

Process Capability

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Learning Objectives

At the end of this section delegates will be able to:

- Recognise the difference between process control and process capability
- Carry out capability studies on variable and attribute data
- Assess and interpret the data from capability studies
- Convert data from capability studies into DPM or Cpk values

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Process Capability Agenda

- Process Control v Process Capability
- Process Capability – Variable Data
- Capability Study – 7 steps
- Capability Study – Minitab
- Workshop
- Capability Study Issues
- Process Capability – Non-normal Data
- Summary

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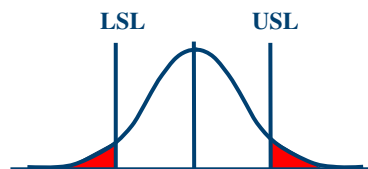
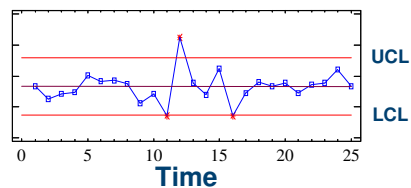
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Process Control

- Process Control refers to the evaluation of process stability over time
- Process Capability refers to the evaluation of how well a process meets specifications

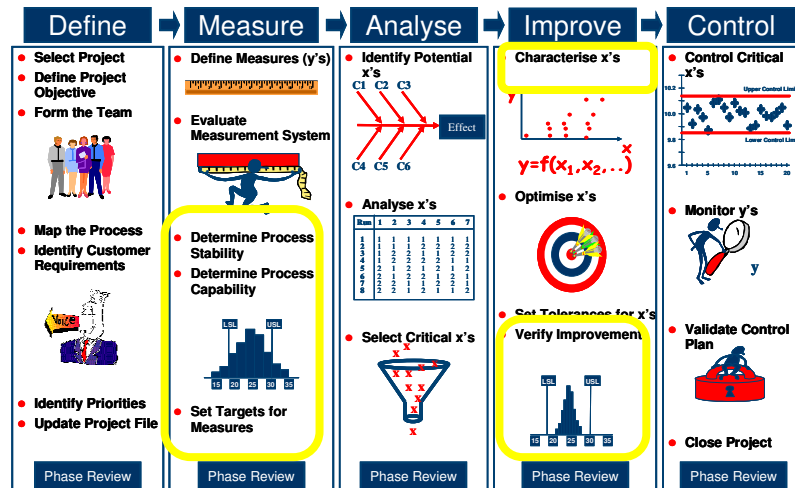


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DMAIC Improvement Process



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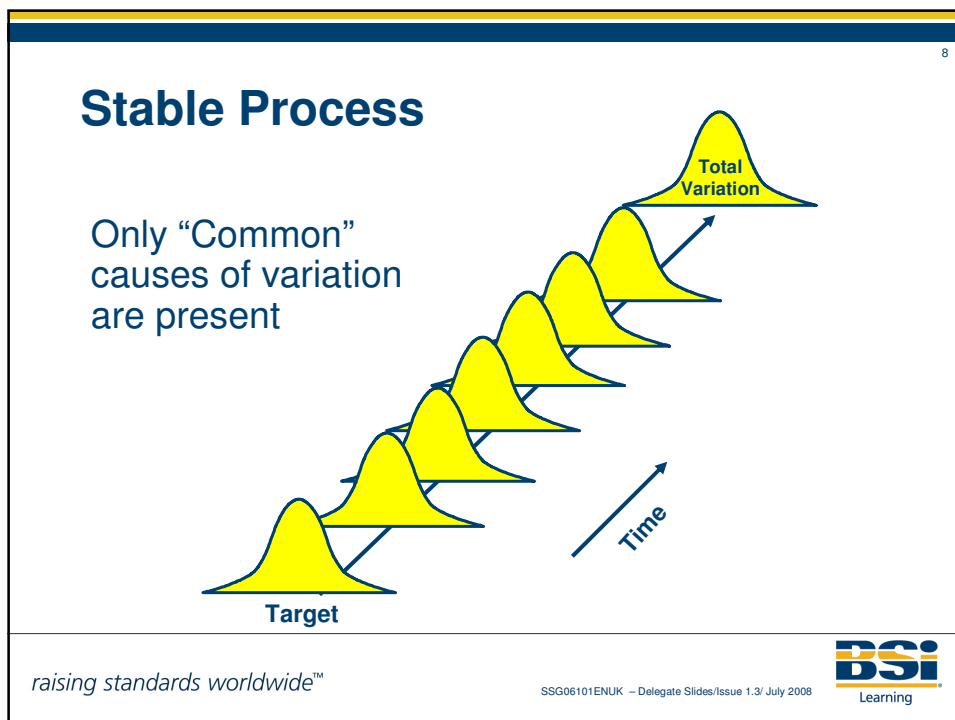
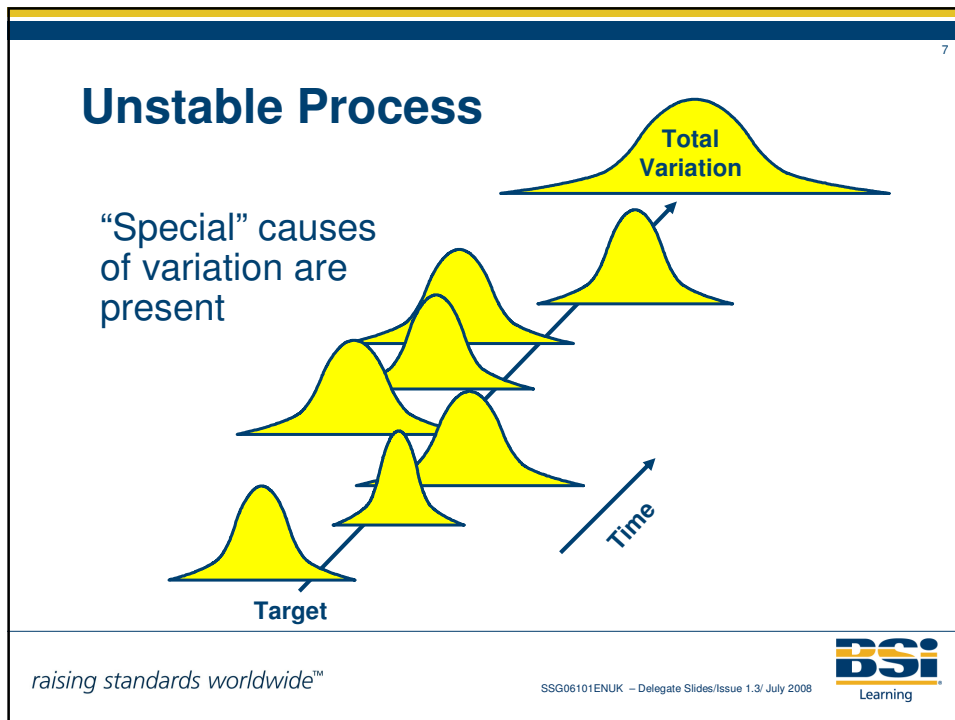
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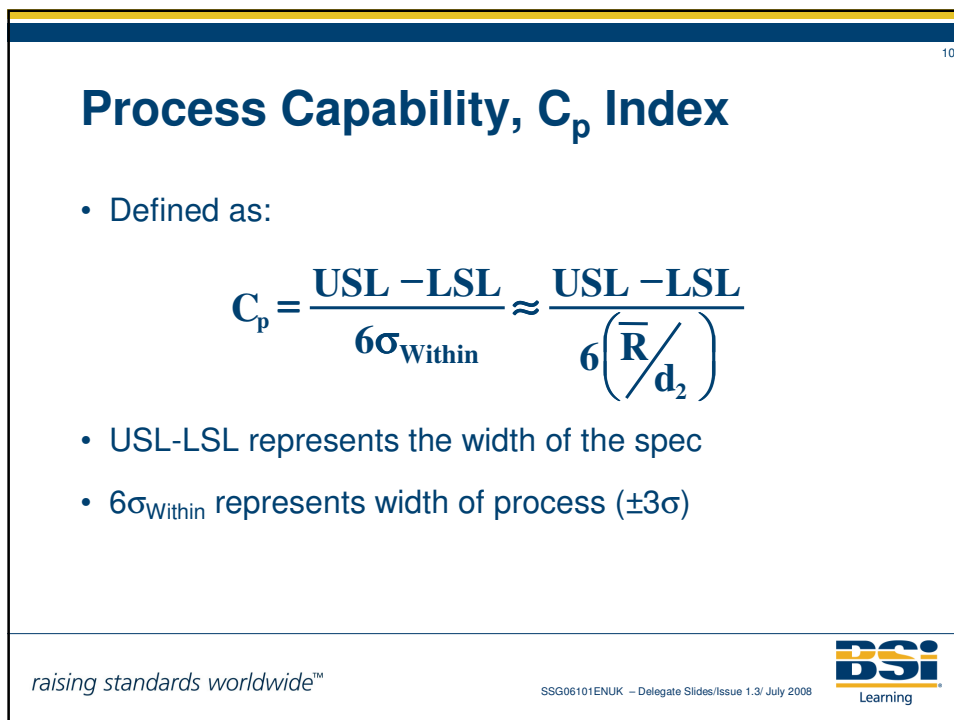
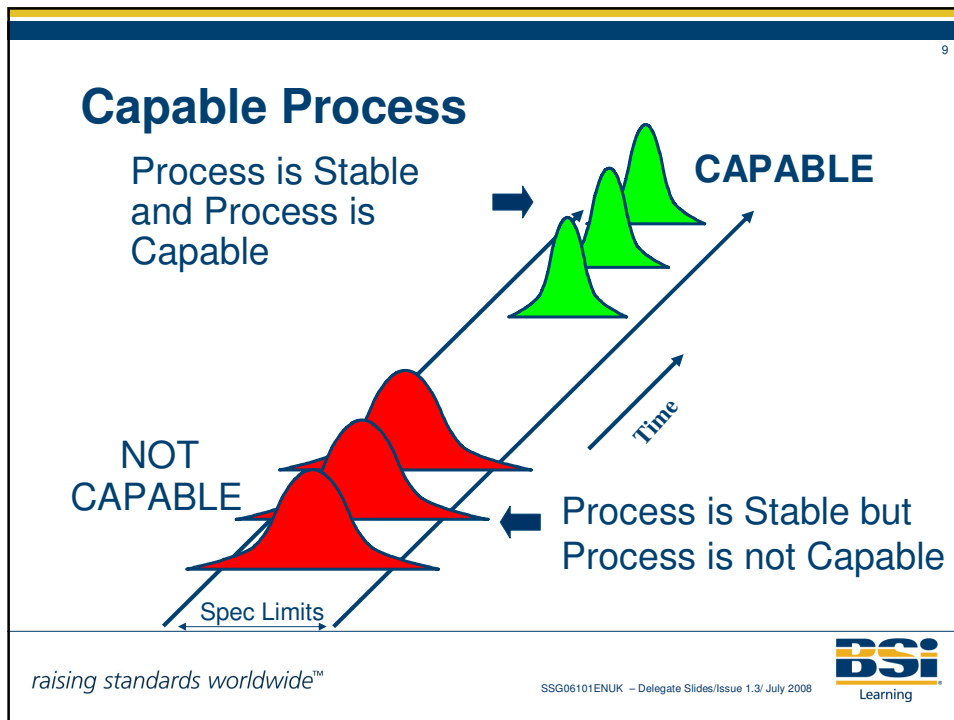


