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# **Six Sigma & Software/Systems Process Improvement**

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## **Outline / Objectives**

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Six Sigma Overview

Applications Survey

Initiative Synergy

Illustration



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## **Six Sigma Is...**

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**A Philosophy**

**A Metric**

**An Improvement Framework**



# Six Sigma Philosophy

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**Improve  
customer satisfaction  
by reducing and eliminating  
defects**



**Greater Profits**





## What is a Defect?

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### Six Sigma:

- Any product, service, or process variation which prevents meeting the needs of the customer and/or which adds cost, whether or not it is detected.

### Personal Software Process<sup>SM</sup>:

- Defects or faults are the result of errors or mistakes. At a minimum, count a defect every time the program is changed during compile or test, where the change might be one character or multiple statements

[Humphrey 95]

<sup>SM</sup>Personal Software Process and PSP are service marks of Carnegie Mellon University.



## Six Sigma Metrics

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“3.4 ppm” – the most-cited metric

### Other Measures

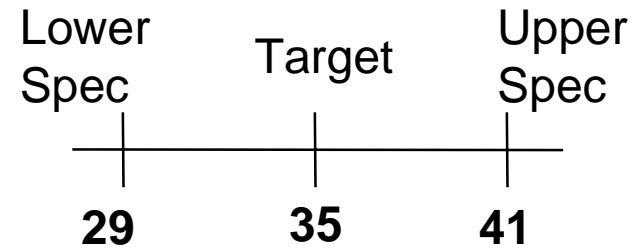
- Defect Rate, parts per million (ppm)
- Sigma Level
- Defects per Unit (dpu)
- Defects per Million Opportunities (dpmo)
- Yield



## “3.4” and “Sigma” Metrics <sup>1</sup>

New Car Buyer’s target:

- 35 miles per gallon (mpg)
- 29-41 mpg acceptable



Two Choices:

### Car 1

35 +/- 2 mpg

$$(35-29) / 2 = 3$$

$$(41-35) / 2 = 3$$

**3 Sigma**

~3/1000 outside limits

### Car 2

35 +/- 1 mpg

$$(35-29) / 1 = 6$$

$$(41-35) / 1 = 6$$

**6 Sigma**

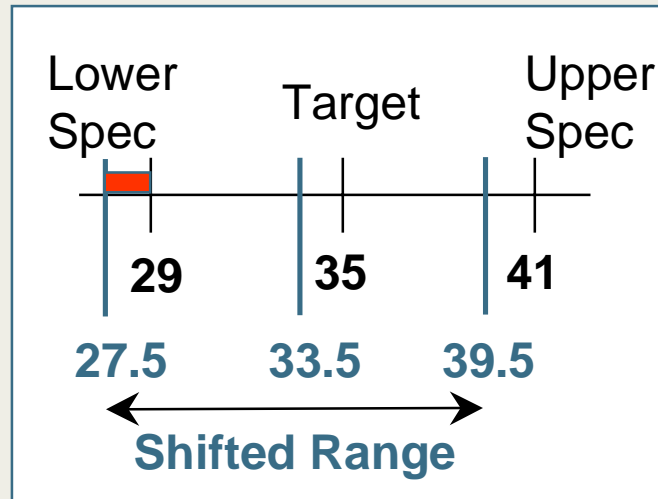
virtually 0 outside limits



## “3.4” and “Sigma” Metrics <sub>2</sub>

Historical data:

