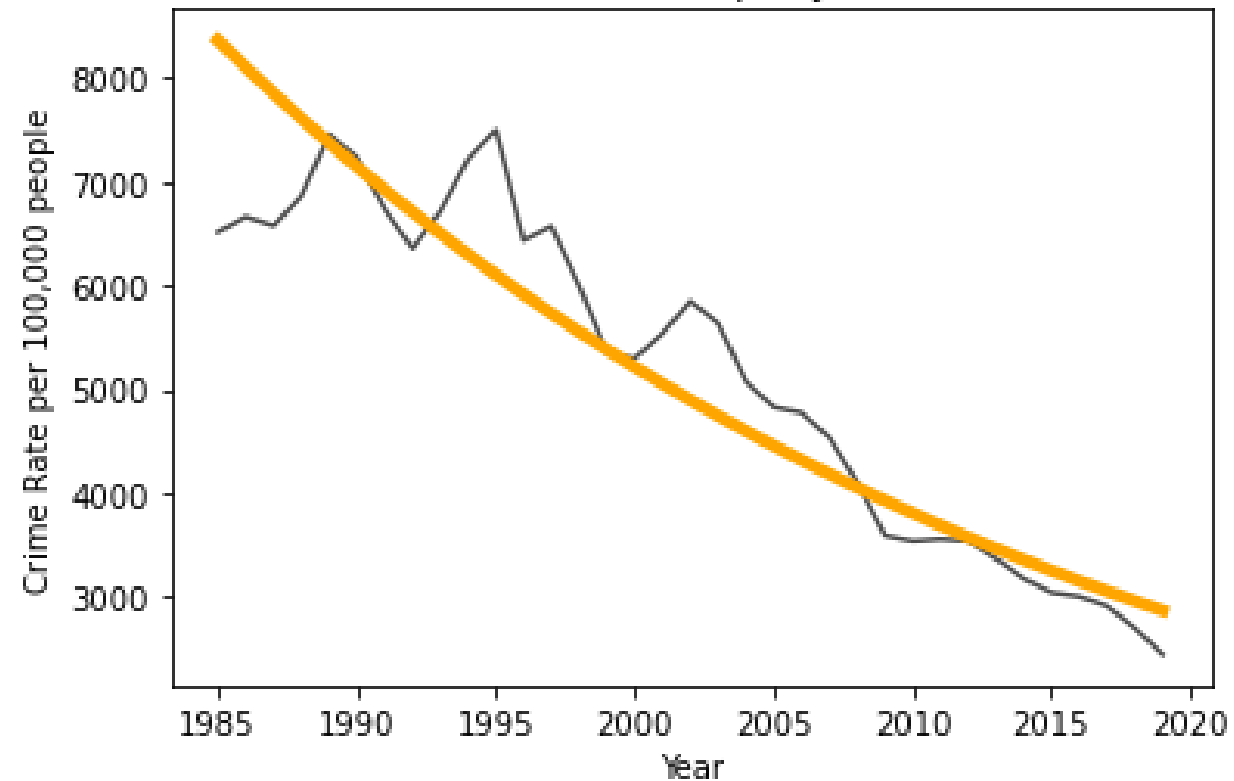
QUESTIONS

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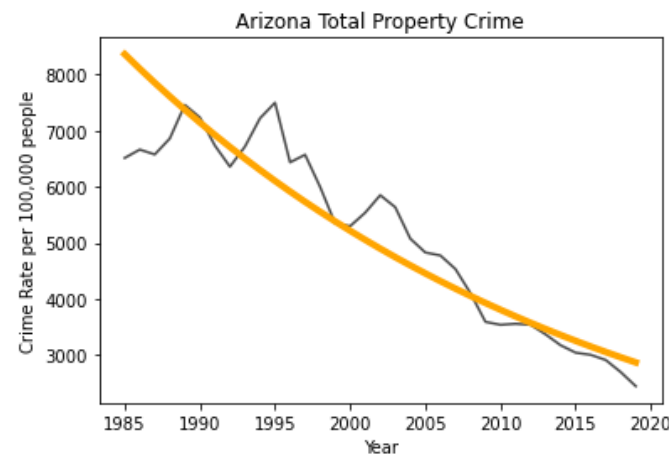
### Arizona Total Violent Crime



### Arizona Total Property Crime



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```

=====
OLS Regression Results
=====
Dep. Variable:          y      R-squared:                0.897
Model:                  OLS    Adj. R-squared:           0.894
Method:                 Least Squares
Date:                   Tue, 08 Dec 2020    F-statistic:              287.8
Time:                   04:48:32           Prob (F-statistic):       7.30e-18
                                Log-Likelihood:              28.306
No. Observations:       35      AIC:                     -52.61
Df Residuals:           33      BIC:                     -49.50
