

```
Quit[];
```

Central Limit

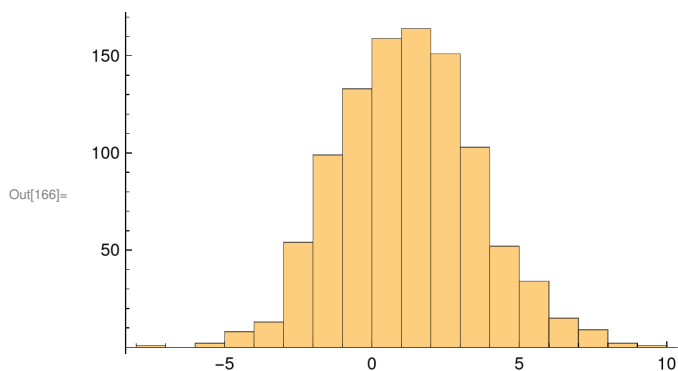
χ^2 distribution

Capture/Recapture

Hypothesis Tests: z-Test

z-Test: H_0 is true

```
In[161]:=  $\mu_0 = 1.2$  ;  
Ndata = 1000 ;  
 $\mu_{data} = \mu_0$  ;  
 $\sigma_{data} = 2.3$  ;  
data = RandomVariate [NormalDistribution [ $\mu_{data}$ ,  $\sigma_{data}$ ], {Ndata}];  
Histogram[data]
```



```
In[167]:= (* This is what we would do *)  
z = (Mean[data] -  $\mu_0$ ) / ( $\sigma_{data}$  / Sqrt[Ndata])  
pvalue1 = 1 - CDF[NormalDistribution [], z] (* Right-sided*)  
pvalue2 = CDF[NormalDistribution [], z] (* Left-sided*)  
pvalue3 = 2 CDF[NormalDistribution [], -Abs[z]] (* Two-sided*)
```

Out[167]= 0.360679

Out[168]= 0.35917

Out[169]= 0.64083

Out[170]= 0.718339

```
In[171]:= (* This is the Mathematica implementaion of the z-test *)
ZTest[data,  $\sigma$ data^2,  $\mu$ 0, "TestDataTable", AlternativeHypothesis → "Greater"]
ZTest[data,  $\sigma$ data^2,  $\mu$ 0, "TestDataTable", AlternativeHypothesis → "Less"]
ZTest[data,  $\sigma$ data^2,  $\mu$ 0, "TestDataTable"]
```

```
Out[171]= 

|   | Statistic | P-Value |
|---|-----------|---------|
| Z | 0.360679  | 0.35917 |


```

```
Out[172]= 

|   | Statistic | P-Value |
|---|-----------|---------|
| Z | 0.360679  | 0.64083 |


```

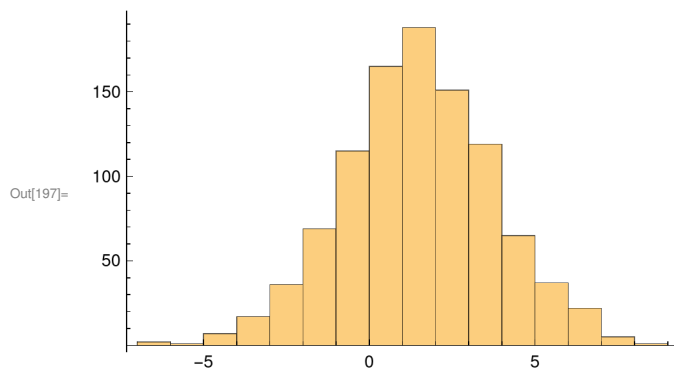
```
Out[173]= 

|   | Statistic | P-Value  |
|---|-----------|----------|
| Z | 0.360679  | 0.718339 |


```

z-Test: $H_A = H_1$ is true

```
In[192]:=  $\mu$ 0 = 1.2;
Ndata = 1000;
 $\mu$ data =  $\mu$ 0 + 0.35;
 $\sigma$ data = 2.3;
data = RandomVariate[NormalDistribution[ $\mu$ data,  $\sigma$ data], {Ndata}];
Histogram[data]
```



```
In[198]:= ZTest[data,  $\sigma$ data^2,  $\mu$ 0, "TestDataTable", AlternativeHypothesis → "Greater"]
ZTest[data,  $\sigma$ data^2,  $\mu$ 0, "TestDataTable", AlternativeHypothesis → "Less"]
ZTest[data,  $\sigma$ data^2,  $\mu$ 0, "TestDataTable"]
```

```
Out[198]= 

|   | Statistic | P-Value      |
|---|-----------|--------------|
| Z | 3.75063   | 0.0000881952 |


```

```
Out[199]= 

|   | Statistic | P-Value  |
|---|-----------|----------|
| Z | 3.75063   | 0.999912 |


