Statistical Process Control

Lecture Outline

- Basics of Statistical Process Control
- Control Charts
- Control Charts for Attributes
- Control Charts for Variables
- Control Chart Patterns
- SPC with Excel and R
- Process Capability

Learning Objectives

- Explain when and how to use statistical process control to ensure the quality of products and services
- Discuss the rationale and procedure for constructing attribute and variable control charts
- Utilize appropriate control charts to determine if a process is in-control
- Identify control chart patterns and describe appropriate data collection
- Assess the process capability of a process

Statistical Process Control (SPC)

Statistical Process Control

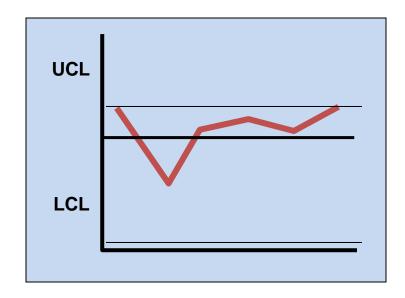
 monitoring production process to detect and prevent poor quality

Sample

subset of items produced to use for inspection

Control Charts

process is within statistical control limits



Process Variability

Random

- inherent in a process
- depends on equipment and machinery, engineering, operator, and system of measurement
- natural occurrences

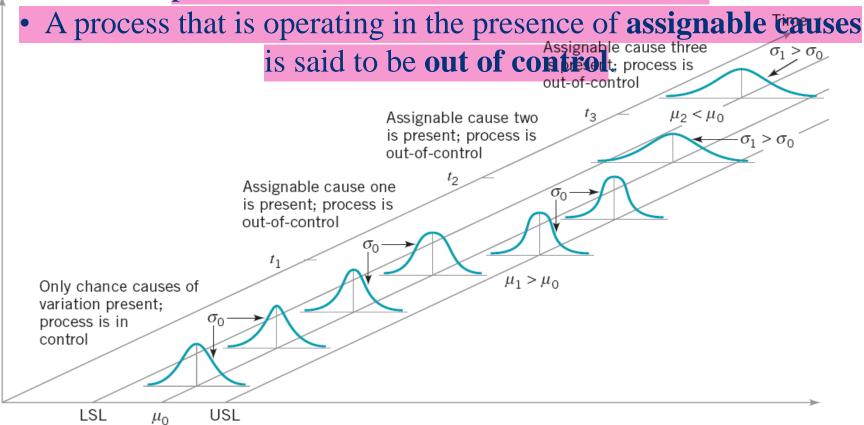
Non-Random

- special causes
- identifiable and correctable
- include equipment out of adjustment, defective materials, changes in parts or materials, broken machinery or equipment, operator fatigue or poor work methods, or errors due to lack of training

Chance and assignable causes of variation



• A process is operating with only **chance causes of variation** present is said to be **in statistical control**.



Process quality characteristic, x

■ FIGURE 5.1 Chance and assignable causes of variation.



SPC in Quality Management

- SPC uses
 - Is the process in control?
 - Identify problems in order to make improvements
 - Contribute to the TQM goal of continuous improvement

Quality Measures: Attributes and Variables

- Attribute
 - A characteristic which is evaluated with a discrete response
 - good/bad; yes/no; correct/incorrect
- Variable measure
 - A characteristic that is continuous and can be measured
 - · Weight, length, voltage, volume

SPC Applied to Services

- Nature of defects is different in services
- Service defect is a failure to meet customer requirements
- Monitor time and customer satisfaction

SPC Applied to Services

Hospitals

 timeliness & quickness of care, staff responses to requests, accuracy of lab tests, cleanliness, courtesy, accuracy of paperwork, speed of admittance & checkouts

Grocery stores

 waiting time to check out, frequency of out-of-stock items, quality of food items, cleanliness, customer complaints, checkout register errors

Airlines

 flight delays, lost luggage & luggage handling, waiting time at ticket counters & check-in, agent & flight attendant courtesy, accurate flight information, cabin cleanliness & maintenance

SPC Applied to Services

Fast-food restaurants

 waiting time for service, customer complaints, cleanliness, food quality, order accuracy, employee courtesy

Catalogue-order companies

 order accuracy, operator knowledge & courtesy, packaging, delivery time, phone order waiting time

Insurance companies

 billing accuracy, timeliness of claims processing, agent availability & response time

Where to Use Control Charts

Process

- Has a tendency to go out of control
- Is particularly harmful and costly if it goes out of control

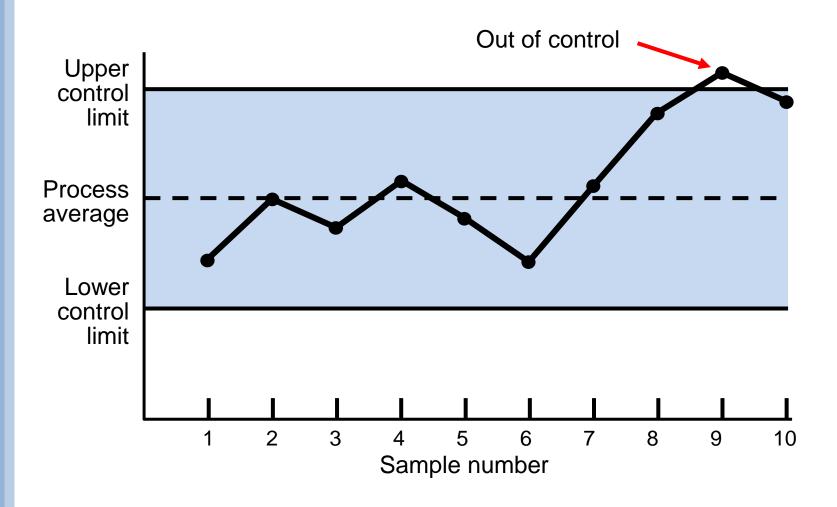
Examples

- At beginning of process because of waste to begin production process with bad supplies
- Before a costly or irreversible point, after which product is difficult to rework or correct
- Before and after assembly or painting operations that might cover defects
- Before the outgoing final product or service is delivered

Control Charts

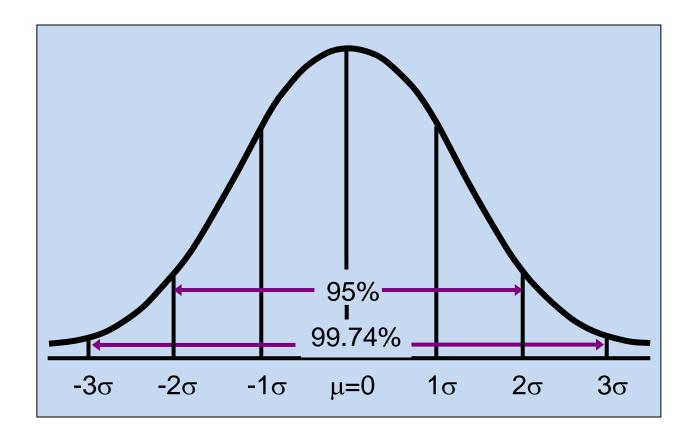
- A graph that monitors process quality
- Control limits
 - upper and lower bands of a control chart
- Attributes chart
 - p-chart
 - c-chart
- Variables chart
 - mean (x bar chart)
 - range (R-chart)

Process Control Chart



Normal Distribution

• Probabilities for Z=2.00 and Z=3.00



A Process Is in Control If ...

