

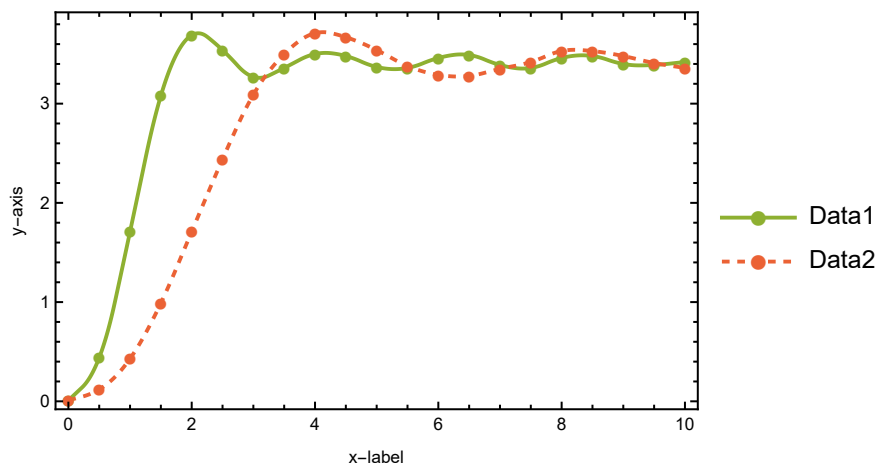
Note: This is going to be more of a “follow along” sort of class. So the notebook will be more sparse than usual, and mostly serves as an outline of the lecture.

Visualizing Data

ListPlot and ListLinePlot


```
In[ ]:= data1 = {{0., 0.01}, {0.5, 0.44}, {1., 1.71}, {1.5, 3.08},  
               {2., 3.69}, {2.5, 3.54}, {3., 3.27}, {3.5, 3.36}, {4., 3.5}, {4.5, 3.48},  
               {5., 3.37}, {5.5, 3.36}, {6., 3.46}, {6.5, 3.49}, {7., 3.39}, {7.5, 3.36},  
               {8., 3.46}, {8.5, 3.48}, {9., 3.4}, {9.5, 3.39}, {10., 3.42}};  
  
data2 = {{0., 0.01}, {0.5, 0.12}, {1., 0.43}, {1.5, 0.99},  
         {2., 1.71}, {2.5, 2.44}, {3., 3.09}, {3.5, 3.5}, {4., 3.71}, {4.5, 3.67},  
         {5., 3.54}, {5.5, 3.38}, {6., 3.29}, {6.5, 3.28}, {7., 3.35}, {7.5, 3.42},  
         {8., 3.53}, {8.5, 3.53}, {9., 3.48}, {9.5, 3.41}, {10., 3.36}};  
  
In[ ]:= ListPlot[{data1, data2}, PlotRange → All, Frame → True,  
                FrameLabel → {"x-label", "y-axis"}, Joined → True, InterpolationOrder → Automatic,  
                PlotMarkers → {"●", PlotLegends → {"Data1", "Data2"}},  
                PlotStyle → {ColorData[97, 3], Directive[{Dashed, ColorData[97, 4]}]}]
```

Out[]:=



```
In[ ]:= ColorData[97]
```

Out[]:=

ColorDataFunction[
 Index: 97 Colors: ∞
 Palette: 
]

\[FilledCircle] → "●"