```

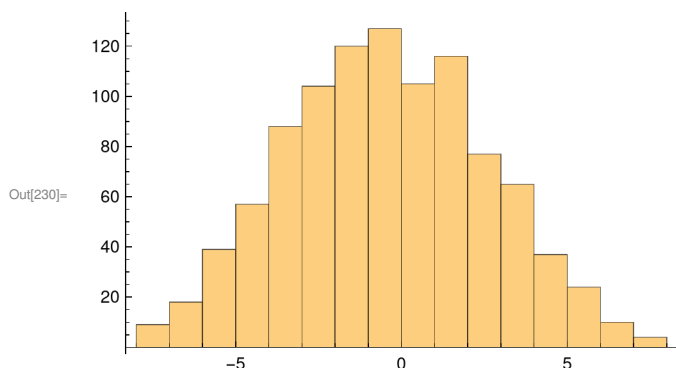
```
Out[200]= 

|   | Statistic | P-Value    |
|---|-----------|------------|
| Z | 3.75063   | 0.00017639 |


```

z-Test: the data is not normally distributed

```
In[225]:=  $\mu_0 = 1.2$ ;
Ndata = 1000;
 $\mu_{data} = \mu_0 + 0.35$ ;
 $\sigma_{data} = 2.3$ ;
data = Join[RandomVariate[NormalDistribution[ $\mu_{data}$ ,  $\sigma_{data}$ ], {Ndata / 2}],
  RandomVariate[NormalDistribution[ $\mu_{data} - 4$ ,  $\sigma_{data}$ ], {Ndata / 2}]];
Histogram[
  data]
```



```
In[231]:= ZTest[data,  $\sigma_{data}^2$ ,  $\mu_0$ , "TestDataTable", AlternativeHypothesis → "Greater"]
ZTest[data,  $\sigma_{data}^2$ ,  $\mu_0$ , "TestDataTable", AlternativeHypothesis → "Less"]
ZTest[data,  $\sigma_{data}^2$ ,  $\mu_0$ , "TestDataTable"]
```

ZTest : At least one of the p-values in {0.0283455}, resulting from a test for normality, is below 0.05. The tests in {Z} require that the data is normally distributed.

Out[231]=

	Statistic	P-Value
Z	-22.4381	1.

ZTest : At least one of the p-values in {0.0283455}, resulting from a test for normality, is below 0.05. The tests in {Z} require that the data is normally distributed.

Out[232]=

	Statistic	P-Value
Z	-22.4381	8.36374×10^{-112}

ZTest : At least one of the p-values in {0.0283455}, resulting from a test for normality, is below 0.05. The tests in {Z} require that the data is normally distributed.

Out[233]=

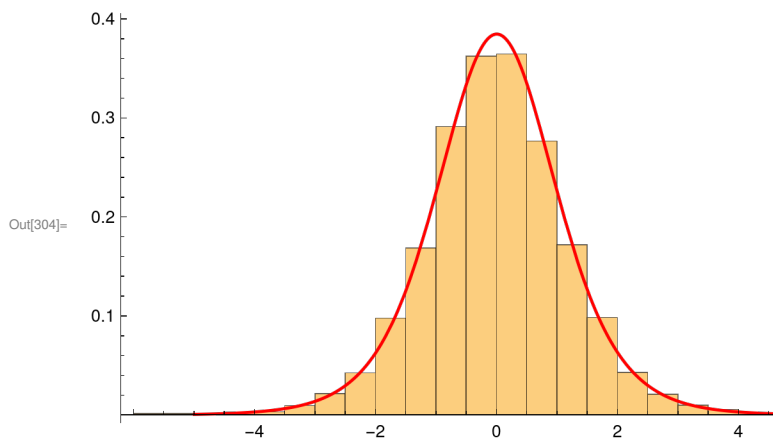
	Statistic	P-Value
Z	-22.4381	1.67275×10^{-111}

Hypothesis Tests: one-sample t-Test

t-statistic is Student's t

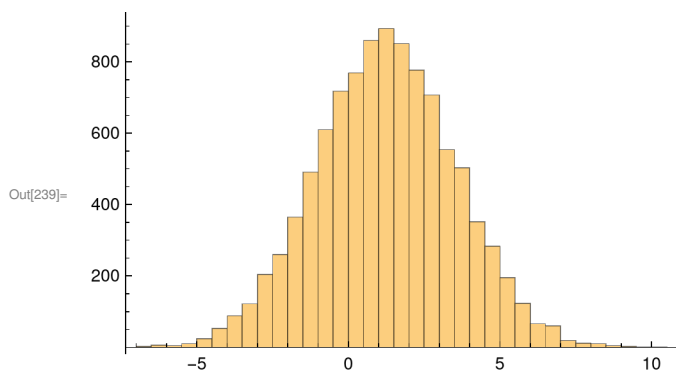
```
In[289]:= (* A function that generates a value for the t-statistic with ndof dofs*)
Generatet[ndof_] := Module[{data,  $\mu_0$ ,  $\sigma_0$ },
   $\mu_0$  = Random[];
   $\sigma_0$  = Random[];
  data = RandomVariate[NormalDistribution[ $\mu_0$ ,  $\sigma_0$ ], {ndof + 1}];
  (Mean[data] -  $\mu_0$ ) / (StandardDeviation[data] / Sqrt[ndof + 1]);
```

```
In[302]:= (* The variable t is distributed as a student's t with N dof *)
NdoF = 7;
ti = Table[Generatet[NdoF], {10^4}];
Show[Histogram[ti, Automatic, "PDF"], Plot[PDF[StudentTDistribution[NdoF], x],
  {x, -5, 5}, PlotRange -> {All, {0, 0.55}}, PlotStyle -> Red]]
```