- 1. ... no sample points outside limits
- 2. ... most points near process average
- 3. ... about equal number of points above and below centerline
- 4. ... points appear randomly distributed

Control Charts for Attributes

- p-chart
 - uses portion defective in a sample
- c-chart
 - uses number of defects (non-conformities) in a sample

p-Chart

$$UCL = \overline{p} + z\sigma_{p}$$

$$LCL = \overline{p} - z\sigma_{p}$$

z = number of standard deviations from process average \bar{p} = sample proportion defective; estimates process mean $\sigma_{\bar{p}}$ = standard deviation of sample proportion

$$\sigma_p = \sqrt{\frac{\overline{p}(1-\overline{p})}{n}}$$

| SAMPLE # | NUMBER OF DEFECTIVES | PROPORTION DEFECTIVE | | | |
|----------------------------------|-------------------------|-------------------------|--|--|--|
| 1 | 6 | .06 | | | |
| 2 | 0 | .00 | | | |
| 3 | 4 | .04 | | | |
| : | : | : | | | |
| : | : | : | | | |
| 20 | 18 | .18 | | | |
| | 200 | | | | |
| 20 samples of 100 pairs of jeans | | | | | |

$$UCL = \bar{p} + z \sqrt{\frac{\bar{p}(1 - \bar{p})}{n}} =$$

$$LCL = \overline{p} - z \sqrt{\frac{\overline{p}(1 - \overline{p})}{n}} =$$

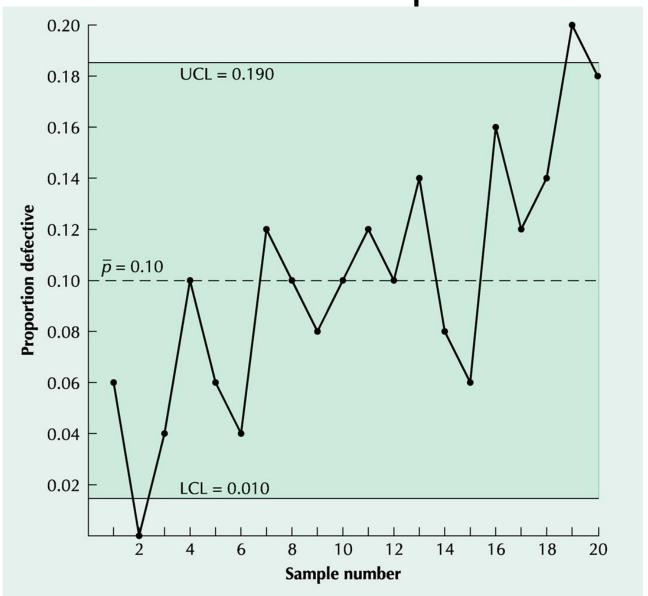
$$\overline{p} = \frac{\text{total defectives}}{\text{total sample observations}} = 200 / 20(100) = 0.10$$

UCL =
$$\bar{p} + z \sqrt{\frac{\bar{p}(1 - \bar{p})}{n}} = 0.10 + 3 \sqrt{\frac{0.10(1 - 0.10)}{100}}$$

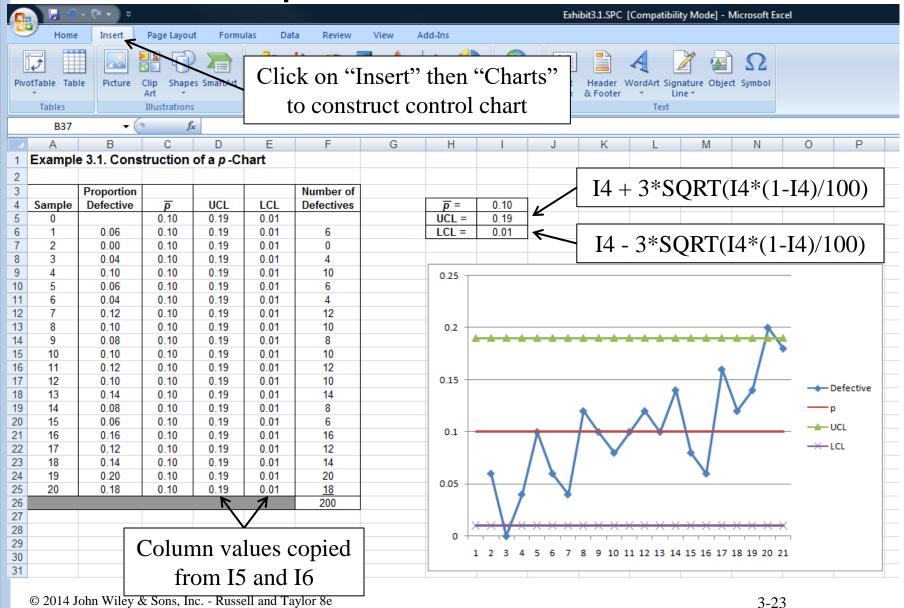
UCL = 0.190

LCL =
$$\bar{p} - z \sqrt{\frac{\bar{p}(1 - \bar{p})}{n}} = 0.10 - 3 \sqrt{\frac{0.10(1 - 0.10)}{100}}$$

LCL = 0.010



p-Chart in Excel



$$UCL = \overline{c} + z\sigma_c$$

$$LCL = \overline{c} - z\sigma_c$$

$$\sigma_c = \sqrt{\overline{c}}$$

where

c = number of defects per sample

Number of defects in 15 sample rooms

| 0.41451.5 | NUMBER OF | |
|-----------|--------------|-----------------------|
| SAMPLE | DEFECTS | |
| 1 | 12 | $\overline{c} =$ |
| 2 | 8 | $UCL = c + z\sigma_c$ |
| 3 | 16 | |
| • | • | |
| • | • | $LCL = c - z\sigma_c$ |
| 15 | 15 | |
| | 190 | |

