

3.3: Chebyshev's Rule and the Empirical Rule

Chebyshev's Rule (Chebyshev's Inequality):

For any data set or distribution, at least $1 - \frac{1}{k^2}$ of the data points lie within k standard deviations of the mean, where k is any number greater than 1.

(In other words, at least $1 - \frac{1}{k^2}$ of the observations lie in the interval $[\bar{x} - ks, \bar{x} + ks]$.)

Note: Chebyshev's Inequality is true even when the distribution is not bell-shaped.

$\bar{x}$: mean
 s : standard deviation
 (for a sample)

Example 1: What does Chebyshev's Inequality tell us for $k=1$, $k=2$, $k=3$, $k=4$?

$k=1$ $1 - \frac{1}{k^2} = 1 - \frac{1}{1^2} = 1 - 1 = 0$. So at least 0% of the data points lie within 1 std. deviation of the mean (not very helpful).

$k=2$ $1 - \frac{1}{k^2} = 1 - \frac{1}{2^2} = 1 - \frac{1}{4} = \frac{3}{4} = 0.75$. So at least 75% of the data lie within 2 standard deviations of the mean, (so in interval $[\bar{x} + 2s, \bar{x} - 2s]$).

$k=3$ $1 - \frac{1}{k^2} = 1 - \frac{1}{3^2} = 1 - \frac{1}{9} = \frac{8}{9} \approx 0.889$. So at least 88.9% of the data lie within 3 std. deviations of the mean.

$k=4$ $1 - \frac{1}{k^2} = 1 - \frac{1}{4^2} = 1 - \frac{1}{16} = \frac{15}{16} \approx 0.9375$. So at least 93.75% of data lie within 4 std. deviations of the mean.

Example 1: Suppose the mean time for women's 200 meter track athletes is 57.07 seconds with a standard deviation of 1.05. The shape of the data distribution is unknown. Find the interval that contains at least 75% of the data.

From Chebyshev Inequality, at least 75% of data lie within 2 standard deviations of the mean.

Upper bound: $\bar{x} + 2s = 57.07 + 2(1.05) = 59.17$ seconds

Lower bound: $\bar{x} - 2s = 57.07 - 2(1.05) = 54.97$ seconds.

So, at least 75% of the 200m times should be between 54.97 sec and 59.17 sec.

Example 2: Suppose a data set includes 120 observations. At least how many observations lie within three standard deviations of the mean?

$$k=3 \Rightarrow 1 - \frac{1}{k^2} = 1 - \frac{1}{9} = \frac{8}{9} = 0.889. \geq 88.9\% \text{ lie within 3 st. devs (within 3 SDs)}$$

$$0.889(120) = 106.68$$

At least 106 observations lie within 3 std. devs. of the mean.

Example 3: Suppose a data set includes 68 observations and has mean 55 and standard deviation 7.5. At least how many observations lie between 40 and 70?

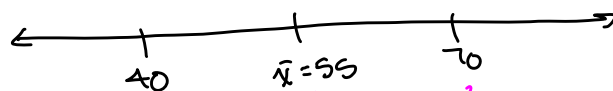
$$\bar{x} = 55, s = 7.5$$

$$k=2 \Rightarrow 1 - \frac{1}{k^2} = 1 - \frac{1}{2^2} = 1 - \frac{1}{4} = 0.75$$

At least 75% should lie in interval $[40, 70]$.

So how many data points? $0.75(68) = 51$

At least 51 observations should lie in $[40, 70]$.