t-Test: H_0 is true

```
In[234]:=  $\mu_0 = 1.2$ ;
Ndata = 10 000;
 $\mu_{data} = \mu_0$ ;
 $\sigma_{data} = 2.3$ ;
data = RandomVariate [NormalDistribution [ $\mu_{data}$ ,  $\sigma_{data}$ ], {Ndata}];
Histogram[data]
```



```
In[248]:= (* This is what we would do *)
t = (Mean[data] -  $\mu_0$ ) / (StandardDeviation [data] / Sqrt[Ndata])
pvalue1 = 1 - CDF[StudentTDistribution [Ndata - 1], t] (* Right-sided *)
pvalue2 = CDF[StudentTDistribution [Ndata - 1], t] (* Left-sided *)
pvalue3 = 2 CDF[StudentTDistribution [Ndata - 1], -Abs[t]] (* Two-sided *)
```

Out[248]= 1.67755

Out[249]= 0.0467332

Out[250]= 0.953267

Out[251]= 0.0934664

```
In[252]:= (* This is the Mathematica implementaion of the z-test *)
TTest[data,  $\mu_0$ , "TestDataTable ", AlternativeHypothesis → "Greater"]
TTest[data,  $\mu_0$ , "TestDataTable ", AlternativeHypothesis → "Less"]
TTest[data,  $\mu_0$ , "TestDataTable "]
```

Out[252]=

	Statistic	P-Value
T	1.67755	0.0467332

Out[253]=

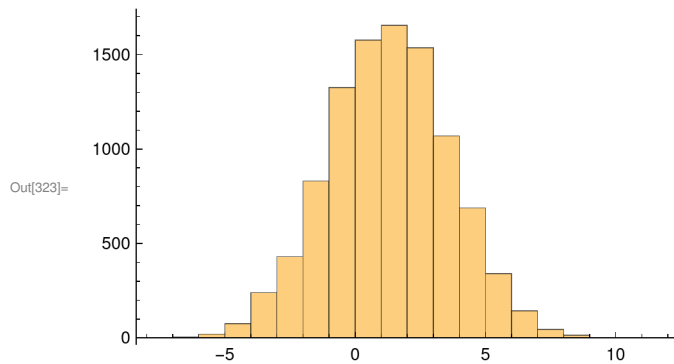
	Statistic	P-Value
T	1.67755	0.953267

Out[254]=

	Statistic	P-Value
T	1.67755	0.0934664

t-Test: $H_A = H_1$ is true

```
In[318]:=  $\mu_0 = 1.2$ ;
Ndata = 10 000;
 $\mu_{data} = \mu_0 + 0.1$ ;
 $\sigma_{data} = 2.3$ ;
data = RandomVariate[NormalDistribution[ $\mu_{data}$ ,  $\sigma_{data}$ ], {Ndata}];
Histogram[data]
```



```
In[328]:= (* This is the Mathematica implementation of the z-test *)
TTest[data,  $\mu_0$ , "TestDataTable ", AlternativeHypothesis → "Greater"]
TTest[data,  $\mu_0$ , "TestDataTable ", AlternativeHypothesis → "Less"]
TTest[data,  $\mu_0$ , "TestDataTable "]
```

Out[328]=

	Statistic	P-Value
T	4.14334	0.0000172555

Out[329]=

	Statistic	P-Value
T	4.14334	0.999983

Out[330]=

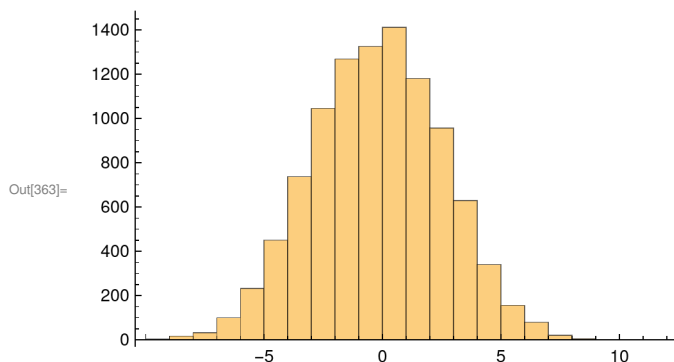
	Statistic	P-Value
T	4.14334	0.000034511

t-Test: the data is not normally distributed

```

In[358]:=  $\mu_0 = 1.2$ ;
Ndata = 10 000;
 $\mu_{data} = \mu_0 + 0.1$ ;
 $\sigma_{data} = 2.3$ ;
data = Join[RandomVariate[NormalDistribution[ $\mu_{data}$ ,  $\sigma_{data}$ ], {Ndata / 2}],
  RandomVariate[NormalDistribution[ $\mu_{data} - 3$ ,  $\sigma_{data}$ ], {Ndata / 2}]];
Histogram[
  data]

```



```

In[364]:= (* This is the Mathematica implementaion of the z-test *)
TTest[data,  $\mu_0$ , "TestDataTable ", AlternativeHypothesis → "Greater"]
TTest[data,  $\mu_0$ , "TestDataTable ", AlternativeHypothesis → "Less"]
TTest[data,  $\mu_0$ , "TestDataTable "]

```

... **TTest** : At least one of the p-values in {0.000413775 }, resulting from a test for normality , is below 0.05` . The tests in {T} require that the data is normally distributed .