Number of defects in 15 sample rooms

| SAMPLE | NUMBER OF DEFECTS | |
|--------|-------------------------|--|
| 1 | 12 | |
| 2 | 8 | |
| 3 | 16 | |
| : | : | |
| | : | |
| 15 | <u>15</u> 190 | |

$$\overline{c} = \frac{190}{15} = 12.67$$

$$UCL = \overline{c} + z\sigma_c$$

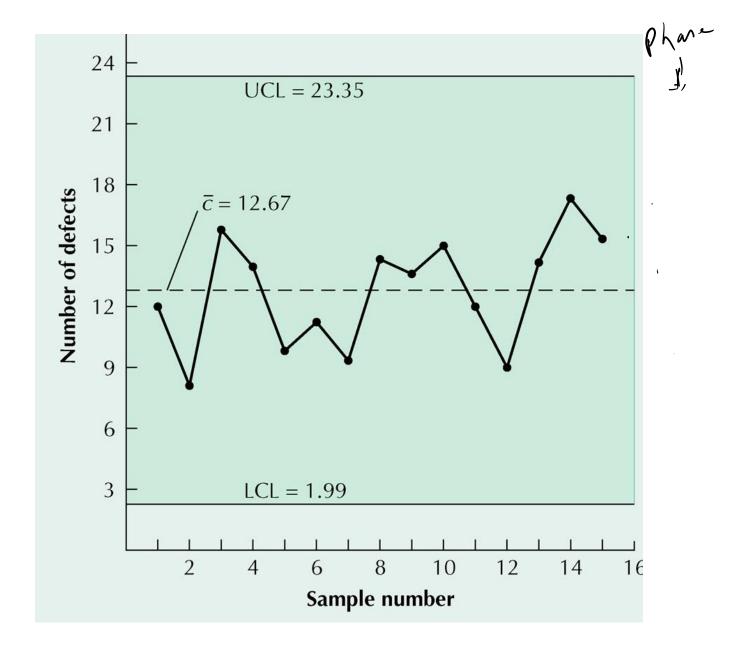
$$= 12.67 + 3\sqrt{12.67}$$

$$= 23.35$$

$$LCL = \overline{c} - z\sigma_c$$

$$= 12.67 - 3\sqrt{12.67}$$

= 1.99



Control Charts for Variables

- Range chart (R-Chart)
 - Plot sample range (variability)
- Mean chart (x̄ -Chart)
 - Plot sample averages

x-bar Chart: σ Known

$$UCL = \overline{\overline{X}} + z \, \sigma_{\overline{x}}$$

$$LCL = \overline{\overline{X}} - z \, \sigma_{\overline{x}}$$
Where
$$\overline{\overline{X}} = \frac{\overline{x}_1 + \overline{x}_2 + ... + \overline{x}_k}{k}$$

 σ = process standard deviation

 σ_x = standard deviation of sample means = σ/\sqrt{n}

k = number of samples (subgroups)

n = sample size (number of observations)

x-bar Chart Example: σ Known

| Observations(Slip-Ring Diameter, cm) n | | | | | | | | |
|--|------|------|------|------|------|-------|--|--|
| Sample k | 1 | 2 | 3 | 4 | 5 | - | | |
| 1 | 5.02 | 5.01 | 4.94 | 4.99 | 4.96 | 4.98 | | |
| 2 | 5.01 | 5.03 | 5.07 | 4.95 | 4.96 | 5.00 | | |
| 3 | 4.99 | 5.00 | 4.93 | 4.92 | 4.99 | 4.97 | | |
| 4 | 5.03 | 4.91 | 5.01 | 4.98 | 4.89 | 4.96 | | |
| 5 | 4.95 | 4.92 | 5.03 | 5.05 | 5.01 | 4.99 | | |
| 6 | 4.97 | 5.06 | 5.06 | 4.96 | 5.03 | 5.01 | | |
| 7 | 5.05 | 5.01 | 5.10 | 4.96 | 4.99 | 5.02 | | |
| 8 | 5.09 | 5.10 | 5.00 | 4.99 | 5.08 | 5.05 | | |
| 9 | 5.14 | 5.10 | 4.99 | 5.08 | 5.09 | 5.08 | | |
| 10 | 5.01 | 4.98 | 5.08 | 5.07 | 4.99 | 5.03 | | |
| | | | | | | 50.09 | | |

We know $\sigma = .08$

x-bar Chart Example: σ Known

$$\overline{\overline{X}} = \frac{\overline{X}_1 + \overline{X}_2 + \dots + \overline{X}_k}{k}$$

$$UCL = \overline{\overline{X}} + z \sigma_{\overline{X}}$$

$$LCL = \overline{\overline{x}} - z \sigma_x$$

x-bar Chart Example: σ Known

$$\overline{X} = \frac{50.09}{10} = 5.01$$

$$UCL = \overline{X} + z \sigma_{\overline{X}}$$

$$= 5.01 + 3(.08 / \sqrt{5})$$

$$= 5.12$$

$$LCL = \overline{X} - z \sigma_{\overline{X}}$$

$$= 5.01 - 3(.08 / \sqrt{5})$$

$$= 4.90$$

x-bar Chart Example: σ Unknown

$$UCL = \overline{x} + A_2 \overline{R} \qquad LCL = \overline{x} - A_2 \overline{R}$$

where

 $\overline{\overline{x}}$ = average of the sample means

 \overline{R} = average range value

Control Chart Factors

| Sample | | | |
|--------|--------------------|-------------|---------|
| Size | Factor for X-chart | Factors for | R-chart |
| n | A2 | D3 | D4 |
| 2 | 1.880 | 0.000 | 3.267 |
| 3 | 1.023 | 0.000 | 2.575 |
| 4 | 0.729 | 0.000 | 2.282 |
| 5 | 0.577 | 0.000 | 2.114 |
| 6 | 0.483 | 0.000 | 2.004 |
| 7 | 0.419 | 0.076 | 1.924 |
| 8 | 0.373 | 0.136 | 1.864 |
| 9 | 0.337 | 0.184 | 1.816 |
| 10 | 0.308 | 0.223 | 1.777 |
| 11 | 0.285 | 0.256 | 1.744 |
| 12 | 0.266 | 0.283 | 1.717 |
| 13 | 0.249 | 0.307 | 1.693 |
| 14 | 0.235 | 0.328 | 1.672 |
| 15 | 0.223 | 0.347 | 1.653 |
| 16 | 0.212 | 0.363 | 1.637 |
| 17 | 0.203 | 0.378 | 1.622 |
| 18 | 0.194 | 0.391 | 1.609 |
| 19 | 0.187 | 0.404 | 1.596 |
| 20 | 0.180 | 0.415 | 1.585 |
| 21 | 0.173 | 0.425 | 1.575 |
| 22 | 0.167 | 0.435 | 1.565 |
| 23 | 0.162 | 0.443 | 1.557 |
| 24 | 0.157 | 0.452 | 1.548 |
| 25 | 0.153 | 0.459 | 1.541 |