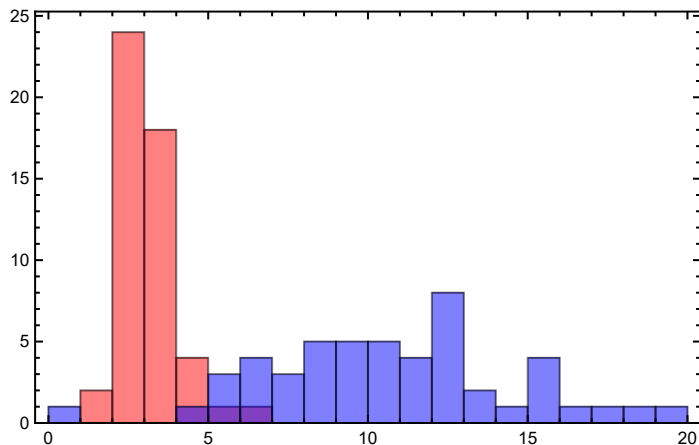
●

Histogram and SmoothHistogram

```
In[ ]:= data3 = {2.89175, 2.61613, 2.95601, 2.71121, 3.61643, 2.61884, 2.84275, 2.98486,
  2.87965, 4.6046, 3.00923, 5.42387, 2.09306, 3.00936, 3.79174, 2.95188, 1.64658,
  3.44998, 2.47346, 2.50094, 1.58891, 6.38088, 3.91435, 2.58256, 3.73725,
  2.53284, 3.15859, 3.19481, 2.16886, 2.57557, 3.55481, 4.67243, 2.88272,
  3.12072, 2.95147, 2.17699, 3.62933, 2.94488, 3.01143, 4.10778, 2.54096,
  2.49918, 3.93841, 3.085, 3.71711, 2.46394, 2.64561, 3.52655, 4.33454, 3.37427};
data4 = {0.711584, 9.20076, 10.6202, 12.5684, 15.208, 12.8391, 9.64308,
  9.7832, 17.2989, 5.22502, 19.1653, 8.93812, 13.1611, 4.17281, 10.956, 12.975,
  11.1901, 12.343, 15.0823, 10.1314, 12.0914, 6.17371, 12.1185, 6.88504, 8.54537,
  7.8976, 8.48243, 16.0958, 15.7727, 14.316, 6.26089, 11.1846, 10.2433, 12.5578,
  8.45365, 7.89192, 6.51205, 9.21282, 5.19501, 8.93034, 9.62611, 18.1242,
  15.1844, 12.1187, 11.7128, 13.975, 10.3568, 11.024, 7.35753, 5.94573};
```

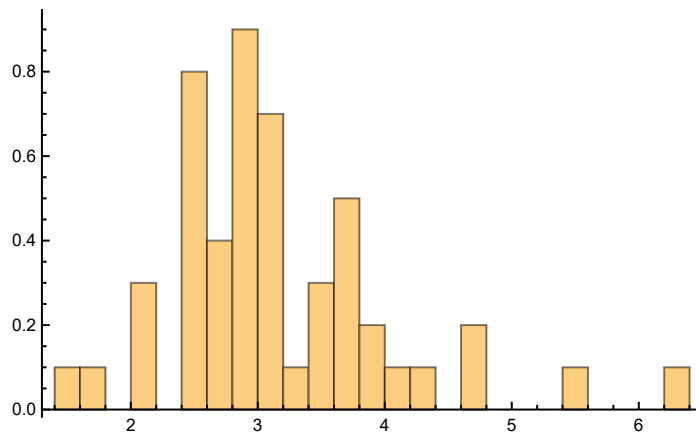
```
In[ ]:= Histogram[{data3, data4}, 15, Frame → True, ChartStyle → {Red, Blue}]
```

Out[]:=

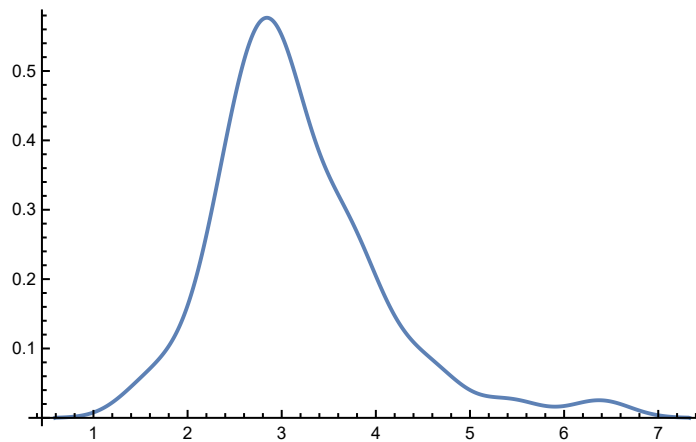


```
In[ ]:= Histogram[data3, 15, "PDF"]  
SmoothHistogram[data3]
```