Out[364]=

	Statistic	P-Value
T	-50.961	1.

... **TTest** : At least one of the p-values in {0.000413775 }, resulting from a test for normality , is below 0.05` . The tests in {T} require that the data is normally distributed .

... **General** : 4.06176644590730448412463221358759971`23.241328587689207*⁻⁵⁰⁴ is too small to represent as a normalized machine number ; precision may be lost .

Out[365]=

	Statistic	P-Value
T	-50.961	0.

... **TTest** : At least one of the p-values in {0.000413775 }, resulting from a test for normality , is below 0.05` . The tests in {T} require that the data is normally distributed .

... **General** : 4.06176644590730448412463221358759971`23.241328587689207*⁻⁵⁰⁴ is too small to represent as a normalized machine number ; precision may be lost .

Out[366]=

	Statistic	P-Value
T	-50.961	0.

Hypothesis Tests: two-sample t-Test

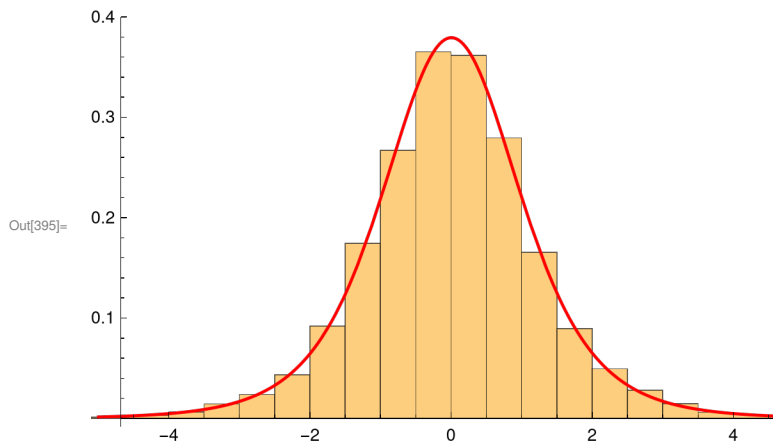
two-sample t-statistic is Student's t

```
In[383]:= (* A function that generates a value for the t-statistic with ndof dofs*)
Generatet2[ndof_] := Module[{ndata1, ndata2, data1, data2,  $\mu$ 1,  $\mu$ 2,  $\sigma$ , PooledVariance},
   $\mu$ 1 = Random[];  $\mu$ 2 = Random[];
   $\sigma$  = RandomReal[{0, 2}];
  ndata1 = RandomInteger[{2, ndof}];
  ndata2 = ndof - ndata1 + 2;
  data1 = RandomVariate[NormalDistribution[ $\mu$ 1,  $\sigma$ ], {ndata1}];
  data2 = RandomVariate[NormalDistribution[ $\mu$ 2,  $\sigma$ ], {ndata2}];
  PooledVariance =
    (1/ndata1 + 1/ndata2)/ndof ((ndata1 - 1) Variance[data1] + (ndata2 - 1) Variance[data2]);
  (Mean[data1] - Mean[data2] - ( $\mu$ 1 -  $\mu$ 2))/Sqrt[PooledVariance]];

```

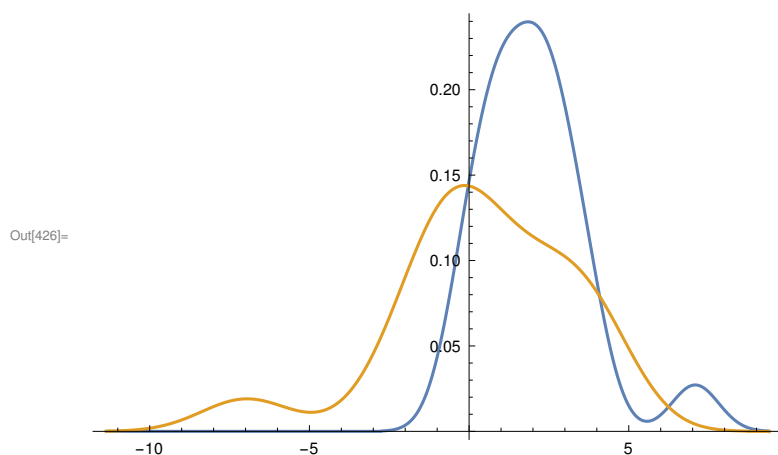
```
In[393]:= (* The variable t is distributed as a student's t with N dof *)
N dof = 5;
ti = Table[Generatet2[N dof], {10^4}];
Show[Histogram[ti, Automatic, "PDF"], Plot[PDF[StudentTDistribution[N dof], x],
  {x, -5, 5}, PlotRange -> {All, {0, 0.55}}, PlotStyle -> Red]]