x-bar Chart Example: σ Unknown

| | OBSERVATIONS (SLIP- RING DIAMETER, CM) | | | | | | |
|----------|--|------|------|------|--------|-------|------|
| SAMPLE k | 1 | 2 | 3 | 4 | 5 | X | R |
| 1 | 5.02 | 5.01 | 4.94 | 4.99 | 4.96 | 4.98 | 0.08 |
| 2 | 5.01 | 5.03 | 5.07 | 4.95 | 4.96 | 5.00 | 0.12 |
| 3 | 4.99 | 5.00 | 4.93 | 4.92 | 4.99 | 4.97 | 0.08 |
| 4 | 5.03 | 4.91 | 5.01 | 4.98 | 4.89 | 4.96 | 0.14 |
| 5 | 4.95 | 4.92 | 5.03 | 5.05 | 5.01 | 4.99 | 0.13 |
| 6 | 4.97 | 5.06 | 5.06 | 4.96 | 5.03 | 5.01 | 0.10 |
| 7 | 5.05 | 5.01 | 5.10 | 4.96 | 4.99 | 5.02 | 0.14 |
| 8 | 5.09 | 5.10 | 5.00 | 4.99 | 5.08 | 5.05 | 0.11 |
| 9 | 5.14 | 5.10 | 4.99 | 5.08 | 5.09 | 5.08 | 0.15 |
| 10 | 5.01 | 4.98 | 5.08 | 5.07 | 4.99 | 5.03 | 0.10 |
| | | | | | Totals | 50.09 | 1.15 |

Control Limits for the \bar{x} Chart

$$UCL = \overline{x} + A_2 \overline{R}$$

$$Center line = \overline{x}$$

$$LCL = \overline{x} - A_2 \overline{R}$$
(6.4)

The constant A_2 is tabulated for various sample sizes in Appendix Table VI.

Control Limits for the R Chart

$$UCL = D_4 \overline{R}$$

$$Center line = \overline{R}$$

$$LCL = D_3 \overline{R}$$
(6.5)

The constants D_3 and D_4 are tabulated for various values of n in Appendix Table VI.

$$\hat{\sigma} = \frac{\overline{R}}{d_2} \tag{6.6}$$

If we use $\overline{\overline{x}}$ as an estimator of μ and \overline{R}/d_2 as an estimator of σ , then the parameters of the \overline{x} chart are

$$UCL = \overline{x} + \frac{3}{d_2 \sqrt{n}} \overline{R}$$

$$Center line = \overline{x}$$

$$LCL = \overline{x} - \frac{3}{d_2 \sqrt{n}} \overline{R}$$
(6.7)

If we define

$$A_2 = \frac{3}{d_2\sqrt{n}}\tag{6.8}$$

then equation (6.7) reduces to equation (6.4).

x-bar Chart Example: σ Unknown

$$\overline{R} = \frac{\sum R}{k}$$

$$\overline{\overline{x}} = \frac{\sum \overline{x}}{k}$$

$$UCL = \overline{\overline{x}} + A_2 \overline{R}$$

$$LCL = \overline{\overline{x}} - A_2 \overline{R}$$

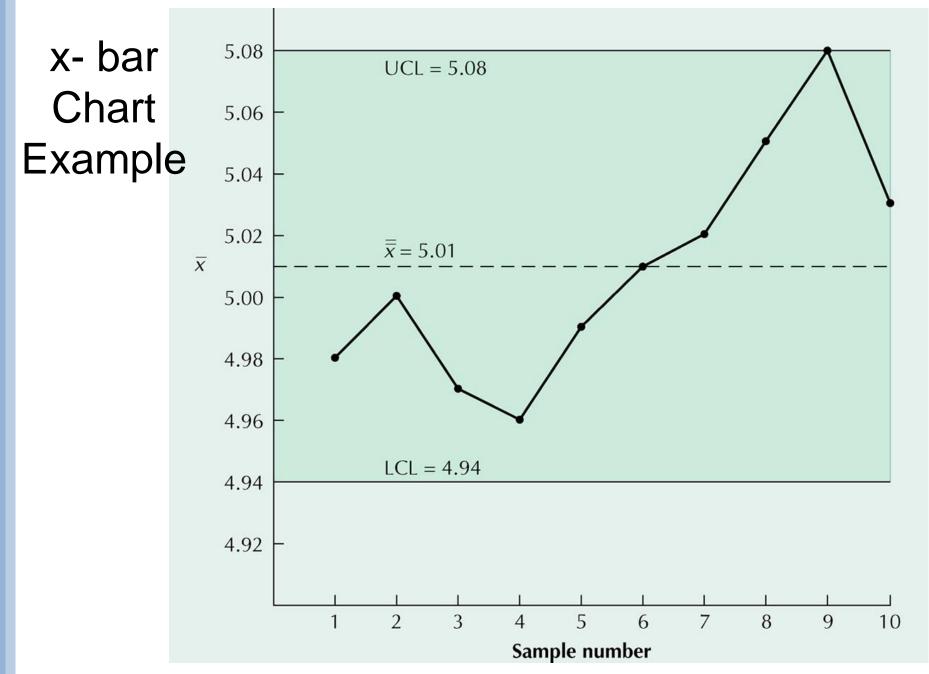
x-bar Chart Example: σ Unknown

$$\overline{R} = \frac{\sum R}{k} = \frac{1.15}{10} = 0.115$$

$$\overline{\overline{x}} = \frac{\sum \overline{x}}{k} = \frac{50.09}{10} = 5.01 \text{ cm}$$