1.5\*standard deviation shift over time



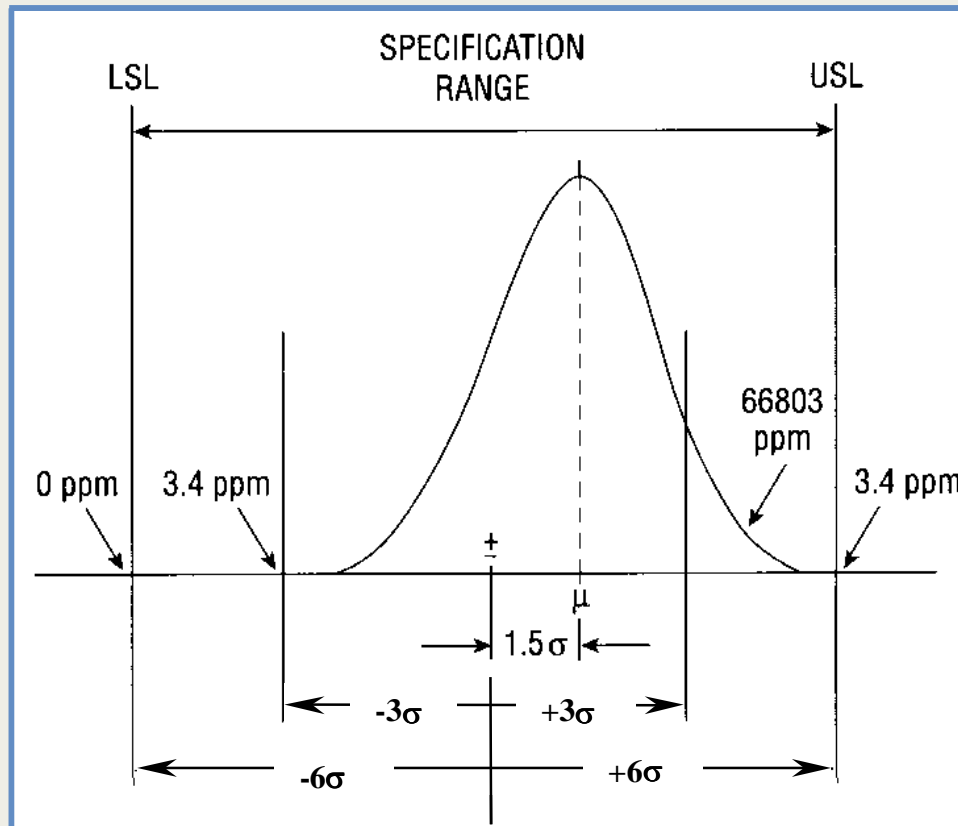
Car 2:

- Mean shifts to 33.5
- “Mean - 6\*Std Dev” now extends below lower spec
- Extension corresponds to 3.4 ppm if normal distribution