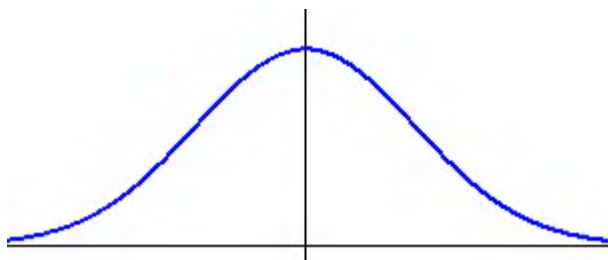
Notice: $15 = 2(7.5) = 2s$
(use $k=2$)
in Chebyshev

The Empirical Rule:

The Empirical Rule:

If a distribution is roughly bell-shaped, then

- About 68% of the data lie within one standard deviation of the mean.
- About 95% of the data lie within two standard deviations of the mean.
- About 99.7% of the data lie within three standard deviations of the mean.



Chebyshev
(any distribution)
(not nec. bell-shaped)

b) at least 75%
within 2 SDs

c) at least 89%
within 3 SDs

d) at least
93.75% within
4 SDs

Example 4: Suppose a data set has mean 60 and standard deviation 8, and has a bell-shaped distribution. Use the Empirical Rule to describe the data set.

$$\bar{x} = 60, s = 8$$

About 68% lie within 1 std. dev.

$$\bar{x} - s = 60 - 8 = 52,$$

$$\bar{x} + s = 60 + 8 = 68$$

interval [52, 68]

About 68% lie between 52 and 68.

About 95% lie within 2 std devs:

$$\bar{x} - 2s = 60 - 2(8) = 44, \bar{x} + 2s = 60 + 2(8) = 76$$

About 95% lie between 44 and 76.

About 99.7% lie within 3 std devs:

$$\bar{x} - 3s = 60 - 3(8) = 36, \bar{x} + 3s = 60 + 3(8) = 84$$

About 99.7% lie between 36 and 84.

These 120 numbers were randomly generated from a normal distribution with mean 60 and standard deviation 8 (same mean and standard deviation as previous example).
(Used Data Analysis ToolPak in Excel)

39.37935	50.39057	54.76075	57.07606	60.01561	63.73369	66.06171	70.43123
42.5313	51.07409	54.76757	57.09698	60.22494	63.89758	66.42436	70.43984
43.05655	51.30639	54.77136	57.31554	60.33393	64.10566	66.62665	70.74113
45.22471	51.5626	54.90775	57.38407	60.57791	64.31159	66.63873	71.55004
45.80155	51.78455	55.13357	57.41827	60.90368	64.40457	66.79456	71.58136
45.91251	52.17896	55.4566	57.51029	61.05229	64.46238	66.79544	73.04499
46.06014	52.4813	55.60325	57.59814	61.07882	64.71196	66.89606	73.29165
46.47654	52.61447	55.80964	58.07242	61.10972	64.76593	66.92538	73.86506
47.10082	52.71231	55.80964	58.12655	61.70779	64.94325	66.99687	74.82269
47.52886	53.2221	55.89434	58.51074	61.95406	65.10725	67.21753	75.07877
47.82743	53.28063	56.37311	59.06982	62.43132	65.40111	68.76018	75.35132
48.44651	53.43097	56.56806	59.31772	62.58109	65.53095	68.88951	75.7777
49.0252	53.81194	56.76762	59.32386	63.5538	65.55196	69.5868	77.55601
49.76189	54.10818	56.94941	59.74017	63.62961	65.6906	69.90556	77.64551
49.77853	54.47837	57.03808	59.79588	63.65133	66.06089	70.21179	79.00524

between 52 and 68
(= 1 std from mean)

within 2 std
of mean

How many data points are within 1 standard deviation of the mean?

Thus, how many lie in interval [52, 68]?

There are $15.4 \times 10 \times 10 = 80$ pts in [52, 68]
This is $\frac{80}{120} = 0.667$, so 66.7% of data lie within 1 std. dev.

How many data points are within 2 standard deviations of the mean?

Thus, how many lie in interval [44, 76]?

All but 6 lie in [44, 76] so $120 - 6 = 114$
 $\frac{114}{120} = 0.95$ Exactly 95% lie within 2 std devs of mean

How many data points are within 3 standard deviations of the mean?

Thus, how many lie in interval [36, 84]?