Out[]:=



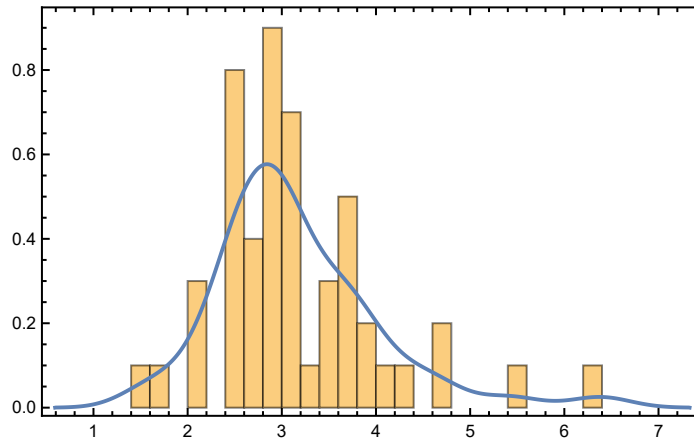
Out[]:=



Overlaying Plots with Show

```
In[ ]:= Show[ {  
  Histogram[data3, 15, "PDF"],  
  SmoothHistogram[data3]  
}, Frame → True, PlotRange → All, Axes → False]
```

Out[]:=



Many More!

<https://reference.wolfram.com/language/guide/DataVisualization.html>

Raw visualization with Grid

```
In[ ]:= data1 // Grid
```

```
Out[ ]:=
```

```
0. 0.01
0.5 0.44
1. 1.71
1.5 3.08
2. 3.69
2.5 3.54
3. 3.27
3.5 3.36
4. 3.5
4.5 3.48
5. 3.37
5.5 3.36
6. 3.46
6.5 3.49
7. 3.39
7.5 3.36
8. 3.46
8.5 3.48
9. 3.4
9.5 3.39
10. 3.42
```

Importing Data

The Import Function Import[]

Download example dataset here: https://drive.google.com/file/d/1bp-HtrjpPpEdmM43eQPla3DAXUa-jr4ku/view?usp=drive_link

```
In[ ]:= Import["C:\\Users\\Collin\\Downloads\\Week5Dataset (2).csv"]
```

```
Out[ ]:=
```

```
{ {Time (s), Channel 1 (V), Channel 2 (V)}, {-0.00511926, -1.01111, -2.57694}, {-0.00511801, -1.01478, -2.57325},
{-0.00511676, -1.01844, -2.57325}, {-0.00511551, -1.01478, -2.57694}, {-0.00511426, -1.01111, -2.57325},
{-0.00511301, -1.01478, -2.57325}, {-0.00511176, -1.01111, -2.57694}, {-0.00511051, -1.01111, -2.57325},
... 8175 ..., {0.00510949, 1.00128, 2.54519}, {0.00511074, 0.997619, 2.54888}, {0.00511199, 0.993953, 2.5415},
{0.00511324, 0.997619, 2.55257}, {0.00511449, 0.993953, 2.54888}, {0.00511574, 0.997619, 2.54519},
{0.00511699, 0.997619, 2.54519}, {0.00511824, 0.997619, 2.55257}, {0.00511949, 0.997619, 2.54888} }
```

Full expression not available (original memory size: 1 MB)



```
In[ ]:= data = {...} +;
```

How to import table data from a pdf?

View Example PDF here: https://drive.google.com/file/d/1OUzizDsIM4d1Sq4m_z_3MoQvxEgdEj-JA/view?usp=drive_link

```
In[ ]:= data2 = Partition[ToExpression /@ StringSplit["0 0 120
0.1 0.739 415
0.2 0.849 649
0.3 0.892 828
0.4 0.915 959
0.5 0.929 1050
0.6 0.938 1109
0.7 0.944 1150
0.8 0.95 1176
0.9 0.962 1210
1 1 1250"], 3(*Number of rows in your table*)]
```

```
Out[ ]:=
{{0, 0, 120}, {0.1, 0.739, 415}, {0.2, 0.849, 649},
{0.3, 0.892, 828}, {0.4, 0.915, 959}, {0.5, 0.929, 1050}, {0.6, 0.938, 1109},
{0.7, 0.944, 1150}, {0.8, 0.95, 1176}, {0.9, 0.962, 1210}, {1, 1, 1250}}
```

```
In[ ]:= data2 // Grid
```

```
Out[ ]:=
  0    0    120
0.1 0.739 415
0.2 0.849 649
0.3 0.892 828
0.4 0.915 959
0.5 0.929 1050
0.6 0.938 1109
0.7 0.944 1150
0.8 0.95  1176
0.9 0.962 1210
  1    1    1250
```