Process Capability – Variable Data

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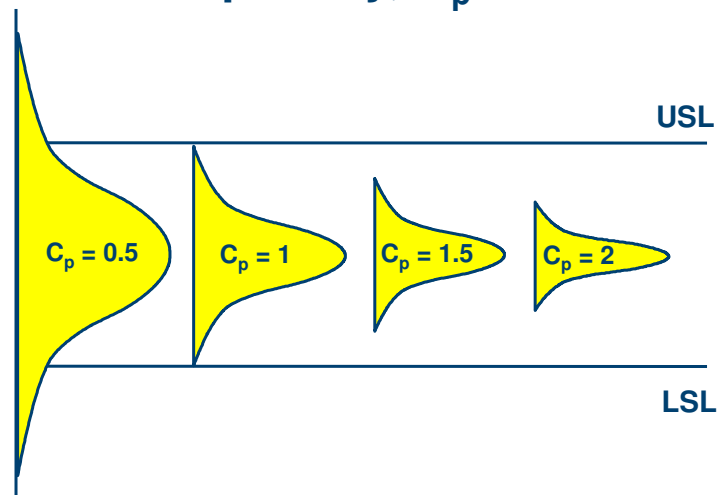






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Process Capability, C_p Index



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Process Capability, C_{pk} Index

- Defined as:

$$C_{pk} = \frac{\min(USL - \bar{\bar{X}}, \bar{\bar{X}} - LSL)}{3\sigma_{Within}} \quad \sigma_{Within} \approx \frac{\bar{R}}{d_2}$$

- Numerator represents the distance to the nearest spec
- Denominator represents the amount of this distance consumed by variation

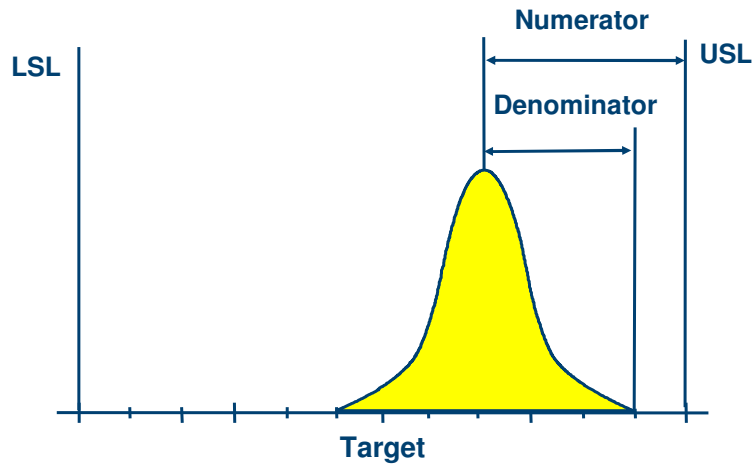
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Process Capability, C_{pk} Index