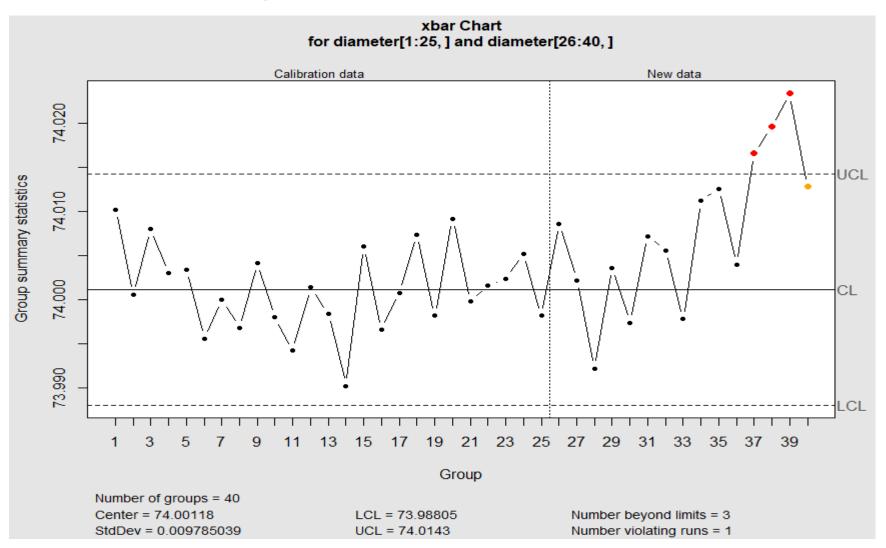
$$UCL = \overline{\overline{x}} + A_2 \overline{R} = 5.01 + (0.58)(0.115) = 5.08$$

$$LCL = \overline{\overline{x}} - A_2 \overline{R} = 5.01 - (0.58)(0.115) = 4.94$$



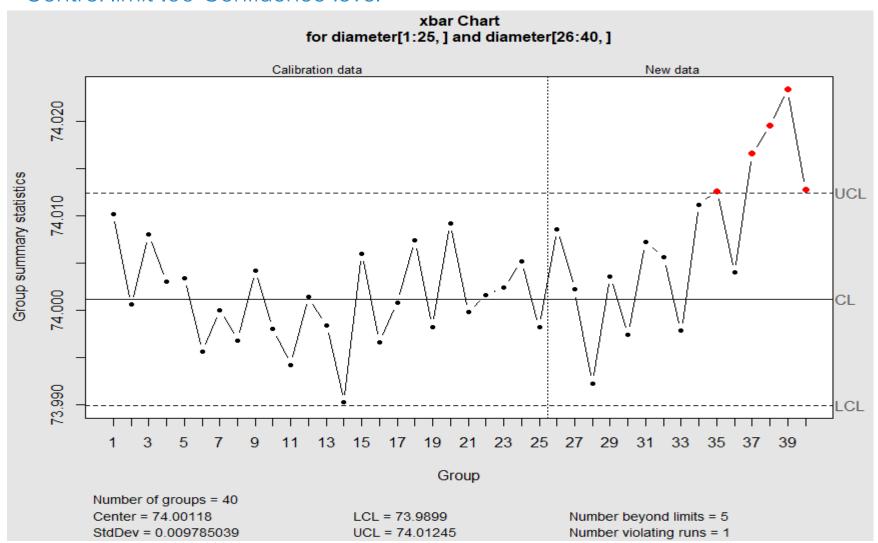
Piston rings

Control Limits = 3 sigma



Piston rings

Control limit .99 Confidence level



R- Chart

$$UCL = D_4R$$

$$LCL = D_3R$$

$$R = \frac{\sum R}{k}$$

Where

R = range of each sample

k = number of samples (sub groups)

Control Limits for the \bar{x} Chart

$$UCL = \overline{x} + A_2 \overline{R}$$

$$Center line = \overline{x}$$

$$LCL = \overline{x} - A_2 \overline{R}$$
(6.4)

The constant A_2 is tabulated for various sample sizes in Appendix Table VI.

Control Limits for the R Chart

$$UCL = D_4 \overline{R}$$

$$Center line = \overline{R}$$

$$LCL = D_3 \overline{R}$$
(6.5)

The constants D_3 and D_4 are tabulated for various values of n in Appendix Table VI.

Now consider the R chart. The center line will be \overline{R} . To determine the control limits, we need an estimate of σ_R . Assuming that the quality characteristic is normally distributed, $\hat{\sigma}_R$ can be found from the distribution of the relative range $W = R/\sigma$. The standard deviation of W, say d_3 , is a known function of n. Thus, since

$$R = W\sigma$$

the standard deviation of R is

$$\sigma_R = d_3 \sigma$$

Since σ is unknown, we may estimate σ_R by

$$\hat{\sigma}_R = d_3 \frac{\overline{R}}{d_2} \tag{6.9}$$

Consequently, the parameters of the R chart with the usual three-sigma control limits are

$$UCL = \overline{R} + 3\hat{\sigma}_R = \overline{R} + 3d_3 \frac{\overline{R}}{d_2}$$

$$Center line = \overline{R}$$

$$LCL = \overline{R} - 3\hat{\sigma}_R = \overline{R} - 3d_3 \frac{\overline{R}}{d_2}$$
(6.10)

If we let

$$D_3 = 1 - 3\frac{d_3}{d_2}$$
 and $D_4 = 1 + 3\frac{d_3}{d_2}$

equation (6.10) reduces to equation (6.5).

| | OBSERVATIONS (SLIP- RING DIAMETER, CM) | | | | | | | |
|----------|--|------|------|------|--------|-------|------|--|
| SAMPLE k | 1 | 2 | 3 | 4 | 5 | X | R | |
| 1 | 5.02 | 5.01 | 4.94 | 4.99 | 4.96 | 4.98 | 0.08 | |
| 2 | 5.01 | 5.03 | 5.07 | 4.95 | 4.96 | 5.00 | 0.12 | |
| 3 | 4.99 | 5.00 | 4.93 | 4.92 | 4.99 | 4.97 | 0.08 | |
| 4 | 5.03 | 4.91 | 5.01 | 4.98 | 4.89 | 4.96 | 0.14 | |
| 5 | 4.95 | 4.92 | 5.03 | 5.05 | 5.01 | 4.99 | 0.13 | |
| 6 | 4.97 | 5.06 | 5.06 | 4.96 | 5.03 | 5.01 | 0.10 | |
| 7 | 5.05 | 5.01 | 5.10 | 4.96 | 4.99 | 5.02 | 0.14 | |
| 8 | 5.09 | 5.10 | 5.00 | 4.99 | 5.08 | 5.05 | 0.11 | |
| 9 | 5.14 | 5.10 | 4.99 | 5.08 | 5.09 | 5.08 | 0.15 | |
| 10 | 5.01 | 4.98 | 5.08 | 5.07 | 4.99 | 5.03 | 0.10 | |
| | | | | | Totals | 50.09 | 1.15 | |