How can I import data from a scanned pdf or an image?

x_1	x_2	P [mmHg]
0	0	120
0.1	0.739	415
0.2	0.849	649
0.3	0.892	828
0.4	0.915	959
0.5	0.929	1050
0.6	0.938	1109
0.7	0.944	1150
0.8	0.95	1176
0.9	0.962	1210
1	1	1250

Example Image:

x_1	x_2	P [mmHg]
0	0	120
0.1	0.739	415
0.2	0.849	649
0.3	0.892	828
0.4	0.915	959
0.5	0.929	1050
0.6	0.938	1109
0.7	0.944	1150
0.8	0.95	1176
0.9	0.962	1210
1	1	1250

0	0	120
0.1	0.739	415
0.2	0.849	649
0.3	0.892	828
0.4	0.915	959
0.5	0.929	1050
0.6	0.938	1109
0.7	0.944	1150
0.8	0.95	1176
0.9	0.962	1210
1	1	1250

```
In[*]:= Partition[ToExpression /@ StringSplit[TextRecognize[, {" ", "\n"}], 3]
```

Out[*]=

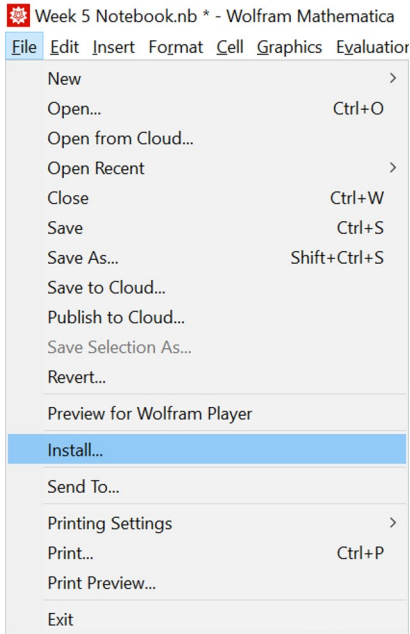
```
{{0, 0, 120}, {0.1, 0.739, 415}, {0.2, 0.849, 649},
 {0.3, 0.892, 828}, {0.4, 0.915, 959}, {0.5, 0.929, 1050}, {0.6, 0.938, 1109},
 {0.7, 0.944, 1150}, {0.8, 0.95, 1176}, {0.9, 0.962, 1210}, {Null, 1, 1}}
```

My preferred way of importing data

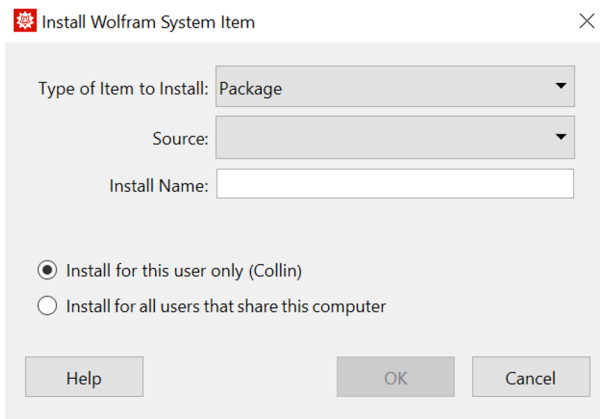
This works using a custom function I wrote which can be installed as follows