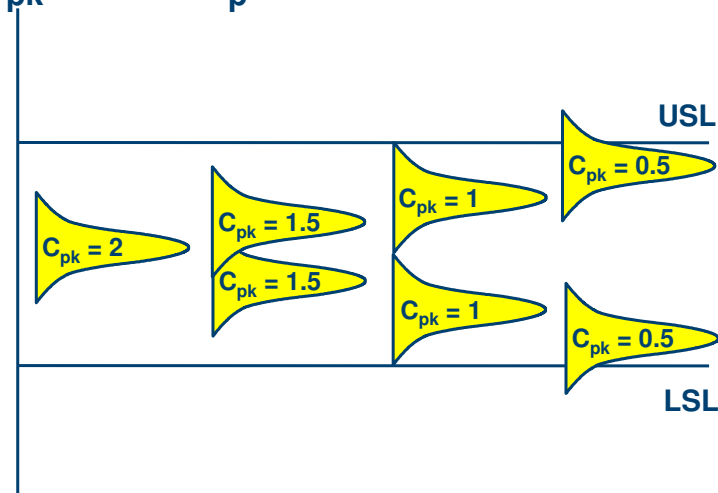
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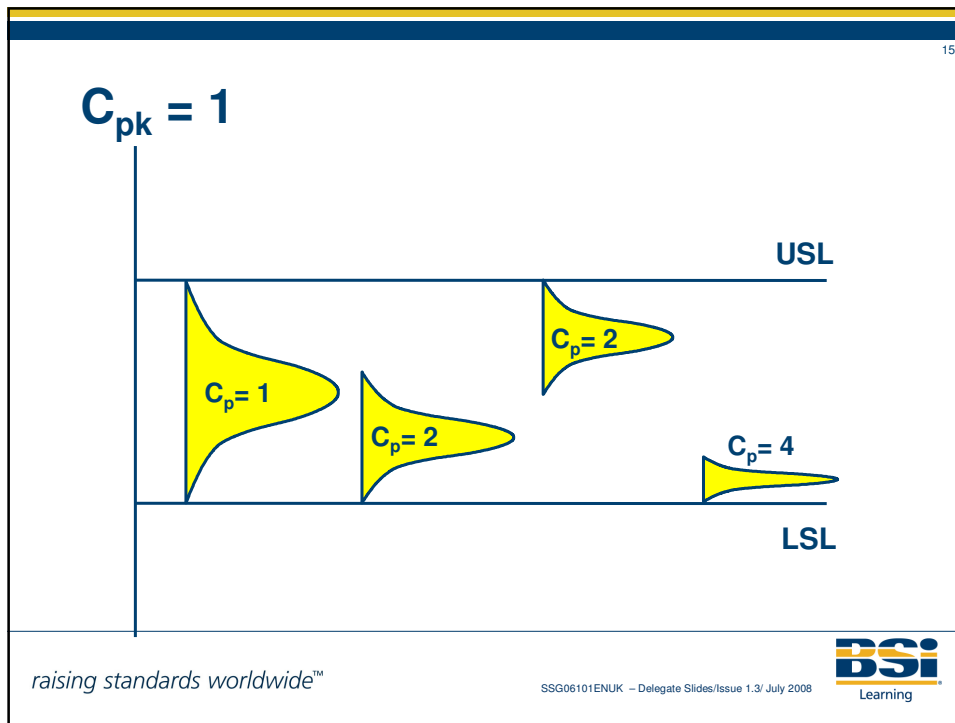
C_{pk} when $C_p=2$



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C_{pk} and C_p

- $C_{pk} \leq C_p$
- $C_{pk} = C_p$ only when the process is perfectly centred
- C_p represents the highest possible value for C_{pk}

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One Spec Limit

- C_p is not defined – requires 2 spec limits
- C_{pk} can still be calculated – requires only one spec limit

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Six Sigma Quality - Measurable Characteristics

- Requires no more than 3.4 defects per million for each measurable characteristic
- Producing no more than 3.4 defects per million requires keeping the process average at least 4.5σ from the nearest spec

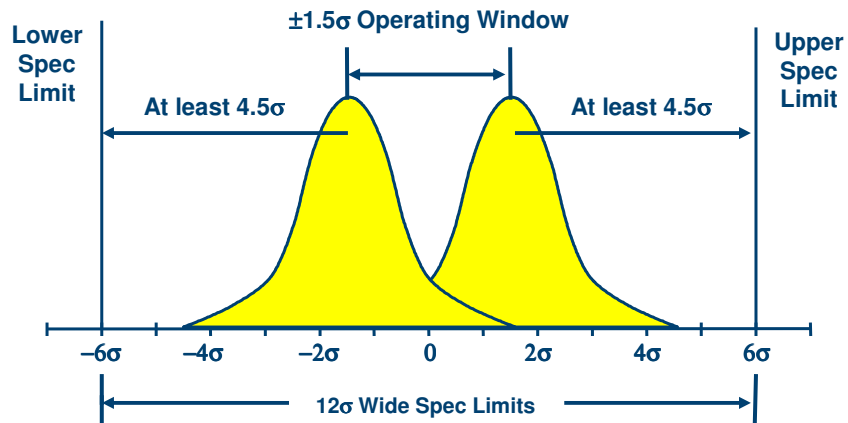
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Six Sigma Quality - Measurable Characteristics



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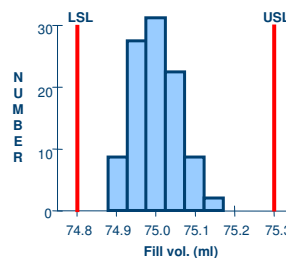
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Capability Study

- Determines if process is stable and capable, ie can it consistently make good product.
- Measures success and progress achieved using the other tools.



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Capability Study

1. Collect data
2. Calculate required statistics
3. Draw charts
4. Plot data
5. Interpret charts and draw conclusions
6. Draw histogram
7. Calculate C_p and C_{pk} and draw conclusions

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(1) Collect Data

The data below refers to a filling operation (target fill = 75.0 ml)

| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| 75.02 | 75.03 | 75.03 | 74.98 | 75.03 | 75.03 | 75.02 | 75.03 | 75.05 | 75.02 |
| 75.03 | 75.06 | 75.05 | 75.01 | 75.02 | 75.06 | 74.99 | 74.98 | 75.00 | 75.01 |
| 75.05 | 75.06 | 75.03 | 75.03 | 75.03 | 75.01 | 75.02 | 75.03 | 75.03 | 75.00 |
| 75.01 | 75.02 | 75.04 | 75.04 | 75.04 | 75.04 | 75.04 | 75.04 | 75.01 | 75.07 |
| 75.02 | 75.09 | 75.06 | 75.02 | 75.02 | 75.00 | 75.07 | 75.05 | 75.07 | 75.00 |

| 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 | 19 | 20 |
|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| 75.04 | 75.08 | 75.00 | 75.07 | 75.02 | 75.04 | 75.05 | 75.05 | 75.04 | 75.06 |
| 75.05 | 74.99 | 75.04 | 75.05 | 75.01 | 75.02 | 75.03 | 75.04 | 75.02 | 75.04 |
| 74.97 | 75.02 | 75.01 | 75.06 | 75.04 | 75.04 | 75.06 | 75.03 | 75.04 | 75.02 |
| 75.00 | 75.05 | 75.02 | 75.03 | 75.03 | 75.06 | 75.03 | 75.01 | 75.01 | 75.05 |
| 75.01 | 74.99 | 75.04 | 75.01 | 75.02 | 75.05 | 75.08 | 74.99 | 75.03 | 75.00 |