$$UCL = D_4\overline{R} =$$

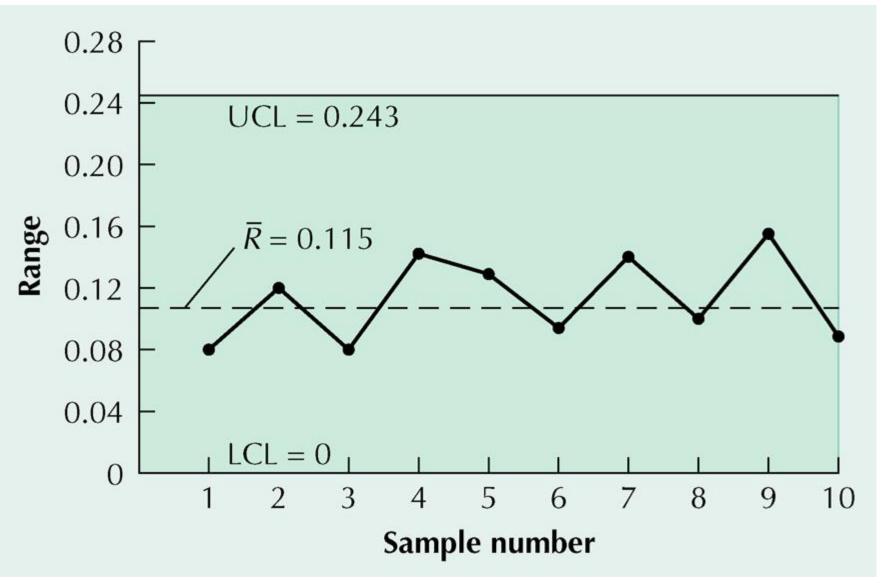
$$LCL = D_3\overline{R} =$$

Retrieve chart factors D₃ and D₄

$$UCL = D_4 \overline{R} = 2.11(0.115) = 0.243$$

$$LCL = D_3\overline{R} = 0(0.115) = 0$$

Retrieve chart factors D₃ and D₄



Using x- bar and R-Charts Together

- Process average and process variability must be in control
- Samples can have very narrow ranges, but sample averages might be beyond control limits
- Or, sample averages may be in control, but ranges might be out of control
- An R-chart might show a distinct downward trend, suggesting some nonrandom cause is reducing variation

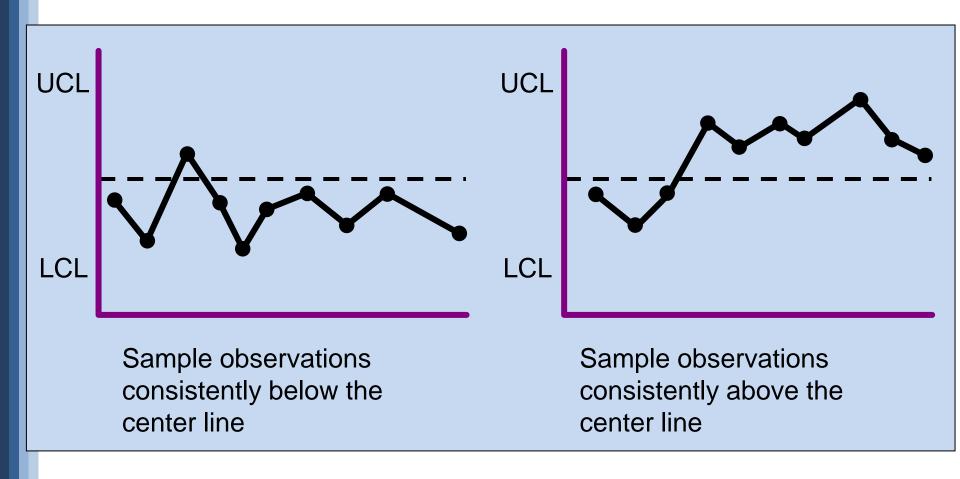
Run

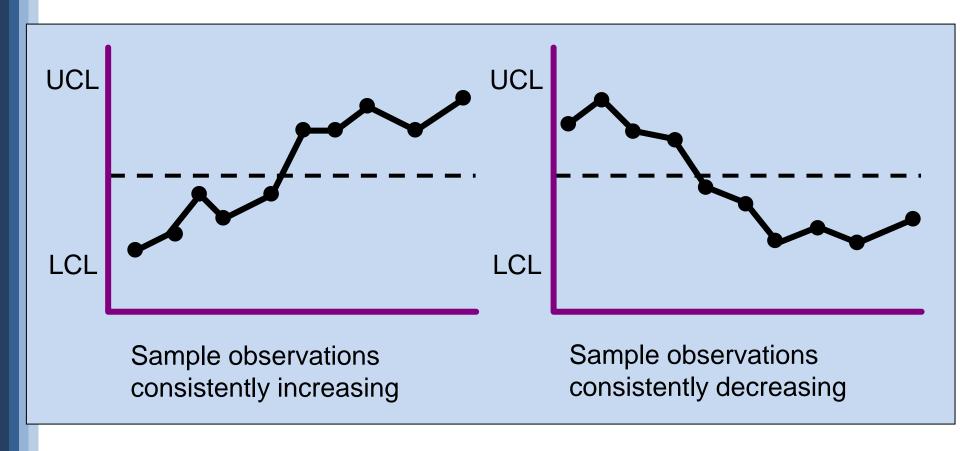
 sequence of sample values that display same characteristic

Pattern test

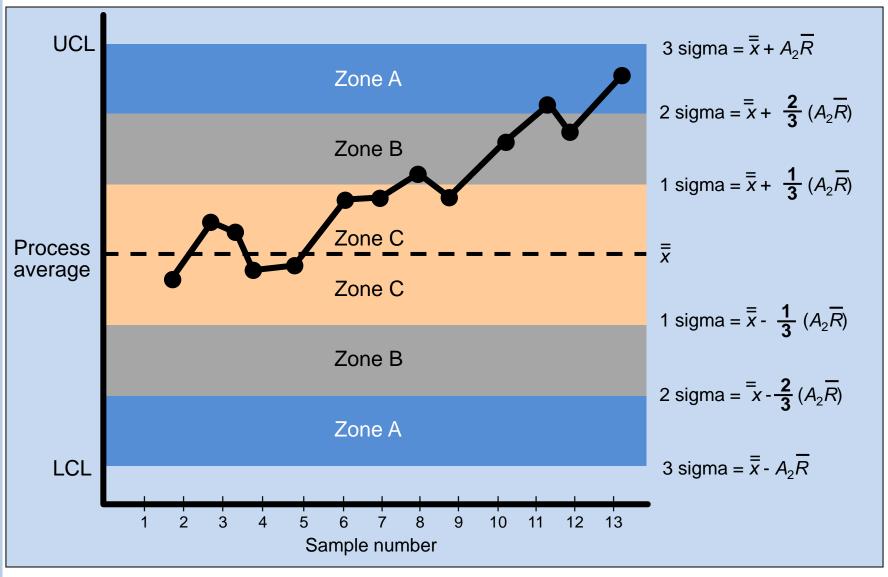
 determines if observations within limits of a control chart display a nonrandom pattern