## Six Sigma Process with Mean Shift

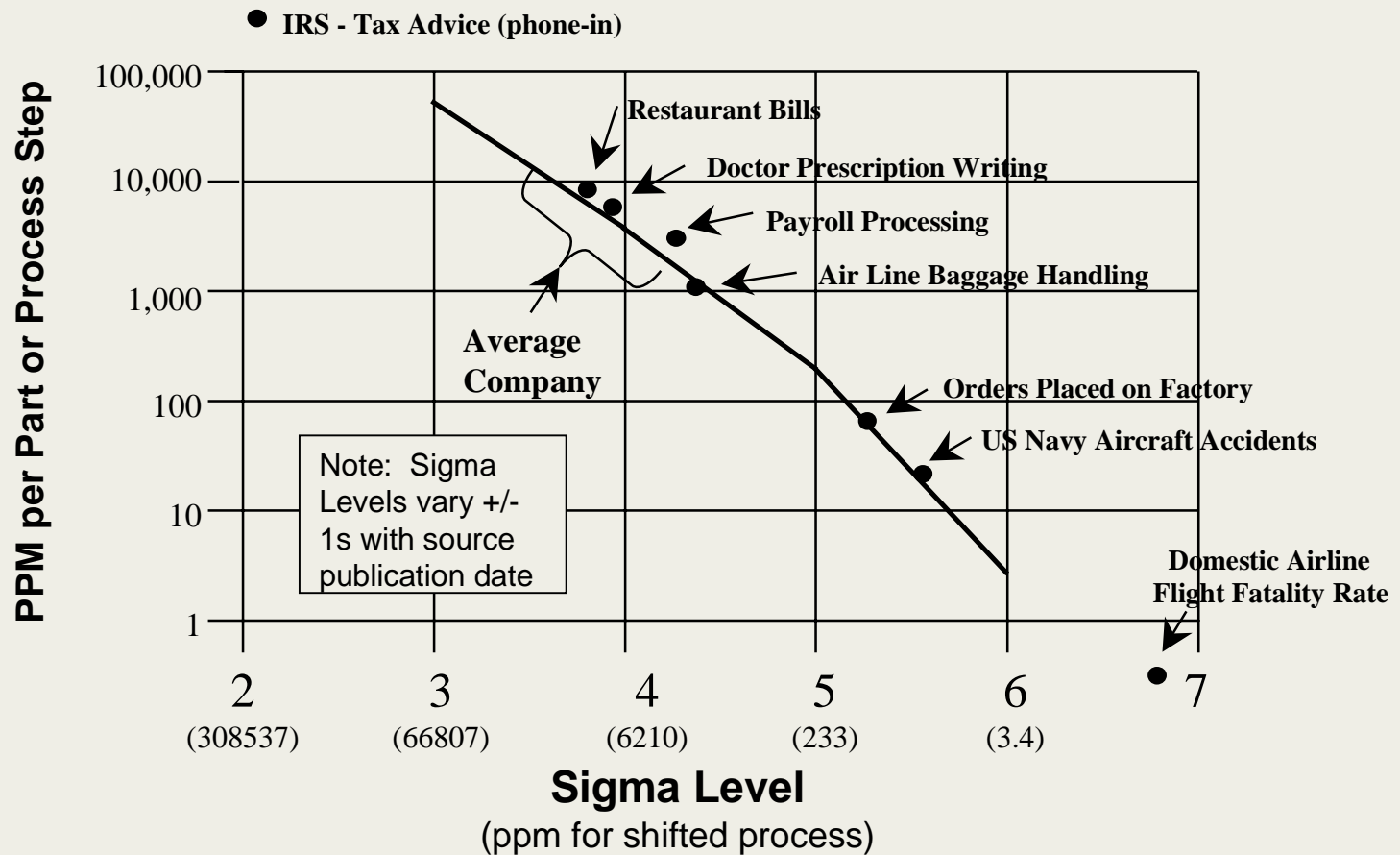


### Assumptions:

- normal distribution
- process mean shift of  $1.5\sigma$  from nominal is likely
- process mean and standard deviation are known
- defects are randomly distributed throughout units
- parts and process steps are independent



# Example Sigma Levels



[Harrold 98], [Harry 00]

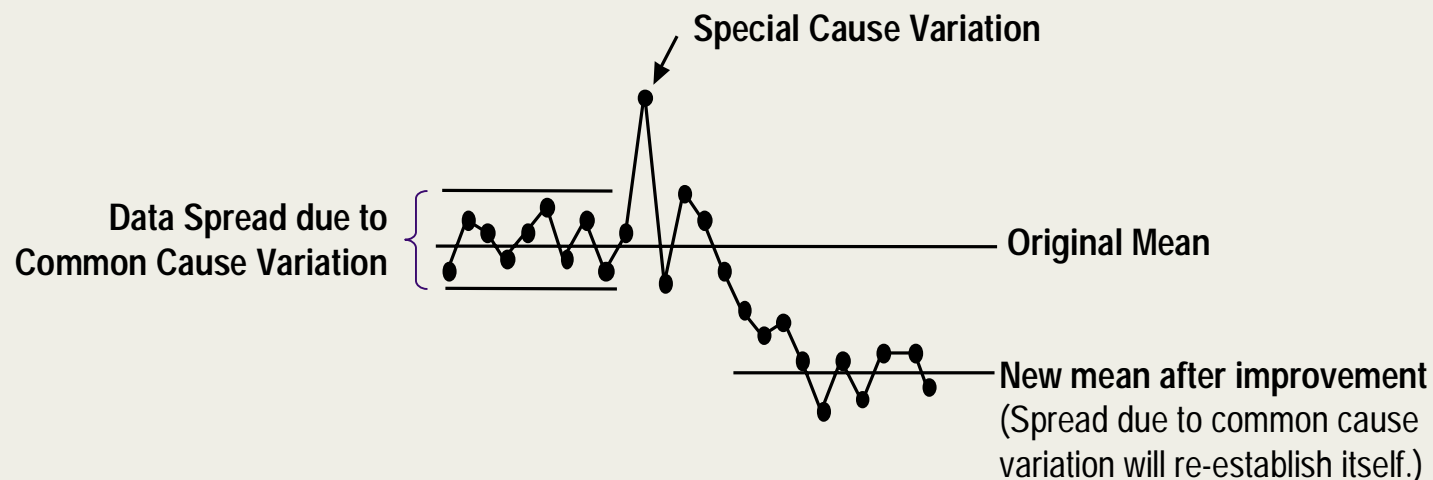
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# Statistical Thinking

- Everything is a process
- All processes have inherent variability
- Data is used to understand variation and to drive decisions to improve the processes