Installing my SpreadsheetEdit Package

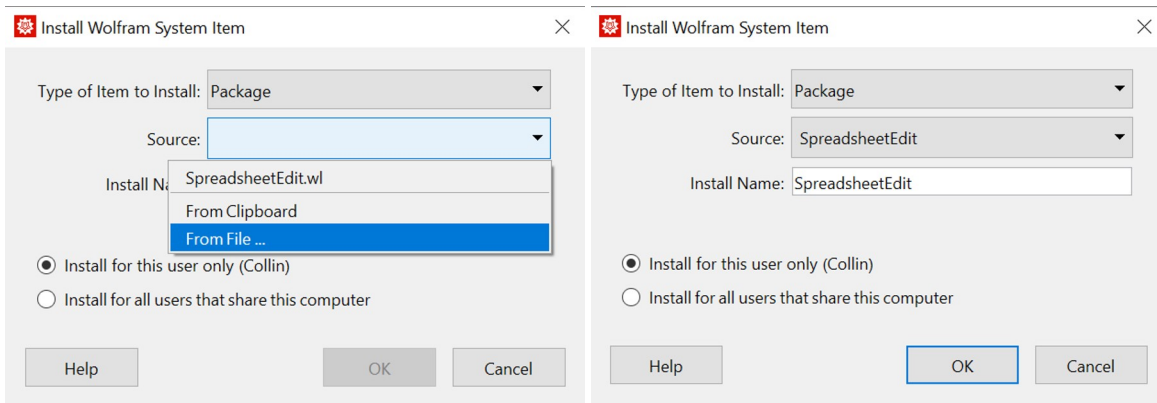
- Download the Mathematica Package file here: https://drive.google.com/file/d/1jv-mnb2ryPVfUQP2Ui6Me50_b224hll5/view?usp=drive_link
- Inside of Mathematica click on File > Install



- Set the type of install to “Package”



- The set the source to file and select the SpreadsheetEdit.wl file that you downloaded



- Leave the install name as “SpreadsheetEdit” and click “OK”

Using SpreadsheetEdit

Now that SpreadsheetEdit has been installed you can load the package in any notebook on your computer using the following

```
In[ ]:= Needs["SpreadsheetEdit`"]
```

Note that if you ever plan on sharing a notebook with someone else, they won't be able to use this package unless they also install it themselves.

```
In[ ]:= SpreadsheetEdit[{{...}}] // Iconize
```

```
Out[ ]:=
```



Analyzing Data

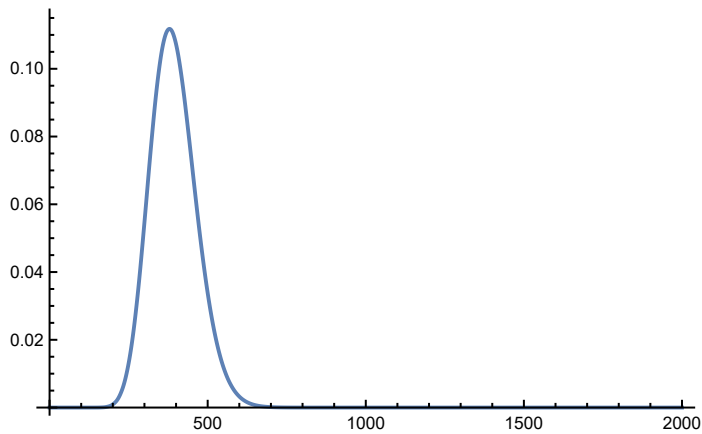
Yet another example data set: https://docs.google.com/spreadsheets/d/152ZTudb8YgkI00XGE7vIAx7gG-bKBv_DN/edit?usp=drive_link&oid=102495462541733164891&rtpof=true&sd=true