None of the data points are below 36 or above 84.

So 100% of our data lie within 3 std. deviations (Empirical Rule estimates 99.7%)

1 pt lies below 44

This time, I only generated 50 random numbers:

40 points within sta dev of mean (80% of data) 3.3.4

37.48295	53.07996	54.94143	57.29676	60.95421	63.16013	66.48368
44.16628	53.20456	55.31494	57.37955	61.43636	63.3329	67.79641
47.40146	54.25092	55.90412	58.99277	61.91373	63.39574	67.85567
50.54246	54.41687	56.48669	59.10063	62.14886	63.61741	68.12883
51.77209	54.42467	56.64306	59.74812	62.52829	63.79043	68.23415
52.06366	54.87849	56.84053	60.00459	62.58302	63.93691	70.72309
53.05055	54.91449	57.00922	60.59386	63.15417	66.44211	73.3014
						87.41814

all but 2 points lie within 2 std devs (96% of data)

lies above 84

1 pt lies above 76

How many data points are within 1 standard deviation of the mean?

Thus, how many lie in interval [52, 68]?

5 points lie above 68 } So $50 - 5 = 45$ lie in [52, 68]
 5 points lie below 52 } $\frac{45}{50} = 0.90$, So 90% lie within 1 std. dev (compare to 68% predicted by Empirical Rule).

How many data points are within 2 standard deviations of the mean?

Thus, how many lie in interval [44, 76]?

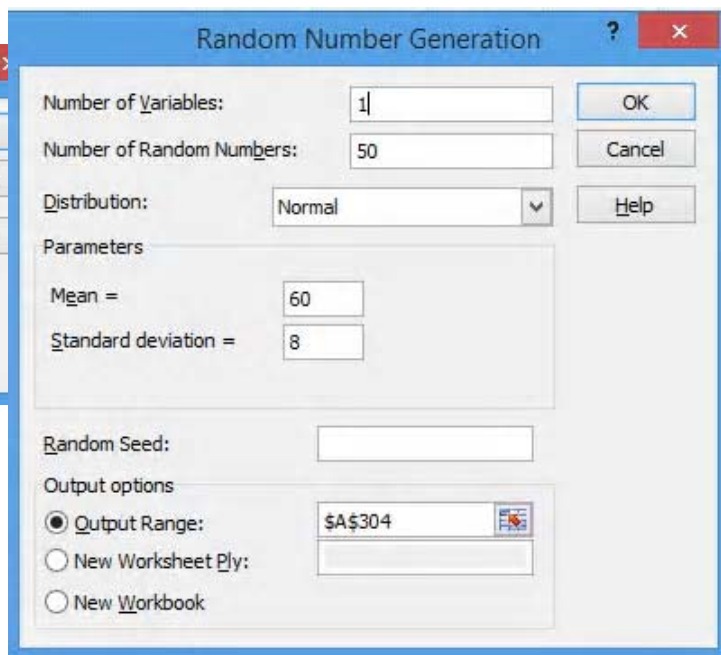
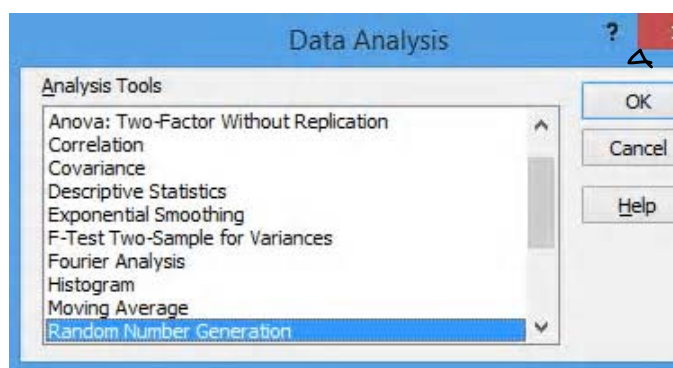
1 point lies above 76 } So $50 - 1 = 49$ lie in [44, 76]
 1 point lies below 44 } $\frac{49}{50} = 0.98$, So 98% lie within 2 SDs of mean. (compare to 95% predicted by Empirical Rule)

How many data points are within 3 standard deviations of the mean?