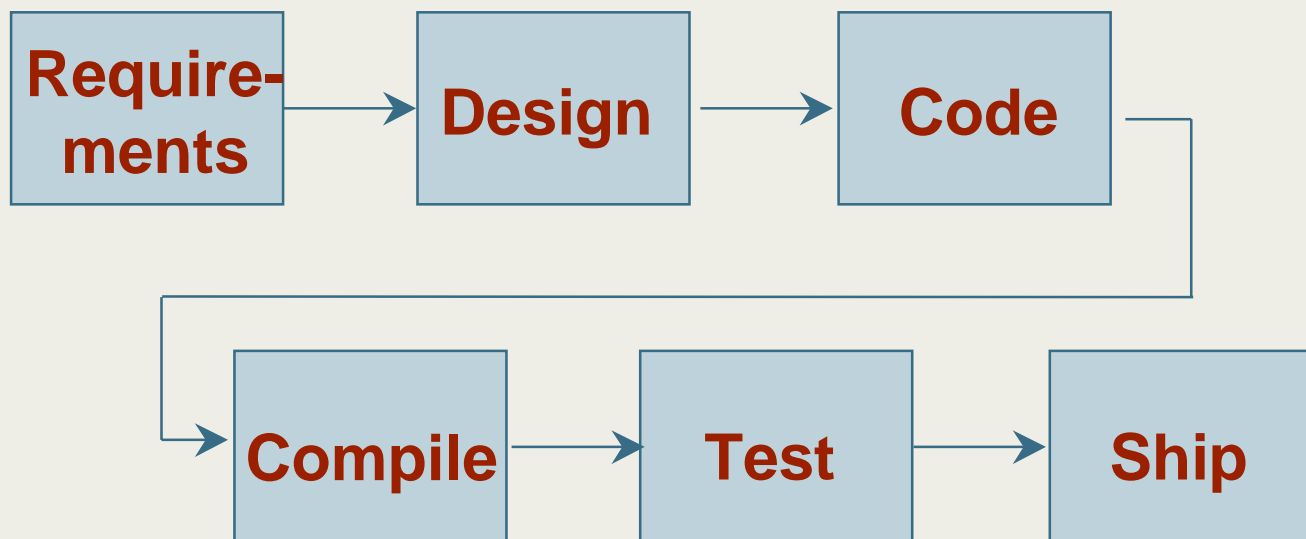


[ASQ 00], [ASA 01]



# Everything Is a Process

## Example: Software Engineering





# Six Sigma Improvement Framework

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## Six Sigma Toolkit

Define	Measure	Analyze	Improve	Control
<ul style="list-style-type: none"><li>• Benchmark</li><li>• <b>Baseline</b></li><li>• Contract/Charter</li><li>• Kano Model</li><li>• <b>Voice of the Customer</b></li><li>• Voice of the Business</li><li>• Quality Function Deployment</li><li>• <b>Process Flow Map</b></li><li>• Project Management</li><li>• <b>"Management by Fact"</b></li><li>• -4 What's</li></ul>	<ul style="list-style-type: none"><li>• <b>7 Basic Tools</b></li><li>• Defect Metrics (i.e., "ppm")</li><li>• Data Collection Forms, Plan, Logistics</li><li>• Sampling Techniques</li></ul>	<ul style="list-style-type: none"><li>• Cause &amp; Effect Diagrams</li><li>• Failure Modes &amp; Effects Analysis</li><li>• Decision &amp; Risk Analysis</li><li>• Statistical Inference</li><li>• Control Charts</li><li>• Capability</li><li>• Reliability Analysis</li><li>• <b>Root Cause Analysis</b></li><li>• -5 Why's</li><li>• Systems Thinking</li></ul>	<ul style="list-style-type: none"><li>• Design of Experiments</li><li>• Modeling</li><li>• Tolerancing</li><li>• Robust Design</li></ul>	<p><u>Statistical Controls:</u></p> <ul style="list-style-type: none"><li>• Control Charts</li><li>• Time Series methods</li></ul> <p><u>Non-Statistical Controls:</u></p> <ul style="list-style-type: none"><li>• Procedural adherence</li><li>• Performance Mgmt</li><li>• Preventive activities</li></ul>



# Design for Six Sigma (DFSS)

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## New solutions

- Rather than analysis of existing processes

## Focus

- Customer and business
- Emphasis on critical-to-quality characteristics

## Useful tools

- Modeling, simulation, lean, systems thinking



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# Applications

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**Six Sigma applications for  
Systems and Software Engineering  
are emerging**







# Survey of Applications <sup>1</sup>

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## Allied Signal

- 1997 air supply control system shutdowns
- Black Belt project team commissioned to find solution

## Motorola

- Inspection data analysis & unit test optimization
- Design of experiments methods & test cases
- Complexity analysis & resource allocations
- Quantitative risk management via uncertainty modeling

## General Electric

- DFSS
- Six Sigma & Extreme Programming

[Harry 00], [Stoddard 00], [Kelliher 01]

Motorola & GE presentations available at <http://seir.sei.cmu.edu>



## Survey of Applications 2

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### Honeywell

- PSP<sup>SM</sup>/TSP<sup>SM</sup> & Six Sigma
  - “TSP provides the data needed to apply Six Sigma”

### JP Morgan

- Capability Maturity Model<sup>®</sup> (CMM<sup>®</sup>) & Six Sigma
  - “...Six Sigma methodology is beneficial on all levels of maturity.”