Interpolation

```
In[ ]:= data = {{0, 0}, {20, 0}, {40, 0}, {60, 0}, {80, 0}, {100, 1.16029`*^-10}, {120, 4.36176`*^-8},
{140, 1.76819`*^-6}, {160, 0.0000252811`}, {180, 0.000190681`}, {200, 0.000923138`},
{220, 0.003212027`}, {240, 0.008632948`}, {260, 0.018828078`}, {280, 0.0345222`},
{300, 0.054641447`}, {320, 0.076193932`}, {340, 0.095119986`}, {360, 0.107695436`},
{380, 0.111764194`}, {400, 0.107255004`}, {420, 0.095888541`}, {440, 0.080370327`},
{460, 0.063498734`}, {480, 0.047513989`}, {500, 0.033810651`}, {520, 0.022963329`},
{540, 0.014933398`}, {560, 0.009325356`}, {580, 0.005606159`}, {600, 0.003252047`},
{620, 0.001824069`}, {640, 0.000991143`}, {660, 0.000522619`}, {680, 0.000267836`},
{700, 0.0001336`}, {720, 0.0000649492`}, {740, 0.0000308102`}, {760, 0.0000142777`},
{780, 6.47011`*^-6}, {800, 2.86996`*^-6}, {820, 1.24721`*^-6}, {840, 5.31455`*^-7},
{860, 2.22225`*^-7}, {880, 9.12508`*^-8}, {900, 3.68209`*^-8}, {920, 1.46099`*^-8},
{940, 5.70364`*^-9}, {960, 2.1921`*^-9}, {980, 8.29855`*^-10}, {1000, 3.09598`*^-10},
{1020, 1.13883`*^-10}, {1040, 0}, {1060, 0}, {1080, 0}, {1100, 0}, {1120, 0},
{1140, 0}, {1160, 0}, {1180, 0}, {1200, 0}, {1220, 0}, {1240, 0}, {1260, 0}, {1280, 0},
{1300, 0}, {1320, 0}, {1340, 0}, {1360, 0}, {1380, 0}, {1400, 0}, {1420, 0}, {1440, 0},
{1460, 0}, {1480, 0}, {1500, 0}, {1520, 0}, {1540, 0}, {1560, 0}, {1580, 0},
{1600, 0}, {1620, 0}, {1640, 0}, {1660, 0}, {1680, 0}, {1700, 0}, {1720, 0},
{1740, 0}, {1760, 0}, {1780, 0}, {1800, 0}, {1820, 0}, {1840, 0}, {1860, 0},
{1880, 0}, {1900, 0}, {1920, 0}, {1940, 0}, {1960, 0}, {1980, 0}, {2000, 0}};
```

```
In[ ]:= ListPlot[data, PlotRange → All, Joined → True, InterpolationOrder → Automatic]
```

```
Out[ ]:=
```



```
In[ ]:= ifun = Interpolation[data]
```

```
Out[ ]:=
```

InterpolatingFunction[ Domain: $\{0., 2.00 \times 10^3\}$
Output: scalar]

```
In[ ]:= ifun[310]
```

```
Out[ ]:=
```

0.0654923

```
In[ ]:= D_x ifun[x] /. x → 310
```

```
Out[ ]:=
```

0.00108608

```
In[ ]:= A = Integrate[ifun[x], {x, 0, 2000}]
```

```
In[ ]:= μ = Integrate[ $\frac{\text{ifun}[x]}{A} x$ , {x, 0, 2000}] // N
```

```
μ2 = Integrate[ $\frac{\text{ifun}[x]}{A} x^2$ , {x, 0, 2000}] // N;
```

```
σ =  $\sqrt{\mu2 - \mu^2}$ 
```

```
Out[ ]:=
```

392.273

```
Out[ ]:=
```

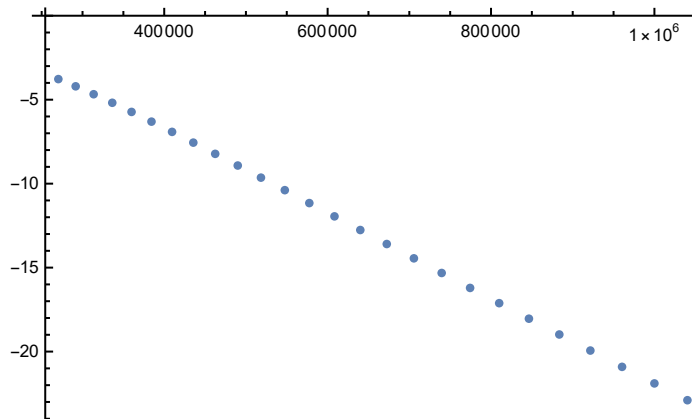
72.1924

Linear Regression

```
In[ ]:= linData = Cases[data, {x_ /; 270400 ≤ x^2 ≤ 1040400, y_} :> {x^2, Log[y]}];
```

```
In[ ]:= ListPlot[linData]
```

```
Out[ ]:=
```