```



two-sample t-Test: H_0 is true

```
In[418]:=  $\mu_0 = 1.2$ ;
Ndata1 = 20;
Ndata2 = 15;
 $\mu_{data1} = 1.5$ ;
 $\mu_{data2} = 0.3$ ;
 $\sigma_{data} = 2.3$ ;
data1 = RandomVariate[NormalDistribution[ $\mu_{data1}$ ,  $\sigma_{data}$ ], {Ndata1}];
data2 = RandomVariate[NormalDistribution[ $\mu_{data2}$ ,  $\sigma_{data}$ ], {Ndata2}];
SmoothHistogram[{data1, data2}]
```



```
In[449]:= (* This is the Mathematica implementaion of the t-test *)
TTest[{data1, data2},  $\mu_0$ , "TestDataTable ", AlternativeHypothesis  $\rightarrow$  "Greater"]
TTest[{data1, data2},  $\mu_0$ , "TestDataTable ", AlternativeHypothesis  $\rightarrow$  "Less"]
TTest[{data1, data2},  $\mu_0$ , "TestDataTable "]
```

Out[449]=

	Statistic	P-Value
T	0.504273	0.309621

Out[450]=

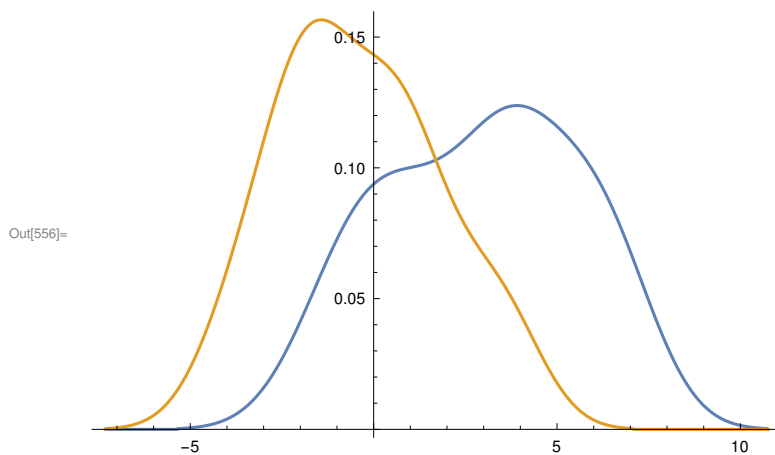
	Statistic	P-Value
T	0.504273	0.690379

Out[451]=

	Statistic	P-Value
T	0.504273	0.619243

two-sample t-Test: $H_A = H_1$ is true

```
In[548]:=  $\mu_0 = 1.2$ ;
Ndata1 = 20;
Ndata2 = 15;
 $\mu_{data1} = 2.9$ ;
 $\mu_{data2} = -0.7$ ;
 $\sigma_{data} = 2.3$ ;
data1 = RandomVariate[NormalDistribution[ $\mu_{data1}$ ,  $\sigma_{data}$ ], {Ndata1}];
data2 = RandomVariate[NormalDistribution[ $\mu_{data2}$ ,  $\sigma_{data}$ ], {Ndata2}];
SmoothHistogram[{data1, data2}]
```



```
In[557]:= (* This is the Mathematica implementaion of the t-test *)
TTest[{data1, data2},  $\mu_0$ , "TestDataTable ", AlternativeHypothesis  $\rightarrow$  "Greater"]
TTest[{data1, data2},  $\mu_0$ , "TestDataTable ", AlternativeHypothesis  $\rightarrow$  "Less"]
TTest[{data1, data2},  $\mu_0$ , "TestDataTable "]
```

Out[557]=

	Statistic	P-Value
T	2.54491	0.00789534

Out[558]=

	Statistic	P-Value
T	2.54491	0.992105

Out[559]=

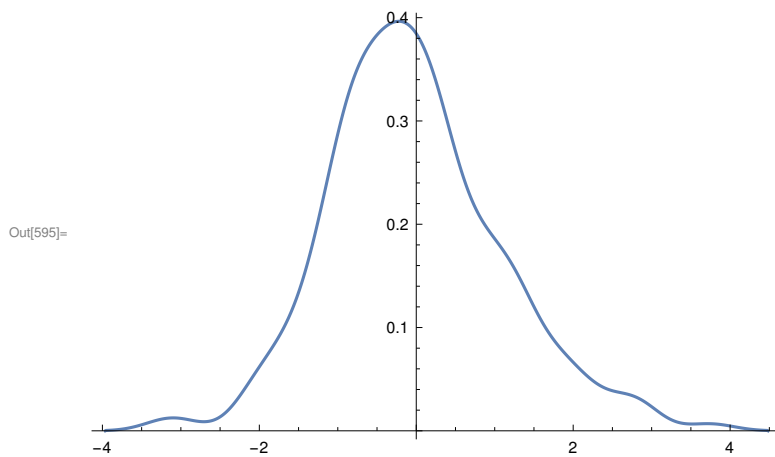
	Statistic	P-Value
T	2.54491	0.0157907

Hypothesis Tests: Kolmogorov-Smirnov

One - sample

```
In[593]:= Ndata = 200;
data = RandomVariate[StudentTDistribution[13], {Ndata}];
```