Df Model:                1
Covariance Type:        nonrobust
=====
                                coef      std err          t      P>|t|      [0.025      0.975]
-----
const                71.5935      3.719      19.250      0.000      64.027      79.160
x1                   -0.0315      0.002     -16.966      0.000      -0.035      -0.028
=====
Omnibus:                0.270    Durbin-Watson:           0.298
Prob(Omnibus):          0.874    Jarque-Bera (JB):        0.421
Skew:                   -0.171    Prob(JB):                0.810
Kurtosis:               2.586    Cond. No.                3.97e+05
=====

```

# 15-year predictions using the Log transformation model

DATASET

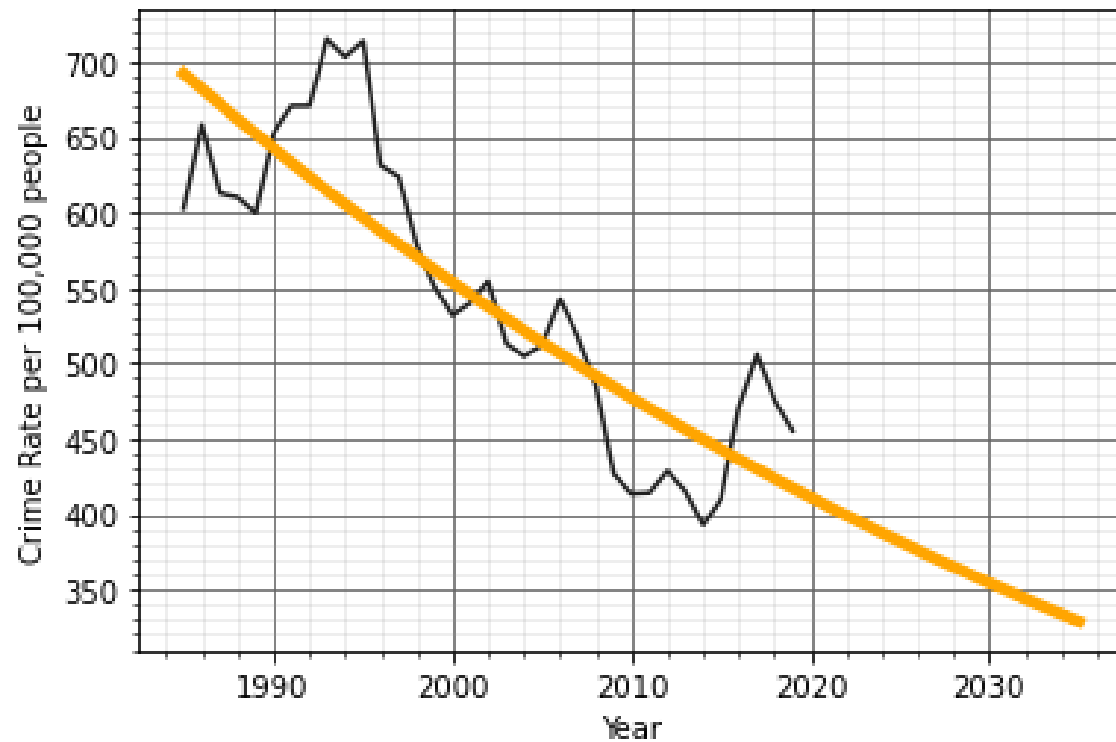
MODEL

RESULTS

QUESTIONS

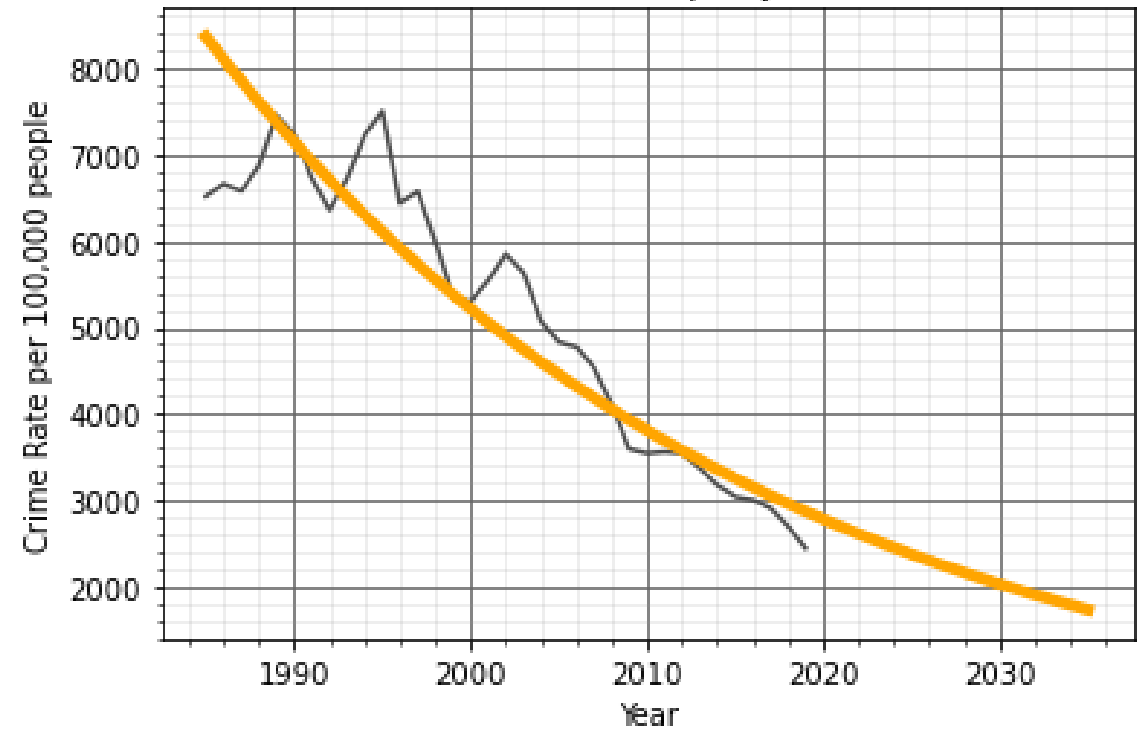