### NCR

- CMM & Six Sigma
  - “...helps organizations working towards Level 4 & 5 deliver the best business results.”

[Pavlik 00], [A-M 99], [Demery 01]  
Presentations available at <http://seir.sei.cmu.edu>



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## Initiative “Synergy”

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CMM®

- Level 1-3
- Level 4-5

CMM Integration<sup>SM</sup> (CMMI<sup>SM</sup>)

Personal Software Process<sup>SM</sup> (PSP<sup>SM</sup>)

Team Software Process<sup>SM</sup> (TSP<sup>SM</sup>)

®Capability Maturity Model and CMM are registered in the U.S. Patent and Trademark Office.  
<sup>SM</sup>CMM Integration, CMMI, Personal Software Process, PSP, Team Software Process and TSP are service marks of Carnegie Mellon University.



# CMM and Six Sigma\*

- 5 • Organization-wide 6 $\sigma$  improvements and control
- Correlation between key process areas & 6 $\sigma$  methods
- 6 $\sigma$  used within CMM efforts

**Optimizing**  
Process improvement

4

**Quantitative**  
Process measured and controlled

- 3 • Defined processes feed 6 $\sigma$

**Defined**  
Process characterized for the organization and is proactive

- 2 • 6 $\sigma$  philosophy & method focus
- 6 $\sigma$  “drilldown” drives local (but threaded) improvements

**Repeatable**  
Process characterized for projects and is often reactive

- 1 • 6 $\sigma$  may drive toward and accelerate CMM solution

**Initial**  
Process unpredictable and poorly controlled

**Six Sigma is enterprise-wide.  
Six Sigma focuses on “critical to quality” factors.**

\*Similar comments apply to CMMI



## CMMI & Six Sigma\*

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### “Within” CMMI

- Quantitative Project Management (QPM)
- Organizational Process Performance (OPP)
- Organizational Innovation and Deployment (OID)
- Measurement & Analysis (MA)
- Capability Levels
- Generic Practices

### “Around” CMMI

- SEPG process improvement rollout
- Assessment methods
- Prioritization of process areas

\*Similar comments apply to CMM



## Illustration – “Define”<sub>1</sub>

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### Business Driver

- Need 10% cost reduction in order to compete in the marketplace and stay in business

### Baseline data (PSP)

- Productivity: 19 LOC/hr
- 33% of development time spent fixing defects
- Approximately 250 defects/KLOC



## Illustration – “Define”<sub>2</sub>

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### Goal:

- Reduce or prevent defects to reduce cost

### Quantitatively speaking:

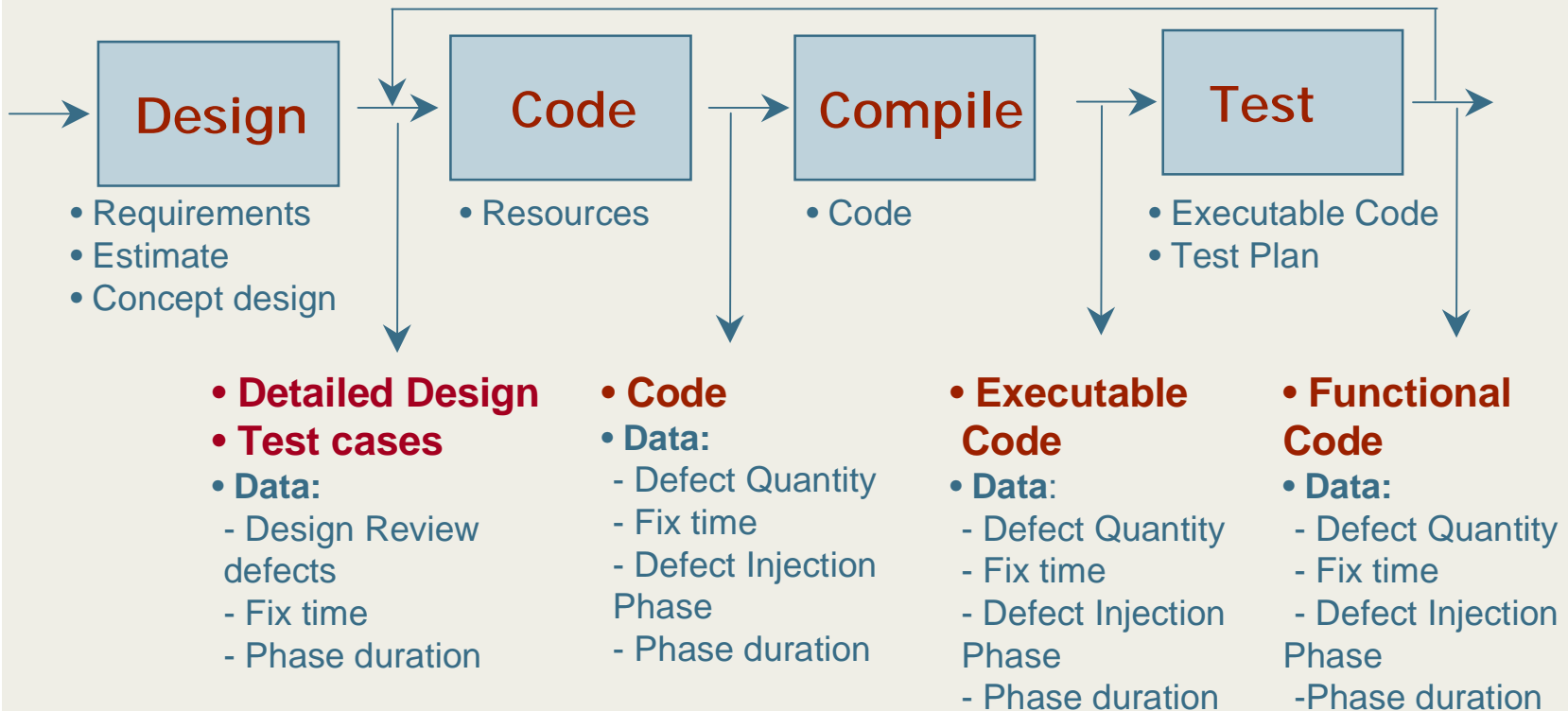
- Reduce cycle time by 22 minutes/program
- Reduce fix time by 1.3 minutes/defect
- Reduce defects by 6/program
- Reduce defect density to 190 defects/LOC

... or a combination that produces 21 LOC/hr



# Illustration – “Define, Measure”

## PSP-based Process Map:



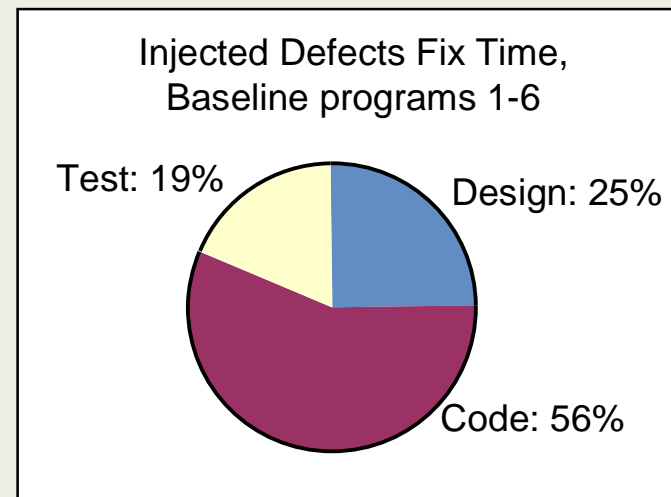
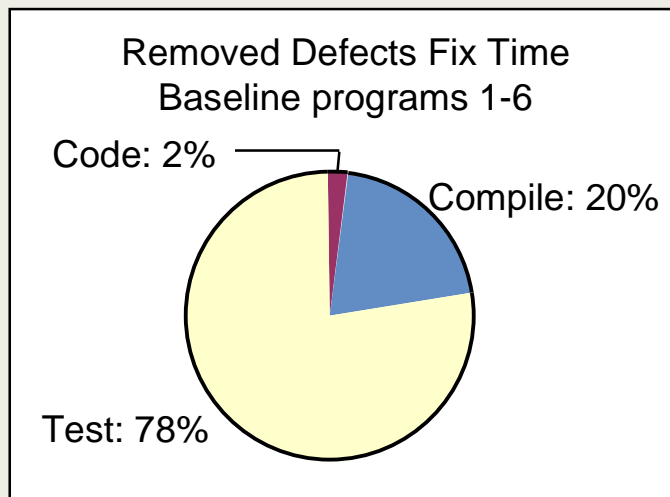