Thus, how many lie in interval [36, 84]?

Only 1 point lies above 84. So $50 - 1 = 49$ are in [36, 84].
 None below 36. $\frac{49}{50} = 0.98$, So 98% lie within 3 std. devs of mean. (Empirical Rule predicted 99.7%)

Some screen shots of the process:



Note: There are 40 numbers in the 1st
7 columns and 20 in the last.

3.3.5

One more time, this time with 300 random numbers:

3 are
below 44

50 are
below
52

43 are
above 68

5 are
above 76

38.84326	50.86698	54.68468	57.27472	60.58405	63.20981	66.17321	70.96541
42.21232	51.26652	54.72886	57.33431	60.58834	63.21181	66.19631	70.96854
42.98081	51.34825	54.74558	57.35177	60.6086	63.30223	66.33855	70.97636
44.72886	51.37784	54.84689	57.62502	60.67183	63.30689	66.6846	71.418
45.00709	51.4193	54.93544	57.91578	60.68043	63.31289	66.92538	71.52752
45.2281	51.52729	55.12767	57.92022	60.77998	63.36297	66.99418	71.54829
45.74502	51.70324	55.13577	57.92149	60.85565	63.39709	67.01304	71.92155
45.77783	51.7513	55.19161	57.93034	60.94435	63.41921	67.02743	72.24118
46.0039	51.95887	55.21724	58.01314	61.00847	63.58963	67.02743	72.57955
46.27296	51.99328	55.36209	58.17746	61.06586	63.63978	67.02832	72.71404
46.51216	52.16414	55.36352	58.24773	61.08006	63.6826	67.11516	72.97609
46.65451	52.20065	55.40834	58.47087	61.13753	63.72347	67.23043	74.75848
47.0421	52.21638	55.63099	58.49703	61.15298	63.82608	67.43723	74.97872
47.38029	52.25753	55.6459	58.51696	61.20619	63.95696	67.51395	75.81204
47.46869	52.35761	55.68063	58.67048	61.23158	64.05129	67.52156	75.90372
47.58631	52.51833	55.69762	58.8773	61.24397	64.10915	67.68499	76.259
47.64513	52.53727	55.74422	58.96932	61.40466	64.21565	67.68694	77.11451
47.77654	52.56936	55.77662	59.0495	61.45752	64.21987	68.05128	79.49171
47.80597	52.57689	55.8447	59.20525	61.56655	64.37114	68.29572	80.17856
48.32714	52.85754	55.91388	59.22862	61.61336	64.47955	68.3747	81.70971
48.42039	52.90481	55.92015	59.33492	61.72031	64.66111	68.4129	
48.76869	53.05322	55.989	59.39263	61.90177	64.71051	68.54488	
48.8517	53.26581	56.00426	59.43375	61.96163	64.76666	68.67374	
48.92874	53.56296	56.12376	59.49447	61.96414	64.826	68.67927	
49.12779	53.7855	56.20271	59.52696	62.05953	64.83261	68.97397	
49.34563	53.81442	56.24719	59.67464	62.1406	64.93807	69.37314	
49.4033	53.85067	56.26084	59.71445	62.17298	64.94917	69.38531	
49.56304	53.90153	56.26425	59.72853	62.17488	65.08102	69.42562	
49.72711	53.90808	56.3038	59.72914	62.36156	65.14934	69.49211	
49.76327	54.14264	56.47927	59.74996	62.38202	65.22106	69.54926	
49.9019	54.20486	56.50083	59.88402	62.46146	65.28407	69.62202	
49.90597	54.20726	56.57476	59.96481	62.46275	65.39265	69.70709	
49.90734	54.36443	56.64639	60.21147	62.47109	65.39341	69.78032	
49.99756	54.36757	56.67377	60.21637	62.5985	65.42419	69.79844	
50.10628	54.37463	56.73572	60.24942	62.73436	65.52473	69.88977	
50.14039	54.555	56.83193	60.34252	62.75838	65.6011	69.93328	
50.23903	54.55577	56.88944	60.39458	62.81691	65.64185	69.97974	
50.24676	54.58043	56.94217	60.48836	62.86384	65.64969	70.0629	
50.33877	54.59967	57.00134	60.49266	62.95471	65.73562	70.68564	
50.57683	54.66558	57.09895	60.50614	63.09341	65.83657	70.76531	