In[595]:= **SmoothHistogram [data]**



In[596]:= **KolmogorovSmirnovTest [data, StudentTDistribution [13], "TestDataTable "]**
KolmogorovSmirnovTest [data, StudentTDistribution [4], "TestDataTable "]
KolmogorovSmirnovTest [data, NormalDistribution [], "TestDataTable "]

Out[596]=

	Statistic	P-Value
Kolmogorov -Smirnov	0.067956	0.30041

Out[597]=

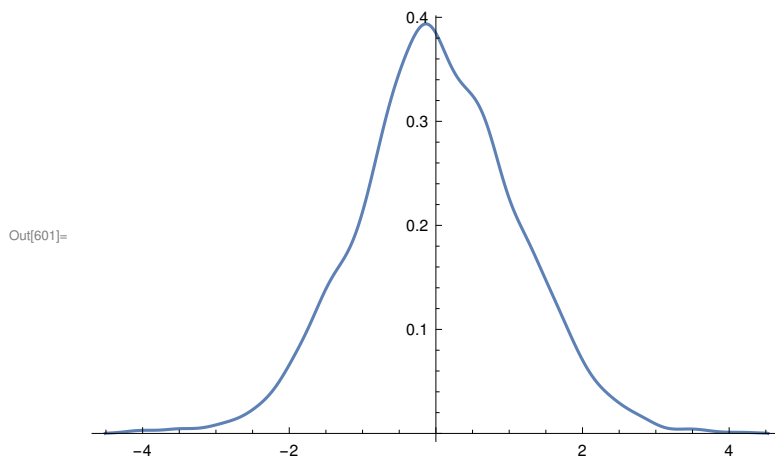
	Statistic	P-Value
Kolmogorov -Smirnov	0.0724085	0.233623

Out[598]=

	Statistic	P-Value
Kolmogorov -Smirnov	0.0658866	0.335648

In[599]:= **Ndata = 2000 ;**
data = RandomVariate [StudentTDistribution [13], {Ndata}];

In[601]:= **SmoothHistogram [data]**



```
In[602]:= KolmogorovSmirnovTest [data, StudentTDistribution [13], "TestDataTable "]
          KolmogorovSmirnovTest [data, StudentTDistribution [4], "TestDataTable "]
          KolmogorovSmirnovTest [data, NormalDistribution [], "TestDataTable "]
```

```
Out[602]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.0175413	0.563513

```
Out[603]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.0294135	0.0615822

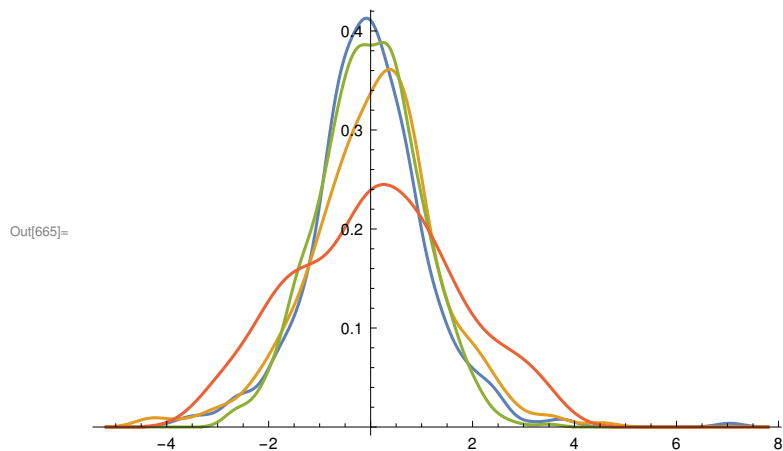
```
Out[604]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.0279352	0.0865304

Two - sample

```
In[657]:= Ndata1 = 400;
          Ndata2 = 300;
          Ndata3 = 600;
          Ndata4 = 200;
          data1 = RandomVariate [StudentTDistribution [5], {Ndata1}];
          data2 = RandomVariate [StudentTDistribution [5], {Ndata2}];
          data3 = RandomVariate [NormalDistribution [], {Ndata3}];
          data4 = RandomVariate [TriangularDistribution [{-4, 4}], {Ndata4}];
```

```
In[665]:= SmoothHistogram [{data1, data2, data3, data4}]
```



```
In[666]:= KolmogorovSmirnovTest [data1 , data2 , "TestDataTable "]
KolmogorovSmirnovTest [data1 , data3 , "TestDataTable "]
KolmogorovSmirnovTest [data2 , data3 , "TestDataTable "]
KolmogorovSmirnovTest [data1 , data4 , "TestDataTable "]
```