## Illustration – “Analyze”

### Opportunities to reduce repair time

- Defects removed in test: 78% of repair time
- Defects injected in design: 25% of repair time
- Defects injected in code: 56% of repair time
- Syntax defects in general: 63% of defects

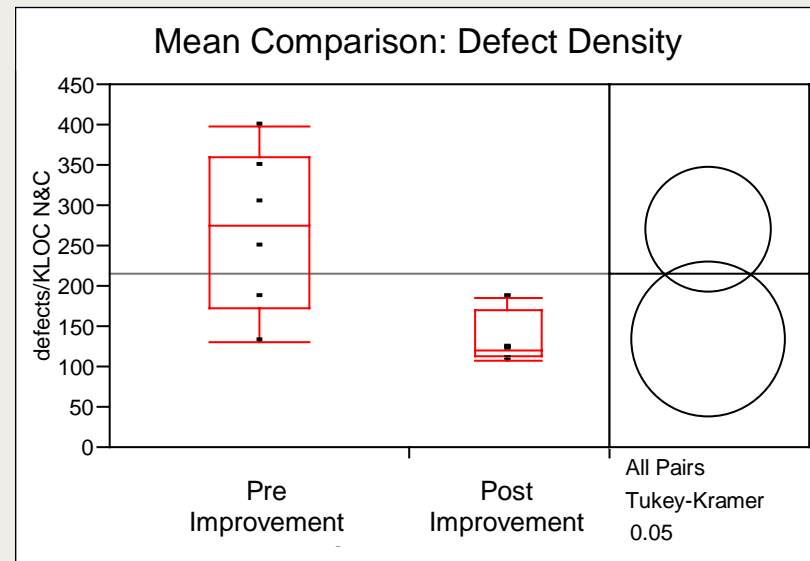
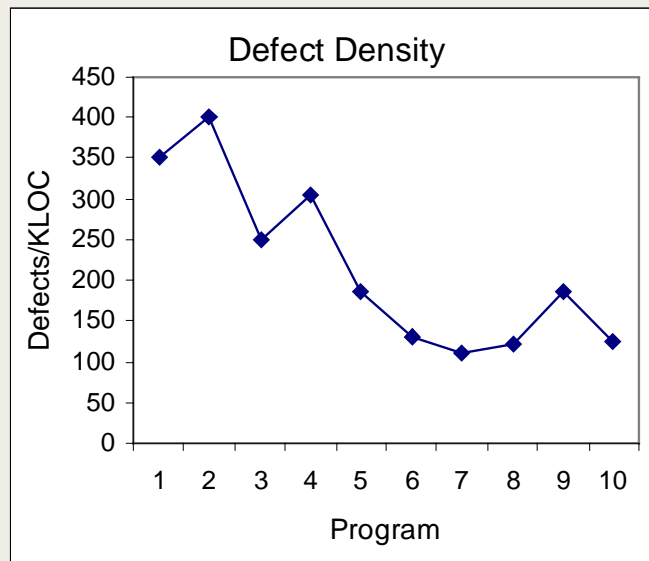




# Illustration – “Improve”

## Improvement Plan at Program 6

- Syntax checklist
- Well-timed reviews
- Subcategories within defect types

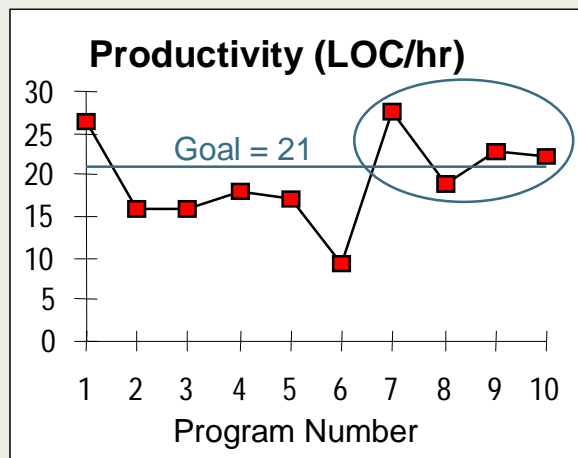




## Illustration – “Control”

### Tracking performance

- Quantitative goal statement
- Hypothesized root causes
- Countermeasures & contribution to impact
- Key impact indicators