How many data points are within 1 standard deviation of the mean?

Thus, how many lie in interval [52, 68]?

$$300 - 50 - 43 = 207 \text{ points are in } [52, 68]$$

$$\frac{207}{300} = 0.69, \text{ So } 69\% \text{ lie within 1 std. dev. Compare to } 68\% \text{ predicted by Empirical Rule.}$$

How many data points are within 2 standard deviations of the mean?

Thus, how many lie in interval [44, 76]?

$$300 - 3 - 5 = 292 \text{ points are in } [44, 76]$$

$$\frac{292}{300} \approx 0.9733. \text{ So } 97.3\% \text{ lie within 2 std. devs of the mean. Compare to } 95\% \text{ predicted by Empirical Rule.}$$

How many data points are within 3 standard deviations of the mean?

Thus, how many lie in interval [36, 84]?

$$\text{No data points are below 36 or above 84. So } 100\% \text{ of the data lie within 3 std. devs of the mean. Compare to } 99.7\% \text{ predicted by Empirical Rule.}$$

You shouldn't expect that any sample will match the Empirical Rule exactly. However, it should be close, especially with a large sample.

Example 5: The mean value from a sample of used cars is \$2400, with a standard deviation of \$450. Between what two values should about 95% of the data lie? Assume the data is approximately bell-shaped.

$$\bar{x} = 2400, s = 450$$

Bell-shaped, so from Empirical Rule, 95% should lie within 2 std. devs of the mean.

$$\bar{x} + 2s = 2400 + 2(450) = 3300$$

$$\bar{x} - 2s = 2400 - 2(450) = 1500.$$

So, 95% of the car values should lie between \$1500 and \$3300.

Example: using Excel to find standard deviation of the following sample.

52 38 29 74 57 92 105 114

Below is a screenshot of my version of the class example. The screenshot on the right shows the formulas I used.

	A	B	C	D	E		A	B	C	D	E
1		x	x-mean	(x-mean)^2		1	x	x-mean	(x-mean)^2		
2		52	-18.125	328.515625		2	52	=B2-B\$13	=C2^2		
3		38	-32.125	1032.015625		3	38	=B3-B\$13	=C3^2		
4		29	-41.125	1691.265625		4	29	=B4-B\$13	=C4^2		
5		74	3.875	15.015625		5	74	=B5-B\$13	=C5^2		
6		57	-13.125	172.265625		6	57	=B6-B\$13	=C6^2		
7		92	21.875	478.515625		7	92	=B7-B\$13	=C7^2		
8		105	34.875	1216.265625		8	105	=B8-B\$13	=C8^2		
9		114	43.875	1925.015625		9	114	=B9-B\$13	=C9^2		
10						10					
11	Sum	561		6858.875		11	Sum	=SUM(B2:B9)		=SUM(D2:D9)	
12	Mean	70.125	Variance	979.8392857		12	Mean	=B11/8	Variance	=D11/7	
13		70.125	StDev	31.30238466	31.30238	13		=AVERAGE(B2:B9)	StDev	=SQRT(D12)	=SQRT(D12)
14				31.30238466		14				=STDEV(B2:B9)	
15	Count	8				15	Count	=COUNT(B2:B9)			
16						16					