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Arizona Total Violent Crime



2019 - 2865.0 per 100,000	
2025 - 2371.4 per 100,000	17% decrease
2030 - 2025.7 per 100,000	29% decrease
2035 - 1730.3 per 100,000	40% decrease

Arizona Total Property Crime



2019 - 417.4 per 100,000	
2025 - 381.7 per 100,000	9% decrease
2030 - 354.3 per 100,000	15% decrease
2035 - 328.9 per 100,000	21% decrease

# Applying the model to other datasets

DATASET

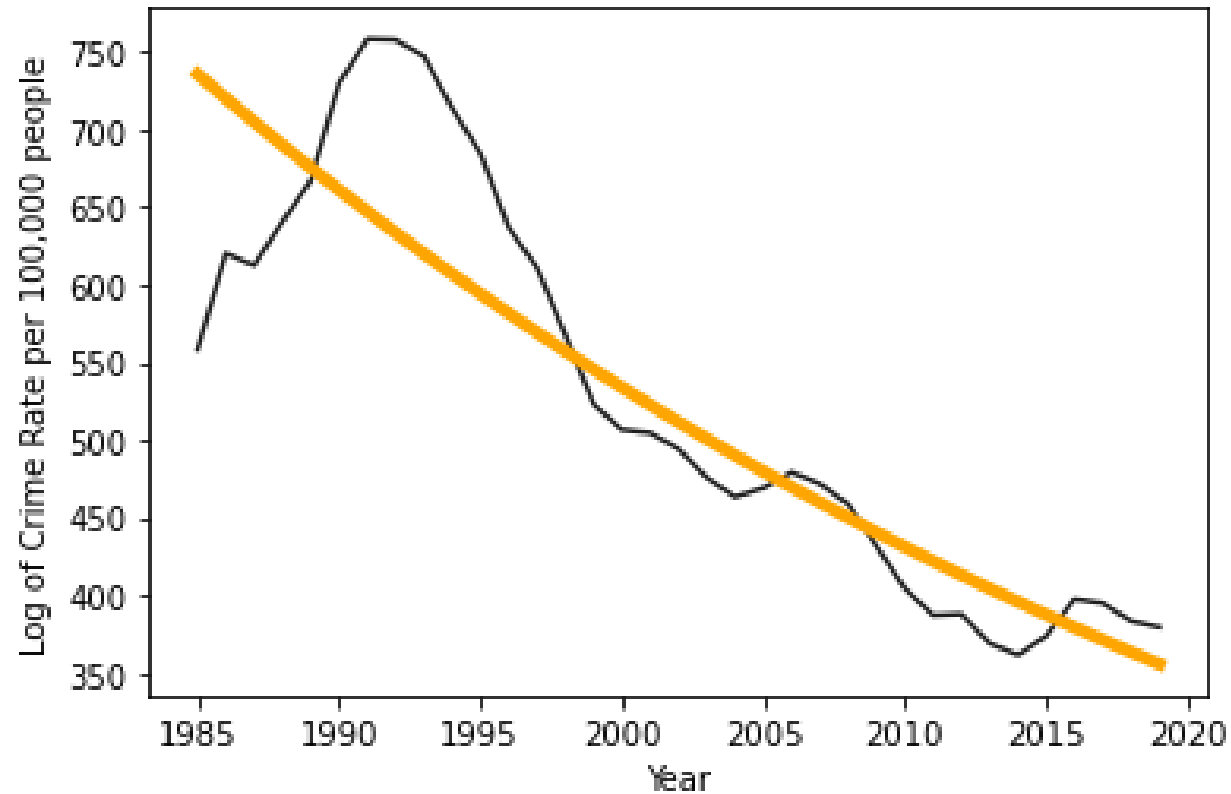
MODEL

RESULTS

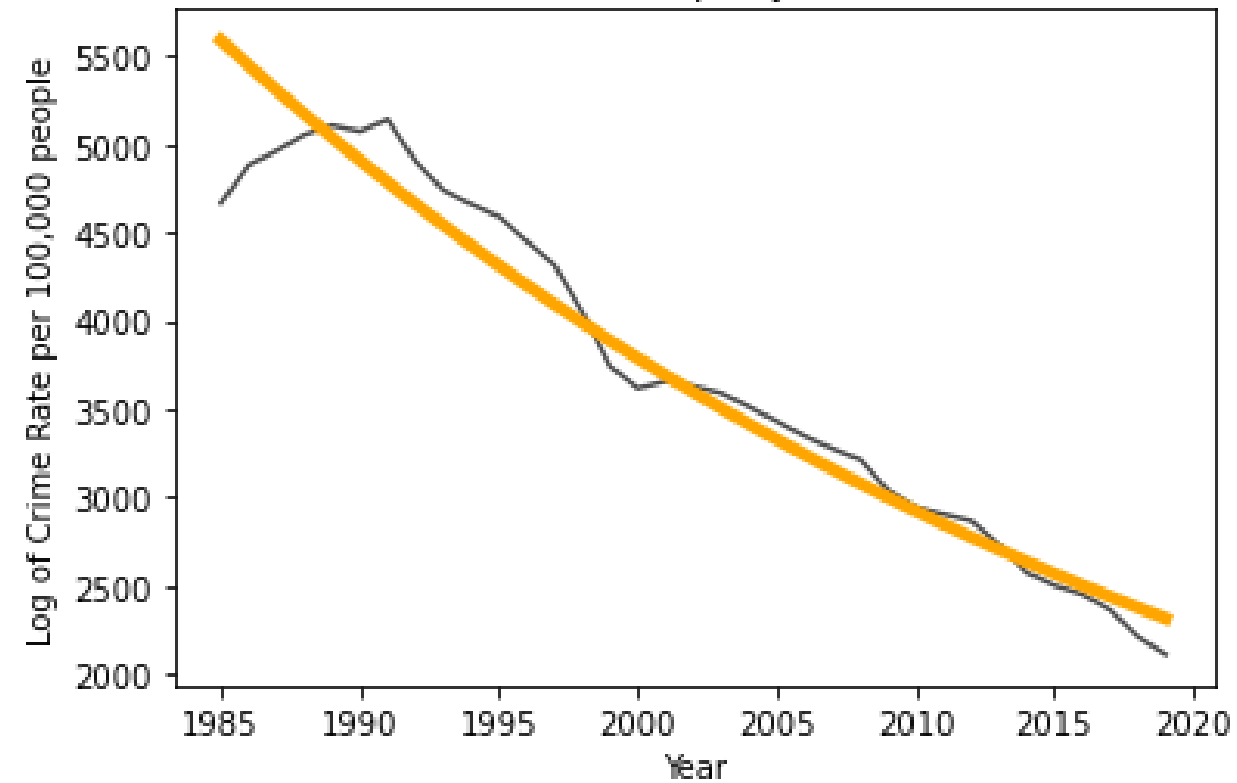
QUESTIONS

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## US Total Violent Crime



## US Total Property Crime



# Applying the model to other datasets

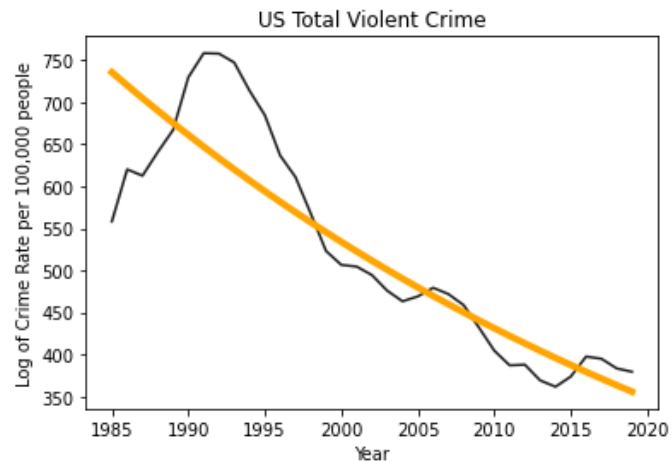
DATASET

MODEL