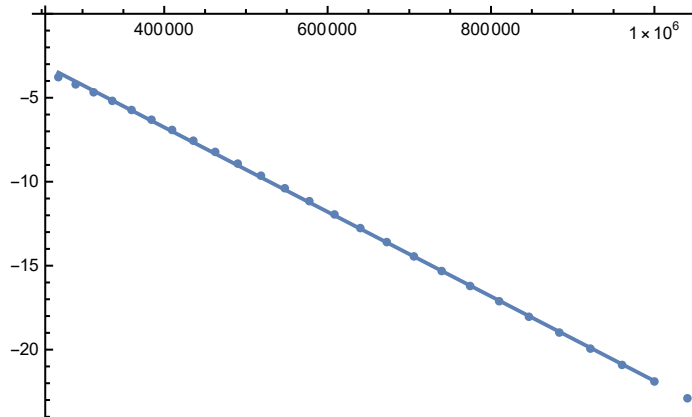
```
In[ ]:= model1 = LinearModelFit[linData, x, x]
```

```
Out[ ]:=
```

```
FittedModel[ 3.30891 - 0.0000251726 x ]
```

```
In[ ]:= Show[{
  ListPlot[linData],
  Plot[model1[x], {x, 270400, 10^6}]
}]
```

```
Out[ ]:=
```



```
In[ ]:= model1["Properties"]
```

```
Out[ ]:=
```

```
{AdjustedRSquared, AIC, AICc, ANOVATable, ANOVATableDegreesOfFreedom, ANOVATableEntries,
ANOVATableFStatistics, ANOVATableMeanSquares, ANOVATablePValues, ANOVATableSumsOfSquares,
BasisFunctions, BetaDifferences, BestFit, BestFitParameters, BIC, CatcherMatrix,
CoefficientOfVariation, CookDistances, CorrelationMatrix, CovarianceMatrix,
CovarianceRatios, Data, DesignMatrix, DurbinWatsonD, EigenstructureTable,
EigenstructureTableEigenvalues, EigenstructureTableEntries, EigenstructureTableIndexes,
EigenstructureTablePartitions, EstimatedVariance, FitDifferences, FitResiduals, Function,
FVarianceRatios, HatDiagonal, MeanPredictionBands, MeanPredictionConfidenceIntervals,
MeanPredictionConfidenceIntervalTable, MeanPredictionConfidenceIntervalTableEntries,
MeanPredictionErrors, ParameterConfidenceIntervals, ParameterConfidenceIntervalTable,
ParameterConfidenceIntervalTableEntries, ParameterConfidenceRegion, ParameterErrors,
ParameterPValues, ParameterTable, ParameterTableEntries, ParameterTStatistics,
PartialSumOfSquares, PredictedResponse, Properties, Response, RSquared,
SequentialSumOfSquares, SingleDeletionVariances, SinglePredictionBands,
SinglePredictionConfidenceIntervals, SinglePredictionConfidenceIntervalTable,
SinglePredictionConfidenceIntervalTableEntries, SinglePredictionErrors,
StandardizedResiduals, StudentizedResiduals, VarianceInflationFactors}
```

```
In[ ]:= model1["RSquared"]
```

```
Out[ ]:=
```

```
0.999776
```

```
In[ ]:= model1["ParameterConfidenceIntervalTable"]
```

```
Out[ ]:=
```

	Estimate	Standard Error	Confidence Interval
1	3.30891	0.0506086	{3.20446, 3.41336}
x	-0.0000251726	7.69557×10^{-8}	{-0.0000253314, -0.0000250137}

```
In[ ]:= model1["ParameterTable"]
```

```
Out[ ]:=
```

	Estimate	Standard Error	t-Statistic	P-Value
1	3.30891	0.0506086	65.3824	1.48159×10^{-28}
x	-0.0000251726	7.69557×10^{-8}	-327.105	2.60761×10^{-45}

Non-Linear Regression

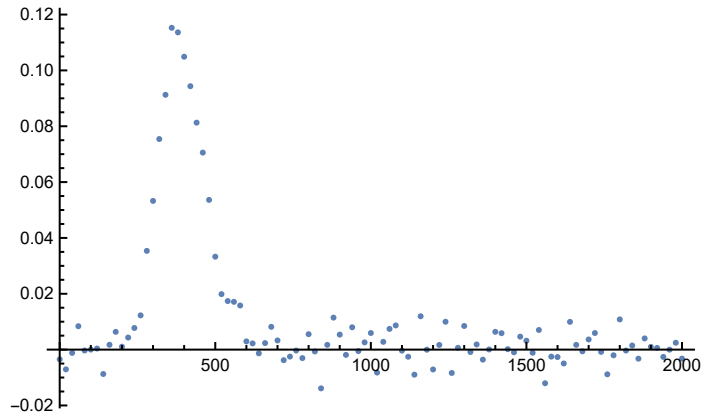
In[]:= (*Add artificial noise to the data*)