- Collect 20 subgroups of 5 data points each over several hours, where the 5 data points in each subgroup are collected at the same time

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(1) Collect Data

- Most capability studies are carried out over short time periods
- Typically, high volume production should be sampled at least hourly
- Lower volume production should be adjusted accordingly – a rule of thumb would be one subgroup of 5 every 50 components
- Practical considerations may dictate the time period selected, but subgroups should be taken at regular intervals
- Consider extending the time period to cover process changes (eg 2nd shift, material changes etc)

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(2) Calculate Required Statistics

| | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|---------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| | 75.02 | 75.03 | 75.03 | 74.98 | 75.03 | 75.03 | 75.02 | 75.03 | 75.05 | 75.02 |
| | 75.03 | 75.06 | 75.05 | 75.01 | 75.02 | 75.06 | 74.99 | 74.98 | 75.00 | 75.01 |
| | 75.05 | 75.06 | 75.03 | 75.03 | 75.03 | 75.01 | 75.02 | 75.03 | 75.03 | 75.00 |
| | 75.01 | 75.02 | 75.04 | 75.04 | 75.04 | 75.04 | 75.04 | 75.04 | 75.01 | 75.07 |
| | 75.02 | 75.09 | 75.06 | 75.02 | 75.02 | 75.00 | 75.07 | 75.05 | 75.07 | 75.00 |
| average | 75.026 | 75.052 | 75.042 | 75.016 | 75.028 | 75.028 | 75.028 | 75.026 | 75.032 | 75.020 |
| range | 0.04 | 0.07 | 0.03 | 0.06 | 0.02 | 0.06 | 0.08 | 0.07 | 0.07 | 0.07 |

| | 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 | 19 | 20 |
|---------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| | 75.04 | 75.08 | 75.00 | 75.07 | 75.02 | 75.04 | 75.05 | 75.05 | 75.04 | 75.06 |
| | 75.05 | 74.99 | 75.04 | 75.05 | 75.01 | 75.02 | 75.03 | 75.04 | 75.02 | 75.04 |
| | 74.97 | 75.02 | 75.01 | 75.06 | 75.04 | 75.04 | 75.06 | 75.03 | 75.04 | 75.02 |
| | 75.00 | 75.05 | 75.02 | 75.03 | 75.03 | 75.06 | 75.03 | 75.01 | 75.01 | 75.05 |
| | 75.01 | 74.99 | 75.04 | 75.01 | 75.02 | 75.05 | 75.08 | 74.99 | 75.03 | 75.00 |
| average | 75.014 | 75.026 | 75.022 | 75.044 | 75.024 | 75.042 | 75.050 | 75.024 | 75.028 | 75.034 |
| range | 0.08 | 0.09 | 0.04 | 0.06 | 0.03 | 0.04 | 0.05 | 0.06 | 0.03 | 0.06 |

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(2) Calculate Required Statistics

- Controls Limits are always:

Average \pm 3 Standard Deviations

Where the average and standard deviation are the average and standard deviation of whatever is plotted: subgroup averages, subgroup ranges, ...

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(2) Calculate Required Statistics

- The control limits can be calculated directly as follows:

$$UCL_{\bar{x}} = \bar{\bar{X}} + A_2 \bar{R}$$

$$LCL_{\bar{x}} = \bar{\bar{X}} - A_2 \bar{R}$$

$$UCL_{\bar{R}} = D_4 \bar{R}$$

$$LCL_{\bar{R}} = D_3 \bar{R}$$

- Using these constants simplifies the calculations
- Minitab allows us to choose whether to use R-Bar or the within subgroup variation

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(2) Calculate Required Statistics

| Sample size | A ₂ | D ₃ | D ₄ | d ₂ |
|-------------|----------------|----------------|----------------|----------------|
| 2 | 1.880 | 0 | 3.267 | 1.128 |
| 3 | 1.023 | 0 | 2.574 | 1.693 |
| 4 | 0.729 | 0 | 2.282 | 2.059 |
| 5 | 0.577 | 0 | 2.114 | 2.326 |
| 6 | 0.483 | 0 | 2.004 | 2.534 |
| 7 | 0.419 | 0.076 | 1.924 | 2.704 |
| 8 | 0.373 | 0.136 | 1.864 | 2.847 |
| 9 | 0.337 | 0.184 | 1.816 | 2.970 |
| 10 | 0.308 | 0.223 | 1.777 | 3.078 |

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(2) Calculate Required Statistics

- The upper and lower control limits for the average & range are:

$$\bar{\bar{X}} = 75.0303, \quad \bar{R} = 0.0555$$

$$UCL_{\bar{X}} = \bar{\bar{X}} + A_2 \bar{R} = \bar{\bar{X}} + 0.577 \bar{R} = 75.0303 + (0.577 \times 0.0555) = 75.06$$

$$LCL_{\bar{X}} = \bar{\bar{X}} - A_2 \bar{R} = \bar{\bar{X}} - 0.577 \bar{R} = 75.0303 - (0.577 \times 0.0555) = 75.00$$

$$UCL_{\bar{R}} = D_4 \bar{R} = 2.114 \times 0.0555 = 0.12$$

$$LCL_{\bar{R}} = D_3 \bar{R} = 0$$

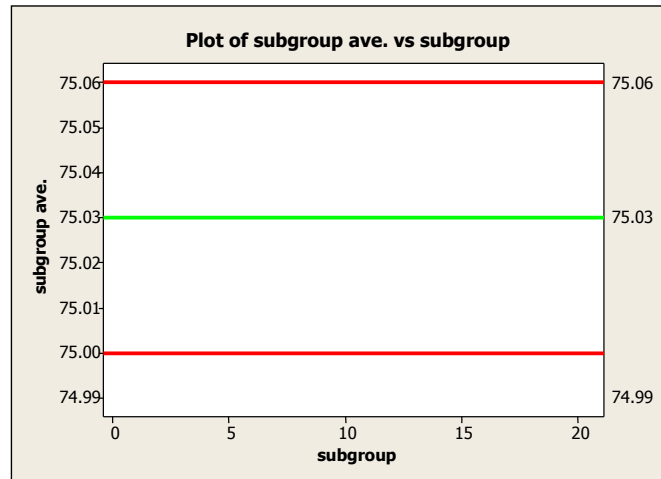
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(3) Draw Charts



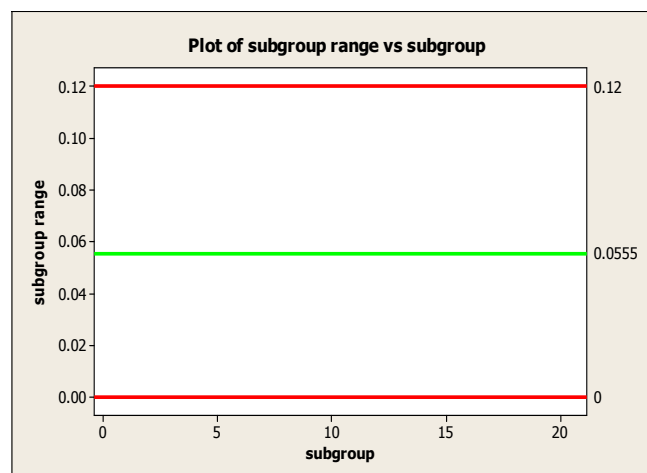
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(3) Draw Charts