- To identify a pattern look for:
 - 8 consecutive points on one side of the center line
 - 8 consecutive points up or down
 - 14 points alternating up or down
 - 2 out of 3 consecutive points in zone A (on one side of center line)
 - 4 out of 5 consecutive points in zone A or B (on one side of center line)





Zones for Pattern Tests



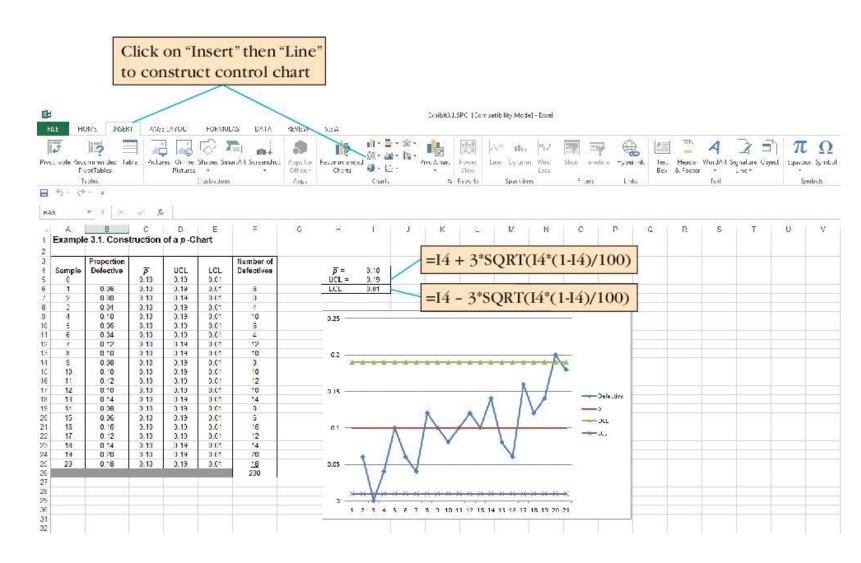
Performing a Pattern Test

| SAMPLE | \overline{x} | ABOVE/BELOW | UP/DOWN | ZONE |
|--------|----------------|-------------|----------|------|
| 1 | 4.98 | В | <u>—</u> | В |
| 2 | 5.00 | В | U | С |
| 3 | 4.95 | В | D | Α |
| 4 | 4.96 | В | D | А |
| 5 | 4.99 | В | U | С |
| 6 | 5.01 | <u>—</u> | U | С |
| 7 | 5.02 | Α | U | С |
| 8 | 5.05 | Α | U | В |
| 9 | 5.08 | Α | U | Α |
| 10 | 5.03 | Α | D | В |

Sample Size Determination

- Attribute charts require larger sample sizes
 - 50 to 100 parts in a sample
- Variable charts require smaller samples
 - 2 to 10 parts in a sample

SPC with Excel



INDIAN INSTITUTE OF TECHNOLOGY ROORKEE



Process Capability Analysis

Prof. Tarun Sharma



Process variability



Design specifications

 Are they aligned with each other?

Definitions

- Process variability
 - Process Range = 6*sigma

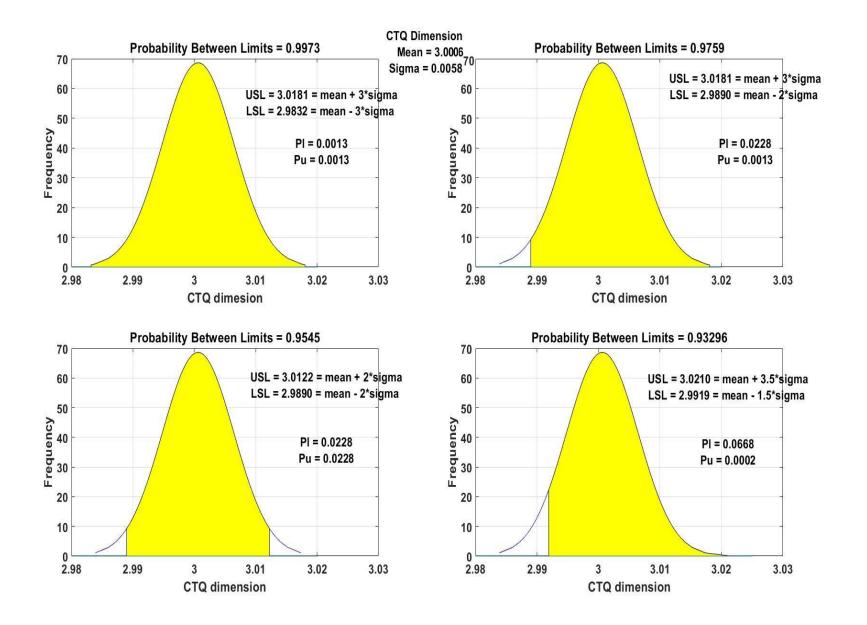
Where sigma is the standard deviation of the CTQ dimension

- Design Specifications
 - Upper Specification Limit (USL)
 - Lower Specification Limit (LSL)
 - Tolerance Range = USL LSL

Definitions

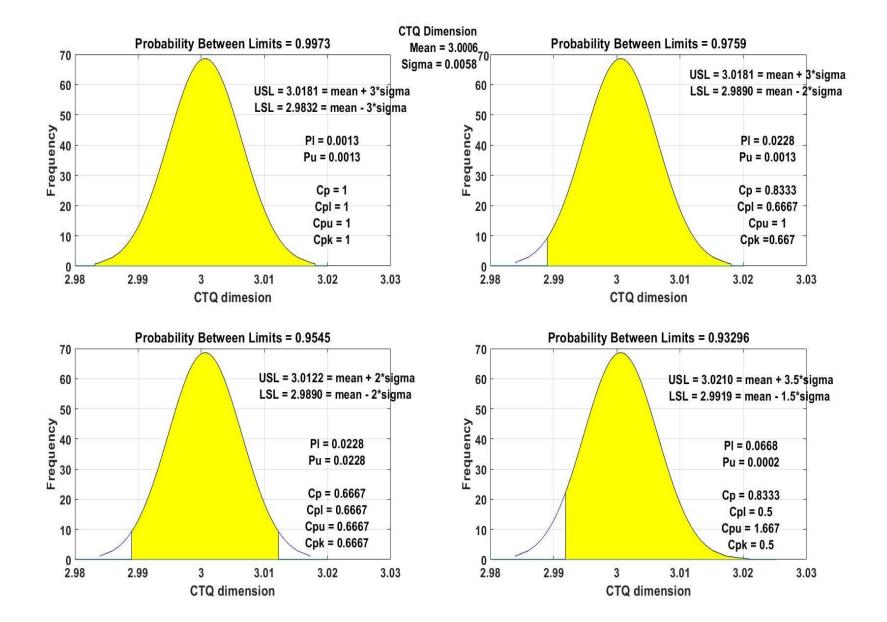
Process fallout

Fraction of the process output which does not meet the specification,
 i.e., the CTQ dimension is outside of the design specifications