SeedRandom[3875];

NoisyData = data /. {x_, y_} -> {x, y + RandomVariate[NormalDistribution[0, 0.005]]};

ListPlot[NoisyData, PlotRange -> All]

Out[]:=



In[]:= NormalDistribution[μ0, σ0] // PDF

Out[]:=

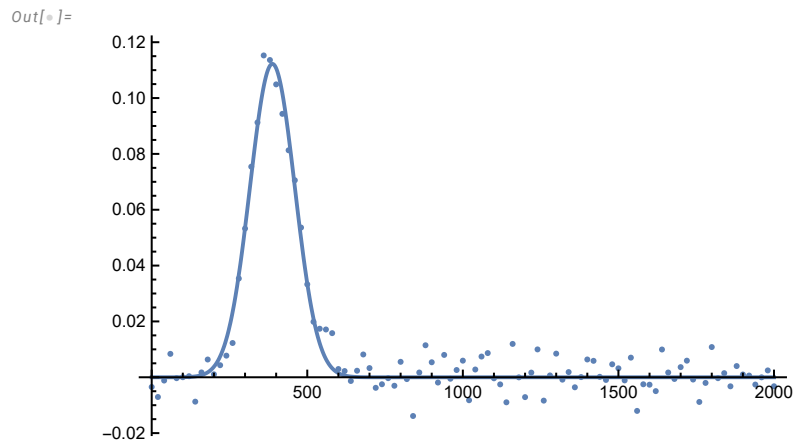
$$\text{Function}\left[x, \frac{e^{-\frac{(x-\mu_0)^2}{2\sigma_0^2}}}{\sqrt{2\pi}\sigma_0}\right]$$

In[]:= model1 = NonlinearModelFit[NoisyData, $\frac{A_0 e^{-\frac{(x-\mu_0)^2}{2\sigma_0^2}}}{\sqrt{2\pi}\sigma_0}$, {{A0, 1}, {μ0, 360}, {σ0, 100}}, x]

Out[]:=

$$\text{FittedModel}\left[0.112229 e^{-0.0000960871 (-387.924 + x)^2}\right]$$

```
In[ ]:= Show[ {
  ListPlot[NoisyData, PlotRange -> All],
  Plot[model12[x], {x, 0, 2000}, PlotRange -> All]
}]
```



```
In[ ]:= model12["Properties"]
```

Out[]:=

```
{AdjustedRSquared, AIC, AICc, ANOVATable, ANOVATableDegreesOfFreedom, ANOVATableEntries,
 ANOVATableMeanSquares, ANOVATableSumsOfSquares, BestFit, BestFitParameters, BIC,
 CorrelationMatrix, CovarianceMatrix, CurvatureConfidenceRegion, Data, EstimatedVariance,
 FitCurvatureTable, FitCurvatureTableEntries, FitResiduals, Function, HatDiagonal,
 MaxIntrinsicCurvature, MaxParameterEffectsCurvature, MeanPredictionBands,
 MeanPredictionConfidenceIntervals, MeanPredictionConfidenceIntervalTable,
 MeanPredictionConfidenceIntervalTableEntries, MeanPredictionErrors,
 ParameterBias, ParameterConfidenceIntervals, ParameterConfidenceIntervalTable,
 ParameterConfidenceIntervalTableEntries, ParameterConfidenceRegion,
 ParameterErrors, ParameterPValues, ParameterTable, ParameterTableEntries,
 ParameterTStatistics, PredictedResponse, Properties, Response, RSquared,
 SingleDeletionVariances, SinglePredictionBands, SinglePredictionConfidenceIntervals,
 SinglePredictionConfidenceIntervalTable, SinglePredictionConfidenceIntervalTableEntries,
 SinglePredictionErrors, StandardizedResiduals, StudentizedResiduals}
```

```
In[ ]:= model12["ParameterConfidenceIntervalTable"]
```

Out[]:=

	Estimate	Standard Error	Confidence Interval
A0	20.2931	0.492436	{19.3159, 21.2703}
μ_0	387.924	2.02127	{383.912, 391.935}
σ_0	72.1361	2.02127	{68.1249, 76.1472}