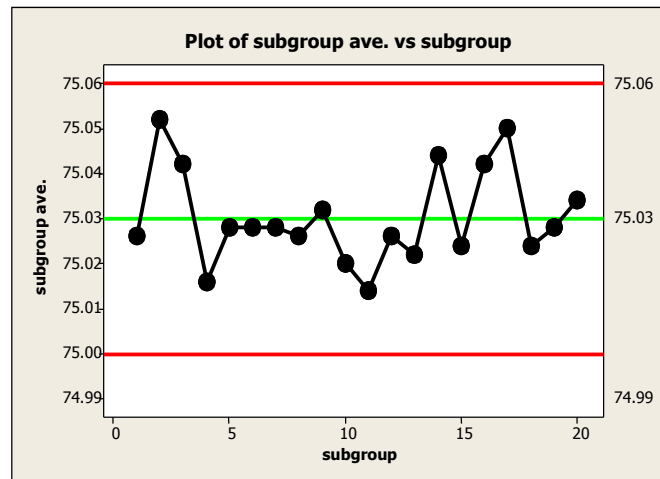
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(4) Plot Data



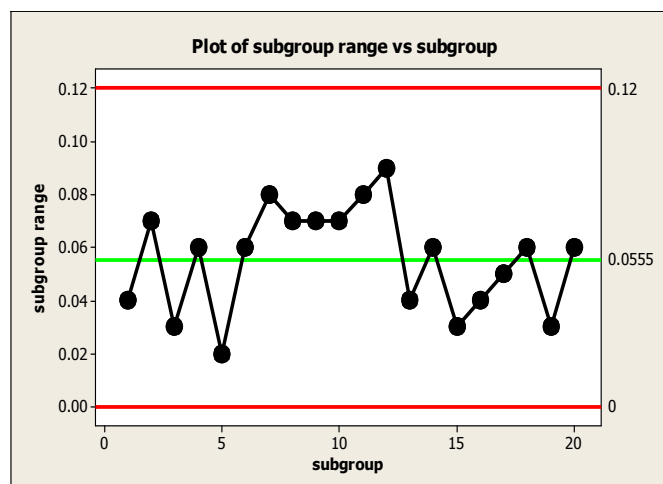
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(4) Plot Data



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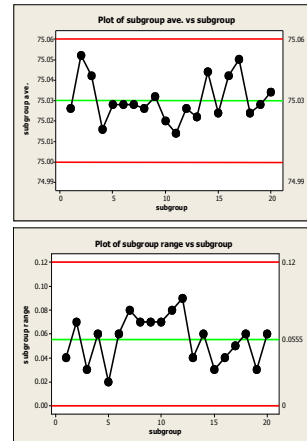
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(5) Interpret Control Charts and Draw Conclusions

- The control limits represent the range of values expected for the subgroups (averages / ranges) if the process is stable
- Points outside the control limits indicate the process average is unstable

Conclusions

- The average is stable
- The range is stable



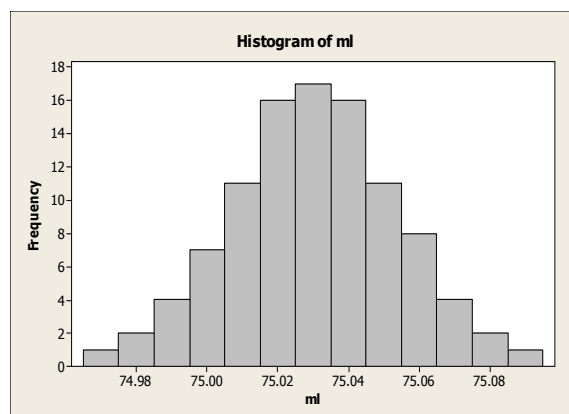
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(6) Draw Histogram



Histogram

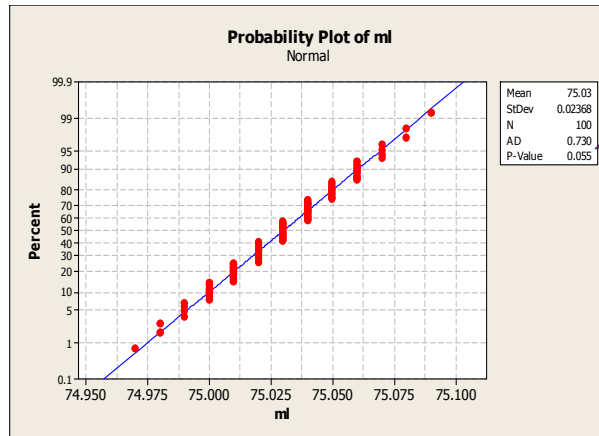
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Normal Probability Plot



$P > 0.05$
Passes Normality
Test

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Reasons for Failing a Normality Test

- A shift occurred in the middle of the data
- Mixed populations
- Truncated data
- Rounding to a small number of values
- Outliers
- Too much data
- The underlying distribution is not normal
- With this data set, we have just passed the test for normality.
- What do you think are the reasons for this situation?



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(7) Calculate C_p and C_{pk} and Draw Conclusions

- C_p is defined as:

$$C_p = \frac{USL - LSL}{6\sigma_{\text{Within}}} \approx \frac{USL - LSL}{6\left(\frac{\bar{R}}{d_2}\right)}$$

- USL-LSL represents the width of the spec
- $6\sigma_{\text{Within}}$ represents width of process ($\pm 3\sigma$)

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(7) Calculate C_p and C_{pk} and Draw Conclusions

- C_p is calculated as follows:

$$C_p = \frac{USL - LSL}{6\left(\frac{\bar{R}}{d_2}\right)} = \frac{75.1 - 74.9}{6\left(\frac{0.0555}{2.326}\right)} = 1.40$$

- C_p is a measure of whether the variation is acceptable
- A value ≥ 1.5 is often acceptable

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(7) Calculate C_p and C_{pk} and Draw Conclusions

- C_{pk} is defined as:

$$C_{pk} = \frac{\min(USL - \bar{X}, \bar{X} - LSL)}{3\sigma_{\text{Within}}} \quad \sigma_{\text{Within}} \approx \frac{\bar{R}}{d_2}$$

- Numerator represents the distance to the nearest spec
- Denominator represents the amount of this distance consumed by variation

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(7) Calculate C_p and C_{pk} and Draw Conclusions

- C_{pk} is calculated as follows:

$$C_{pk} = \frac{\min(USL - \bar{X}, \bar{X} - LSL)}{3\left(\frac{\bar{R}}{d_2}\right)}$$

$$C_{pk} = \frac{\min(75.1 - 75.0303, 75.0303 - 74.9)}{3\left(\frac{0.0555}{2.326}\right)}$$

$$C_{pk} = \min(0.97, 1.82) = 0.97$$

- C_{pk} jointly measures centring and variation
- A value ≥ 1.5 is required for Six Sigma

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Final Conclusion

- Both the average and variation are stable
- Centring the process will improve C_{pk}
- Variation must be reduced in order to achieve a C_{pk} of ≥ 1.5