```
Out[666]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.1075	0.0380444

```
Out[667]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.0425	0.778877

```
Out[668]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.075	0.210552

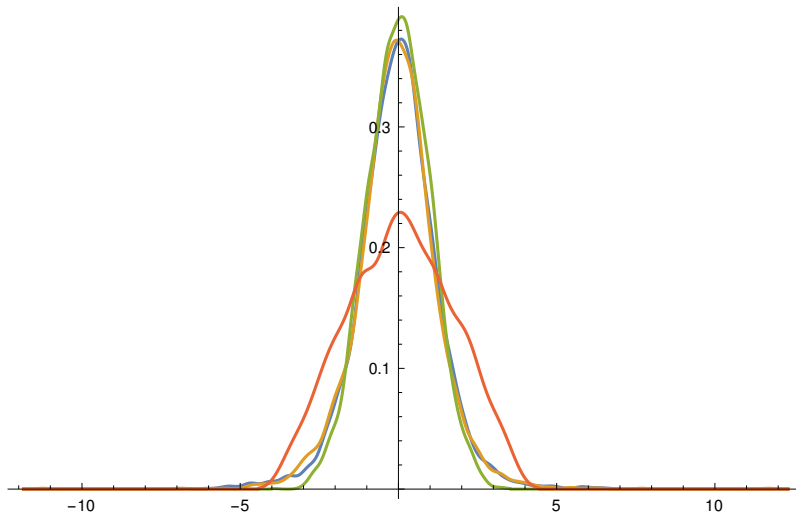
```
Out[669]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.165	0.00132728

```
In[670]:= Ndata1 = 4000 ;
Ndata2 = 3000 ;
Ndata3 = 6000 ;
Ndata4 = 2000 ;
data1 = RandomVariate [StudentTDistribution [5], {Ndata1}];
data2 = RandomVariate [StudentTDistribution [5], {Ndata2}];
data3 = RandomVariate [NormalDistribution [], {Ndata3}];
data4 = RandomVariate [TriangularDistribution [{-4, 4}], {Ndata4}];
```

```
In[679]:= SmoothHistogram [{data1 , data2 , data3 , data4}]
```

```
Out[679]=
```



```
In[680]:= KolmogorovSmirnovTest [data1, data2, "TestDataTable "]
          KolmogorovSmirnovTest [data1, data3, "TestDataTable "]
          KolmogorovSmirnovTest [data2, data3, "TestDataTable "]
          KolmogorovSmirnovTest [data1, data4, "TestDataTable "]
```

```
Out[680]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.01725	0.687455

```
Out[681]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.0361667	0.0037523

```
Out[682]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.0428333	0.00129969

```
Out[683]=
```

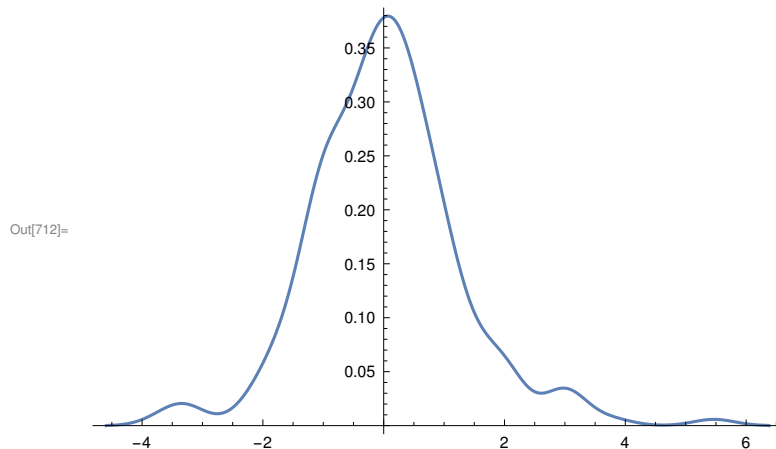
	Statistic	P-Value
Kolmogorov -Smirnov	0.1265	0.

Hypothesis Tests: ShapiroWilk vs KS

One - sample H0 false

```
In[710]:= Ndata = 200;
          data = RandomVariate [StudentTDistribution [7], {Ndata}];
```

```
In[712]:= SmoothHistogram [data]
```



```
In[713]:= KolmogorovSmirnovTest [data, NormalDistribution [], "TestDataTable "]
          ShapiroWilkTest [data, "TestDataTable "]
```

```
Out[713]=
```