#### Direct causes (from countermeasures):

- Fewer defects injected in code & test
- Defects removed earlier, faster (i.e., in design & code)

#### Root cause (need new countermeasures):

- “Re-learning” curve



## Illustration – Analysis Summary

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### Tools used in full analysis included

- Process Mapping
- Descriptive statistics
- Means comparisons & significance testing
- Plots
  - Pie Charts
  - Trends
  - Phase profiles
  - Histograms
  - Pareto charts
  - Correlation plots
- Cause & Effect Diagrams
- “Management by Fact”

### Focus was exploratory, investigative

- Ready for stability & control monitoring



## Illustration – Scaling up

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### Illustration

- § Quickly drilled down from high level cost goal to personal improvement
- § Defined process in place
- § Measures in place
- § Continuous incremental improvements
- § Event-based “step-change” improvements
- § Re-learning curve
- § Personal data
- § Used productivity as one of impact measures

### Real Life

- § Drill down may be complex, may span wide breadth of organization
- § May need to select or define process
- § May need to develop measures
- § Continuous incremental improvements
- § Event-based “step-change” improvements
- § Constantly changing skills, technologies
- § Non-attributed data (e.g., team, project)
- § Excessive productivity focus may drive unwanted behaviors



# Advancing the State of 6 $\sigma$ & SW/SE

## Repository of Examples



- <http://seir.sei.cmu.edu>
- concrete visualization
- relationship to models, initiatives
- variety of tools
- many views
  - project, process, product
  - software, systems
  - maturity/capability levels



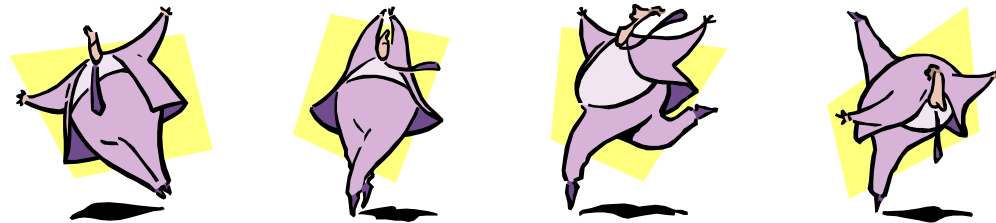
## Repository of Benefits



## Summary

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**Customer satisfaction is key driver**



**All efforts should link  
to business results**



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## Contact Information

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- [Bylinsky 98] Bylinsky, Gene, *How to Bring Out Better Products Faster*, Fortune, 23 November 1998
- [Demery 01] Demery, Chris and Michael Sturgeon, *Six Sigma and CMM Implementation at a Global Corporation*, NCR, SEPG 2001, (slides available to SEIR contributors at <http://seir.sei.cmu.edu>)
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- [Stoddard 00] Stoddard, Robert W., *Implementing Six Sigma in Software*, Motorola, Inc., Software Engineering Symposium 2000, (slides available to SEIR contributors at <http://seir.sei.cmu.edu>)



# Additional Reading <sup>1</sup>

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## Books (General Six Sigma Topics, not software-specific):

Breyfogle III, Forrest W., *Implementing Six Sigma: Smarter Solutions Using Statistical Methods*, John Wiley & Sons, 1999

Breyfogle, III, Forrest W., Cupello, James M., Meadows, Becki, *Managing Six Sigma*, John Wiley & Sons

Harry, Mikel, *Six Sigma: The Breakthrough Management Strategy Revolutionizing the World's Top Corporations*, Doubleday, 2000

Pyzdek, Thomas, *The Six Sigma Handbook*, McGraw-Hill Professional Publishing, 2001

## Web pages & Web sites:

American Society for Quality Six Sigma Forum,  
<http://www.sixsigmaforum.com/concepts/var/index.shtml>

International Quality Federation, [www.igfnet.org](http://www.igfnet.org) (Follow the black belt links)

Six Sigma Academy, [www.6-sigma.com](http://www.6-sigma.com)

Software Engineering Information Repository: <http://seir.sei.cmu.edu> (Follow links to Measurement area then to Six Sigma)

SEI Software Technology Review: <http://www.sei.cmu.edu/str/descriptions/sigma6.html>



## Additional Reading <sub>2</sub>

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### Journals (URL's subject to change without notice)

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