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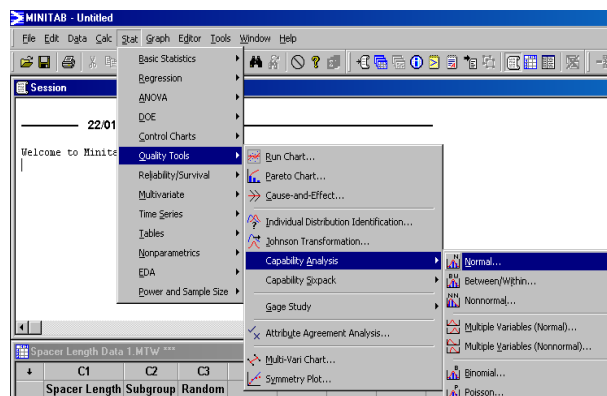
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Capability Analysis - Minitab

Open Worksheet
Fill volume 1



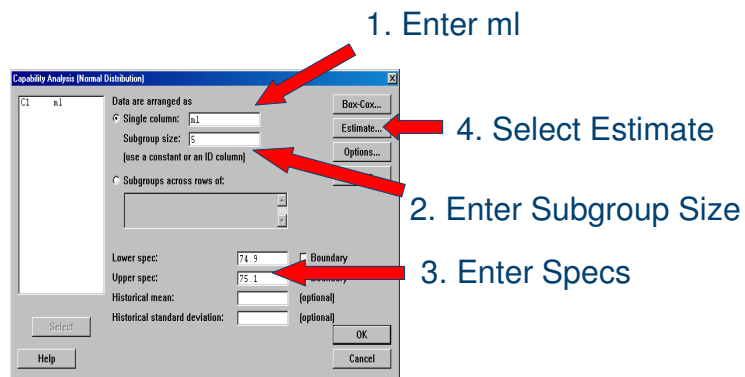
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Capability Analysis - Minitab



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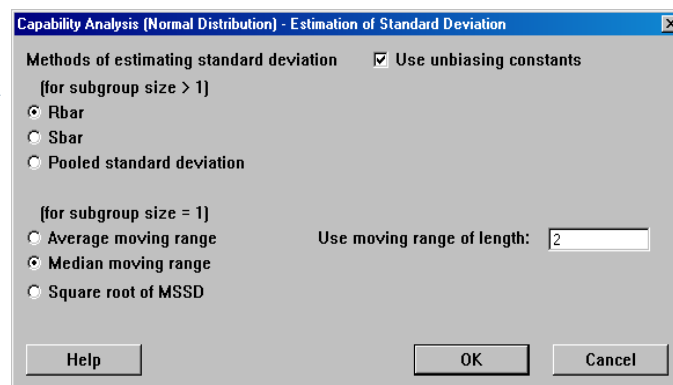
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Capability Analysis - Minitab

Select Rbar



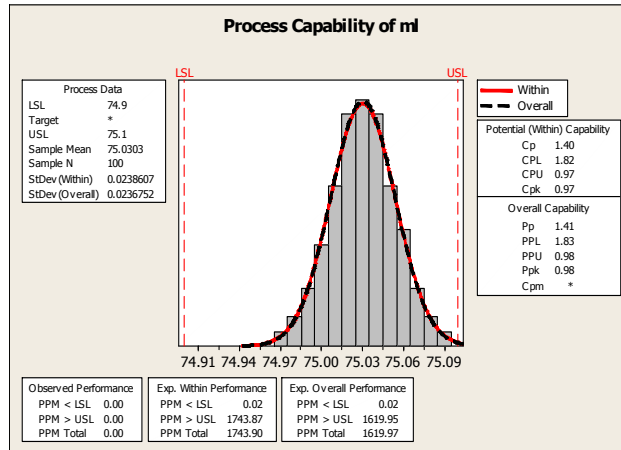
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Capability Analysis – Fill Volume



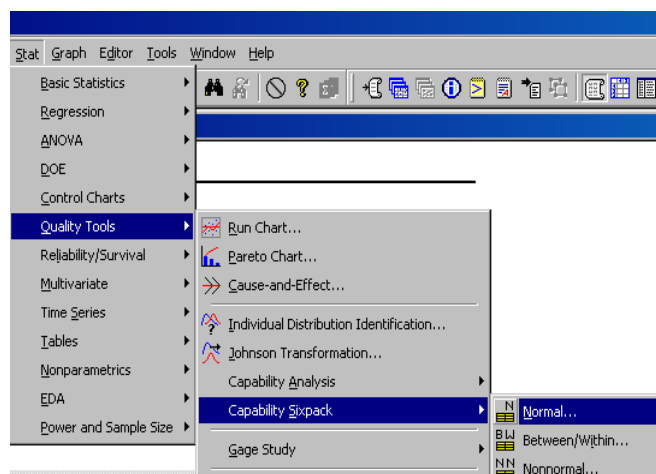
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Capability Analysis - Sixpack



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Capability Analysis - Sixpack

1. Enter ml

2. Enter Subgroup Size

3. Enter Specs

4. Select Estimate

The dialog box 'Capability Sixpack (Normal Distribution)' shows the following settings:

- Data are arranged as: ☒ Single column: (use a constant or an ID column)
- Subgroup size: (use a constant or an ID column)
- Subgroups across rows of: (use a constant or an ID column)
- Lower spec: (optional)
- Upper spec: (optional)
- Historical mean: (optional)
- Historical standard deviation: (optional)
- Buttons: Select, Help, OK, Cancel, Box-Cox..., Tests..., Estimate..., Plans...

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Capability Analysis - Sixpack

Select Rbar

The dialog box 'Capability Sixpack (Normal Distribution) - Estimation of Standard Deviation' shows the following settings:

- Methods of estimating standard deviation: ☒ Use unbiasing constants
- (for subgroup size > 1)
 - ☒ Rbar
 - ☐ Sbar
 - ☐ Pooled standard deviation
- (for subgroup size = 1)
 - ☐ Average moving range
 - ☒ Median moving range
 - ☐ Square root of MSSD
- Use moving range of length:
- Buttons: Help, OK, Cancel

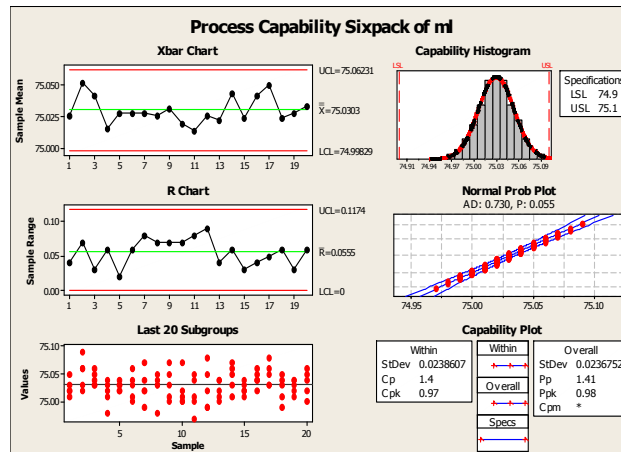
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Capability Analysis - Sixpack



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P_p and P_{pk}

- Minitab, and other statistical packages provide additional measures of process capability called P_p and P_{pk}
- These measures are the same as C_p and C_{pk} except that P_p and P_{pk} always use the total standard deviation rather than variation within subgroups