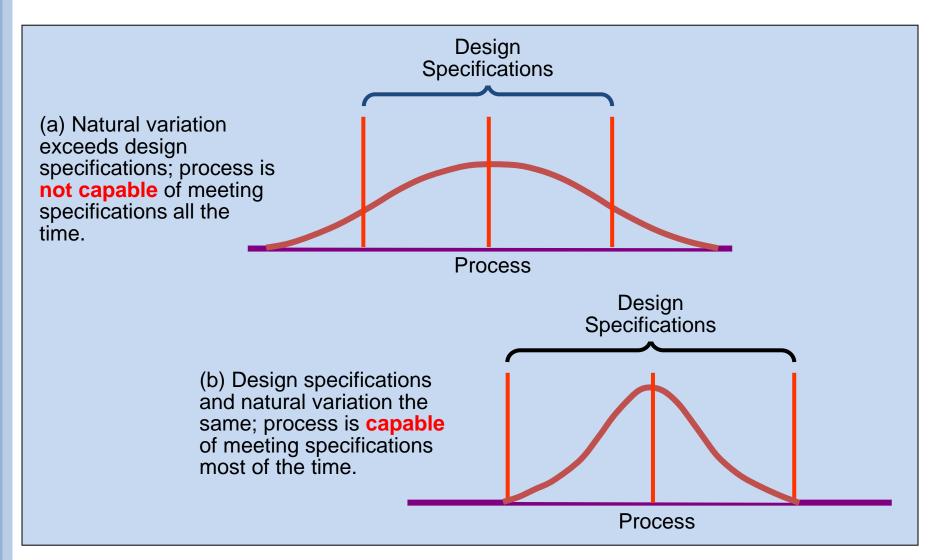


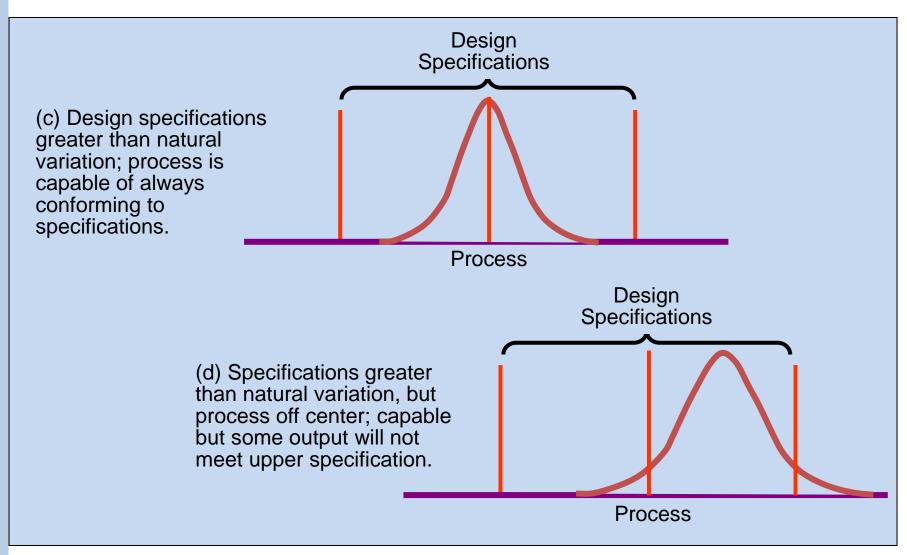
Numeric measure of Process Capability

- Process Capability Ratio (Cp) = Tolerance Range/ Process variation
- Process Capability Index (Cpk) = Min{(Mean LSL)/(3*sigma), (USL-Mean)/(3*sigma)}



- Compare natural variability to design variability
- Natural variability
 - What we measure with control charts
 - Process mean = 8.80 oz, Std dev. = 0.12 oz
- Tolerances
 - Design specifications reflecting product requirements
 - Net weight = $9.0 \text{ oz} \pm 0.5 \text{ oz}$
 - Tolerances are ± 0.5 oz





Process Capability Ratio

$$C_p = {tolerance range \over process range}$$

$$= {upper spec limit - lower spec limit \over 6\sigma}$$

Computing C_p

Net weight specification = $9.0 \text{ oz} \pm 0.5 \text{ oz}$ Process mean = 8.80 ozProcess standard deviation = 0.12 oz

$$C_{p} = \frac{\text{upper specification limit}}{6\sigma}$$

Computing C_p

Net weight specification = $9.0 \text{ oz} \pm 0.5 \text{ oz}$ Process mean = 8.80 ozProcess standard deviation = 0.12 oz

$$C_{p} = \frac{\text{upper specification limit -}}{6\sigma}$$

$$= \frac{9.5 - 8.5}{6(0.12)} = 1.39$$

Process Capability Index

 $C_{pk} = minimum \left[\begin{array}{c} \overline{\overline{x}} \text{ - lower specification limit} \\ \hline 3\sigma \\ \hline upper specification limit - \overline{\overline{x}} \\ \hline 3\sigma \\ \end{array} \right]$

Computing C_{pk}

```
Net weight specification = 9.0 \text{ oz} \pm 0.5 \text{ oz}
Process mean = 8.80 \text{ oz}
Process standard deviation = 0.12 \text{ oz}
```

$$C_{pk} = minimum$$

```
\frac{\overline{\overline{x}} \text{ - lower specification limit}}{3\sigma}, upper specification limit - \overline{\overline{x}} 3\sigma
```

Computing C_{pk}

Net weight specification = $9.0 \text{ oz} \pm 0.5 \text{ oz}$ Process mean = 8.80 ozProcess standard deviation = 0.12 oz

$$= \min \left[\frac{8.80 - 8.50}{3(0.12)}, \frac{9.50 - 8.80}{3(0.12)} \right] = 0.83$$

Impact of Process Capability Studies on management decision problems

- Make or buy decision
- Plant and process improvements to reduce process variability
- Contractual agreements with customers or vendors regarding product quality

Process Capability With Excel