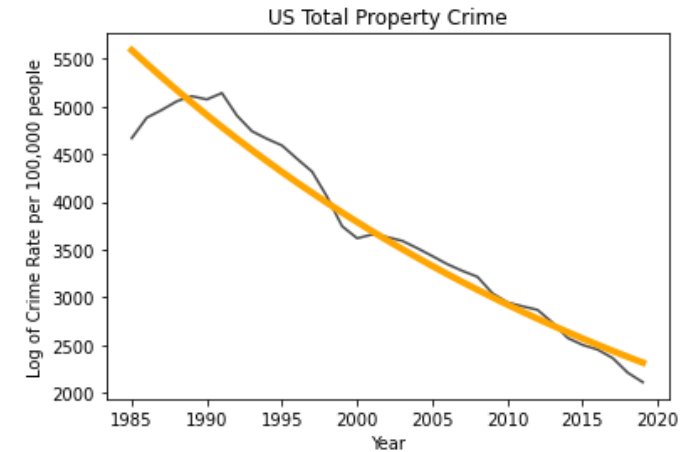
RESULTS

QUESTIONS

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OLS Regression Results						
=====						
Dep. Variable:	y	R-squared:	0.824			
Model:	OLS	Adj. R-squared:	0.819			
Method:	Least Squares	F-statistic:	155.0			
Date:	Tue, 08 Dec 2020	Prob (F-statistic):	5.15e-14			
Time:	07:05:03	Log-Likelihood:	31.077			
No. Observations:	35	AIC:	-58.15			
Df Residuals:	33	BIC:	-55.04			
Df Model:	1					
Covariance Type:	nonrobust					
=====						
	coef	std err	t	P> t	[0.025	0.975]
-----						
const	49.0094	3.436	14.263	0.000	42.019	56.000
x1	-0.0214	0.002	-12.448	0.000	-0.025	-0.018
=====						
Omnibus:	0.810	Durbin-Watson:	0.203			
Prob(Omnibus):	0.667	Jarque-Bera (JB):	0.200			
Skew:	-0.137	Prob(JB):	0.905			
Kurtosis:	3.250	Cond. No.	3.97e+05			
=====						



OLS Regression Results						
=====						
Dep. Variable:	y	R-squared:	0.959			
Model:	OLS	Adj. R-squared:	0.958			
Method:	Least Squares	F-statistic:	778.3			
Date:	Tue, 08 Dec 2020	Prob (F-statistic):	1.59e-24			
Time:	07:05:02	Log-Likelihood:	52.546			
No. Observations:	35	AIC:	-101.1			
Df Residuals:	33	BIC:	-97.98			
Df Model:	1					
Covariance Type:	nonrobust					
=====						
	coef	std err	t	P> t	[0.025	0.975]
-----						
const	60.0949	1.861	32.298	0.000	56.309	63.880
x1	-0.0259	0.001	-27.898	0.000	-0.028	-0.024
=====						
Omnibus:	14.284	Durbin-Watson:	0.238			
Prob(Omnibus):	0.001	Jarque-Bera (JB):	15.071			
Skew:	-1.329	Prob(JB):	0.000534			
Kurtosis:	4.808	Cond. No.	3.97e+05			



# Q & A

DATASET

MODEL

RESULTS

QUESTIONS

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