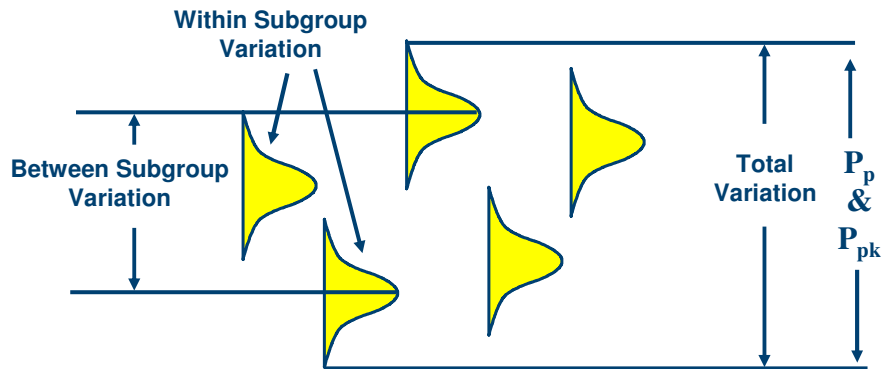
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Components of Variation



Total Variance = Within Subgroup Variance + Between Subgroup Variance

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C_p and P_p

$$C_p = \frac{USL - LSL}{6\sigma_{\text{Within}}} \approx \frac{USL - LSL}{6\left(\frac{\bar{R}}{d_2}\right)} \quad \text{Within subgroup standard deviation}$$

$$P_p = \frac{USL - LSL}{6\sigma_{\text{Total}}} \quad \text{Total standard deviation}$$

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C_{pk} and P_{pk}

$$C_{pk} = \frac{\min(USL - \bar{\bar{X}}, \bar{\bar{X}} - LSL)}{3\sigma_{Within}} \quad \sigma_{Within} \approx \frac{\bar{R}}{d_2}$$

Within subgroup standard deviation

$$P_{pk} = \frac{\min(USL - \bar{\bar{X}}, \bar{\bar{X}} - LSL)}{3\sigma_{Total}}$$

Total standard deviation

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Why measure P_p and P_{pk} ?

- If we calculate C_p and C_{pk} using within subgroup variation, we are assessing “best case” performance
- If the process is stable, then this is generally OK
- If our process is unstable, P_p and P_{pk} provide a more realistic assessment of process capability, because they are calculated using total variation
- However, if the process is unstable, our priority should be to identify and eliminate the factor causing the instability (special cause)

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Behaviour of P_p and P_{pk}

- $P_p < C_p$ until process is stable and under control,
then $P_p = C_p$
- $P_{pk} < C_{pk}$ until process is stable and under control,
then $P_{pk} = C_{pk}$

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Process Capability Metrics

| Metric | Centring? | Stability? |
|----------|-----------|------------|
| C_p | No | No |
| C_{pk} | Yes | No |
| P_p | No | Yes |
| P_{pk} | Yes | Yes |

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Components of Variation

- We have talked about total variation in processes, which we have divided into:
 - Within Subgroup Variation
 - Between Subgroup Variation
- In terms of Variance:

$$\sigma^2_{\text{Total}} = \sigma^2_{\text{Within}} + \sigma^2_{\text{Between}}$$
- Minitab uses the term “overall variation” – this is the same as “total variation”

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Process Capability - Workshop

- Open the Worksheet “Fill volume 2”. The data has 20 subgroups with n=5
- Perform a complete Capability Study on the data provided (USL=75.1, LSL=74.9)
- Use the Minitab Control Chart option – Stat> Control Charts> Variables Charts for Subgroups> Xbar-R
- Use the Minitab Capability option – Stat> Quality Tools> Capability Analysis > Normal
- Perform other analyses as required (eg histograms, dot plots, normality tests, Sixpack etc) to aid your interpretation of data
- Make a presentation of your findings to the other groups including recommendations

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Capability Study Issues

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Possible Differences

- Number of samples per subgroup
- Number of subgroups
- Use of total variation versus within subgroup variation
- Length of time capability study run over (hours, day, week, month)

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Sample Size

- The standard procedure uses 100 samples divided into 20 subgroups of 5
- A minimum of 50 samples should be used, 10 subgroups of 5
- Lower sample sizes result in poorer estimates of C_p and C_{pk}

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Accuracy of C_p and C_{pk}

- Running the standard study of 20 subgroups of 5 results in estimates of C_p and C_{pk} that are accurate to $\pm 15\%$
- Reducing this to 10 subgroups of 5 increases the error to $\pm 22\%$
- Reducing this to 6 subgroups of 5 increases the error to $\pm 28\%$

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Within Versus Total

- Control limits should always be calculated using the within subgroup variation
- C_p and C_{pk} can be calculated using either the within subgroup or total standard deviation:
 - Which is used changes their interpretation
 - Recommend using within subgroup variation

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Questions to Ask

- Which standard deviation was used to calculate C_p and C_{pk} ?
- Over what period of time was the study run?

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Process Capability – Non-Normal Data

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Non-normal Data Sets

- Some data sets are non-normal because the underlying distribution is non-normal
- Some possible transformations were covered in the Basic Statistics section of this program
- If we have successfully transformed our data then we can use the standard process capability procedure (for normal data) described earlier

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Insufficient Discrimination

- The Anderson-Darling normality test can often indicate non-normality when we have insufficient discrimination in our measurement system
- For this reason it is best to ensure that we have sufficient discrimination in our measurement systems before carrying out capability studies
- A good rule of thumb is to have at least 14 levels of discrimination between our lower and upper specifications
- If this is not possible, seek advice from a statistician

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Weibull Distribution

- In some cases, where we have right skewed data sets and cannot successfully transform the data, the Weibull Distribution can be used to good effect

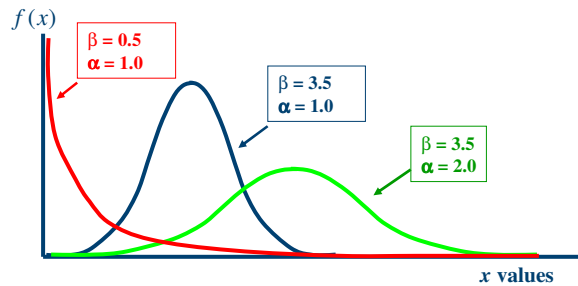
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Weibull Distribution



- The Weibull Distribution is actually a family of probability distributions with two parameters:

β - shape parameter

α - scale parameter

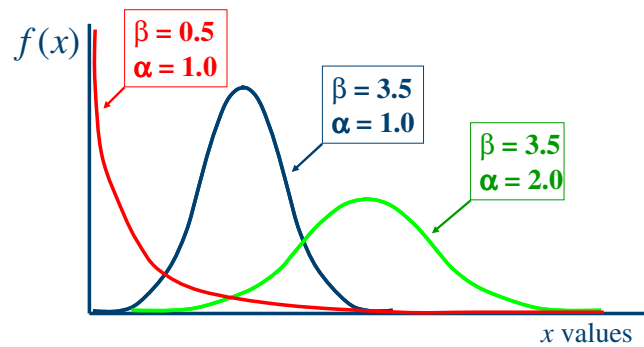
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Weibull Distribution



$$f(x) = \frac{\alpha x^{\alpha-1} e^{-\left(\frac{x}{\beta}\right)^\alpha}}{\beta^\alpha}$$