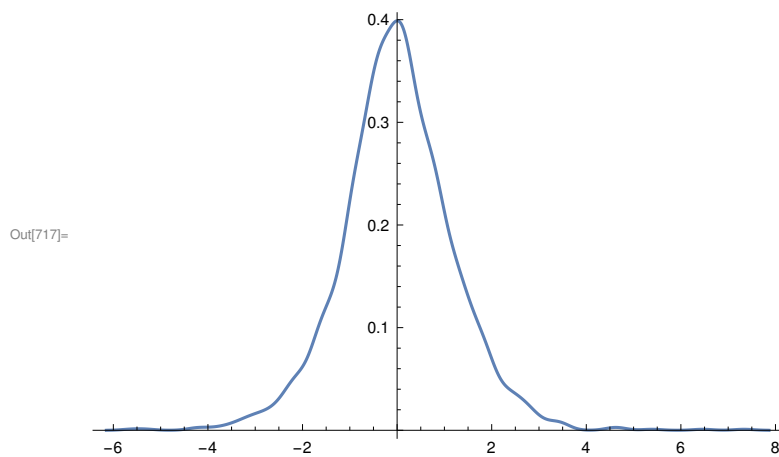
	Statistic	P-Value
Kolmogorov -Smirnov	0.0513125	0.648948

```
Out[714]=
```

	Statistic	P-Value
Shapiro -Wilk	0.965924	0.0000915426

```
In[715]:= Ndata = 2000;
          data = RandomVariate [StudentTDistribution [7], {Ndata}];
```

In[717]:= **SmoothHistogram [data]**



In[718]:= **KolmogorovSmirnovTest [data, NormalDistribution [], "TestDataTable "]**
ShapiroWilkTest [data, "TestDataTable "]

Out[718]=

	Statistic	P-Value
Kolmogorov -Smirnov	0.0291319	0.0657923

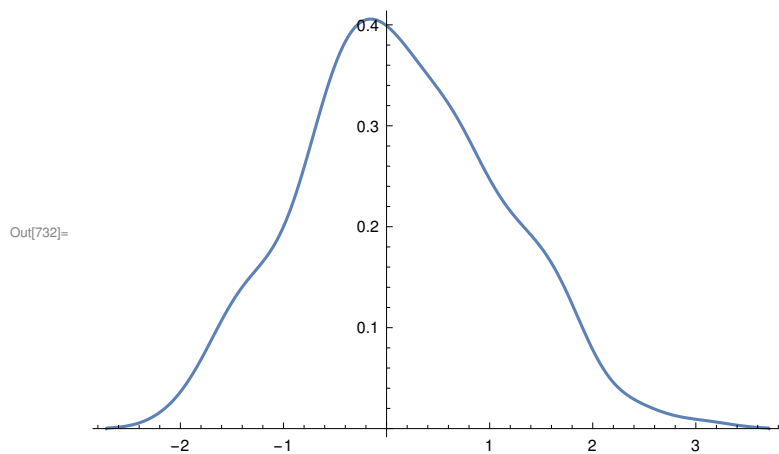
Out[719]=

	Statistic	P-Value
Shapiro -Wilk	0.982504	6.09403×10^{-15}

One - sample H0 true

In[730]:= **Ndata = 200 ;**
data = RandomVariate [NormalDistribution [], {Ndata}];

In[732]:= **SmoothHistogram [data]**



```
In[733]:= KolmogorovSmirnovTest[data, NormalDistribution[], "TestDataTable "]
ShapiroWilkTest[data, "TestDataTable "]
```

```
Out[733]=
```

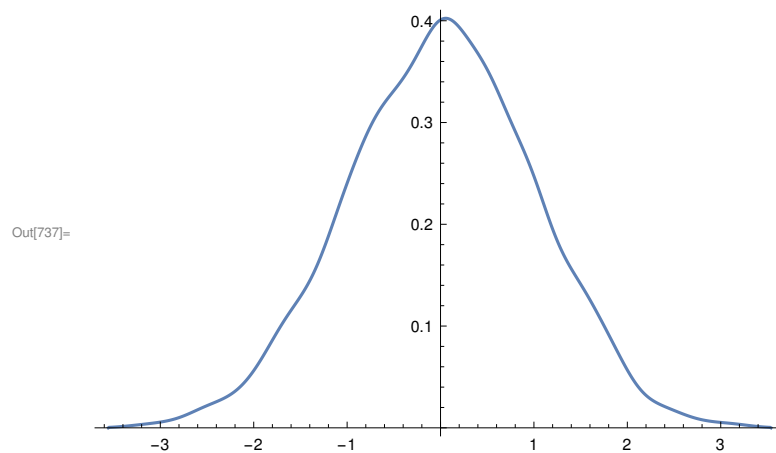
	Statistic	P-Value
Kolmogorov -Smirnov	0.0754465	0.194888

```
Out[734]=
```

	Statistic	P-Value
Shapiro -Wilk	0.992011	0.343199

```
In[735]:= Ndata = 2000;
data = RandomVariate[NormalDistribution[], {Ndata}];
```

```
In[737]:= SmoothHistogram[data]
```



```
In[738]:= KolmogorovSmirnovTest[data, NormalDistribution[], "TestDataTable "]
ShapiroWilkTest[data, "TestDataTable "]
```

```
Out[738]=
```

	Statistic	P-Value
Kolmogorov -Smirnov	0.0167374	0.62345

```
Out[739]=
```

	Statistic	P-Value
Shapiro -Wilk	0.999406	0.813273