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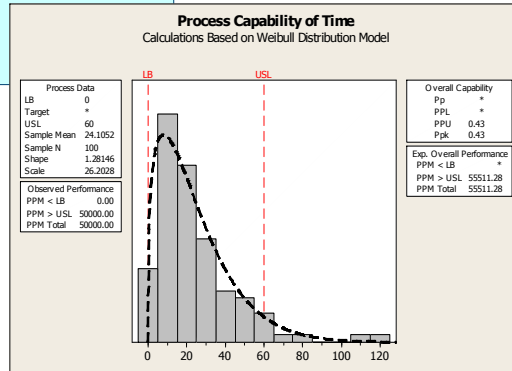
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Weibull Distribution - Minitab

Worksheet: Transform Time
 Stat>Quality Tools>>Capability Analysis>Nonnormal
 Click "Single Column" – select "Time"
 Click "Distribution" – select "Weibull"
 Lower Spec: 0 (Boundary)
 Upper Spec: 60



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Weibull Distribution

MINITAB - Untitled - [Transform Time.MTW ***]

| | C1 | C2 | C3 | C4 | C5 | C6 |
|----|------|---------|--------|------------|----|----|
| | Time | LnTime | Values | Proportion | | |
| 1 | 2.00 | 0.69315 | 10 | 0.252826 | | |
| 2 | 2.65 | 0.97456 | 20 | 0.507259 | | |
| 3 | 3.56 | 1.26976 | 30 | 0.695564 | | |
| 4 | 3.98 | 1.38128 | 40 | 0.820709 | | |
| 5 | 4.26 | 1.44927 | 50 | 0.898424 | | |
| 6 | 4.52 | 1.50851 | 60 | 0.944317 | | |
| 7 | 4.81 | 1.57070 | 70 | 0.970342 | | |
| 8 | 4.89 | 1.58719 | 80 | 0.984606 | | |
| 9 | 4.97 | 1.60342 | 90 | 0.992195 | | |
| 10 | 4.99 | 1.60744 | 100 | 0.996127 | | |
| 11 | 5.07 | 1.62334 | 110 | 0.998116 | | |
| 12 | 5.20 | 1.64866 | 120 | 0.999100 | | |

Create Column "Values"
 Enter 10,20.....120
 Calc>Probability Distributions
 >Weibull
 Cumulative Probability
 Shape: 1.28
 Scale: 26.2
 Input Column: Values
 Optional Storage: Proportion

The Proportion column gives the expected proportion of the distribution less than the given values. We can estimate the proportion above or below any value using this function.

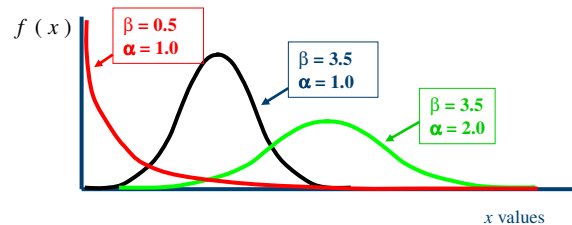
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Weibull – Points to Remember



- If our data is non-normal, we should first concentrate on discovering why our data is non-normal
- If it is discovered that our underlying distribution is non-normal, then we should try some simple transformations
- If a simple transformation is not successful, then the Weibull distribution may be applicable for right skewed data

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Role of Capability Studies

- Capability Studies are the primary tool for managing variation reduction. They act as the scorecard
- Capability Studies help characterise the type of problem (unstable, off-target, excessive variation) guiding which tools and strategies to apply

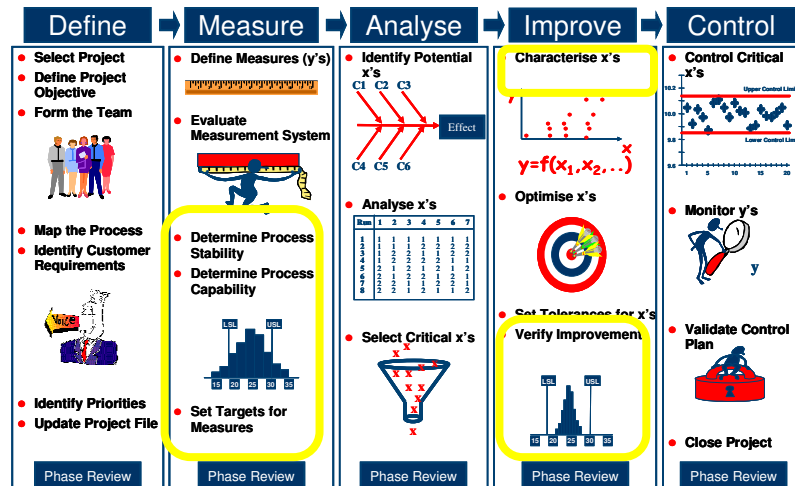
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DMAIC Improvement Process



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DMAIC – Measure Phase

- Capability Studies can be used:
 - To determine process stability
 - To determine process capability
 - To determine the nature of the problem (eg unstable process, off-target, excessive variation, outliers)

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DMAIC – Improve Phase

- Capability Studies can be used to determine the stability and capability of critical x's
- Capability Studies can be used to verify process improvement
- Capability Studies measure the current state of the processes, track progress and are used to demonstrate improvements
- They measure the success of the other variation reduction tools and processes

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DMAIC - Control Phase

- In conjunction with the use of control charts, process capability can be used during the control phase to:
 - Control critical x's
 - Confirm process capability during Process Validation
 - Ensure effective long-term monitoring of the y's (measures)

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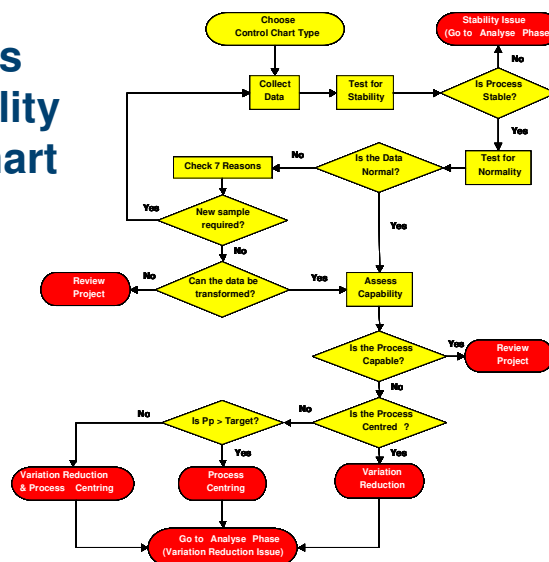
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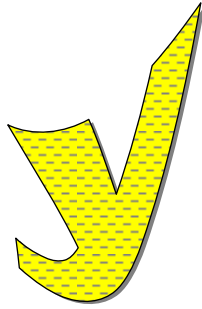
Summary

- Long-term studies are more reliable than short-term studies. We must ensure that a sufficient time period is sampled
- Always check whether the process is stable before or during a capability analysis. Special causes should be removed, or at least understood, before continuing
- Test for normality. Some types of data will require different capability analyses
- If the process is stable and a sufficient time period is taken, then achieving a C_{pk} / P_{pk} of 1.5 at the end of your project means that you have achieved the Six Sigma Target!

Process Capability Flowchart



DMAIC Measure Phase Summary



- Identification of measures (y's)
- Prioritise y's (not too many!)
- Variable measures if possible
- Evaluate Measurement Systems
- Establish Current Level of Stability of y's
- Don't characterise unnatural data!
- Investigate & Remove Special Causes
- Assess Process Capability
- Determine the improvement approach required for each measure