

# “Successfully Using Statistical Process Control (SPC) in Service Applications”

## Successfully Using SPC in Service Applications

### Methods and Case Studies

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~ and ~  
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### Objectives

#### Value of SPC/SQM in Service Settings

- Control Charts, Other Tools
- Cost of Quality → When to “Inspect”?

#### Examples:

- HMO Enrollment Process, Labs
- Customer Satisfaction, Others

#### References for Further Info

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## Background and Motivation

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### Essence of Dr. Deming’s Message

“If I had to reduce my message to just a few words, I’d say it all had to do with reducing variation...”

“... developing an understanding of the process, and the optimization thereof.”

*SPC, TQM, and economic models can help develop this process understanding*

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### Understand Process Performance

“Data Driven” vs. Intuition

“Simply stated, quality improvement refers to organized, rational, *scientifically valid* programs that analyze what people are doing - in industry, medicine, or any other area - and then devise ways in which the job can be done even better.”<sup>1</sup>

*SPC tools can help with this understanding*

1. Nazarian, L.F. (1993). Preface to article by D. Bergman: “Quality Improvement: Buzz Words or Boon?”, *Pediatrics in Review*, Vol. 14, No. 6, p. 207.

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### The Cost of TQM?

One Opinion . . . ?

“The reality is that (quality control procedures) increase work... and cost... Many studies have shown that a Total Quality Management system *adds* at least 25% to overall laboratory costs.”<sup>2</sup>

“In my opinion, there are no known quality control procedures that do not impact workload or cost.”<sup>3</sup>

2. Inhorn S: “Quality Assurance and Quality Control in Clinical Cytology...”, *Compendium on Quality Assurance, Proficiency Testing, and Workload Limitations in Clinical Cytology*, 1995  
3. Mango L, *ibid*.

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# “Successfully Using Statistical Process Control (SPC) in Service Applications”

## Dr. W. Edwards Deming

A Different Way of Thinking About Quality and Costs

Improve Quality  $\Rightarrow$  Reduce Total Costs

The philosophy of “Quality Management”, understood and instituted effectively, *reduces* long-term total costs:

- Understand, improve, and control process quality
- Statistical process control
- Economic models to minimize total costs

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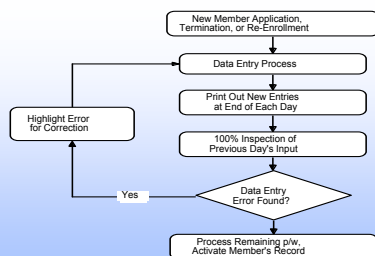
## Member Enrollment Case Study

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## Member Enrollment Process



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## Process Improvement Team

High Data Entry Error Rate, Long T-A-T

### Regular Meetings

- Review data, Study process
- Identify root causes of errors

Missing fields, Numeric Fields, Unfamiliarity

Training, Form simplification, others

**“Diagnostic Journey” . . .**

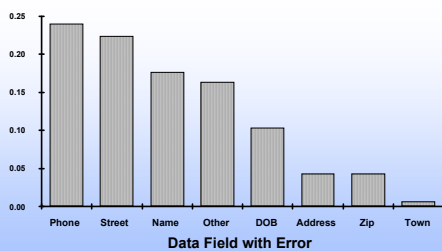
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## Sources of Errors?

Pareto Chart



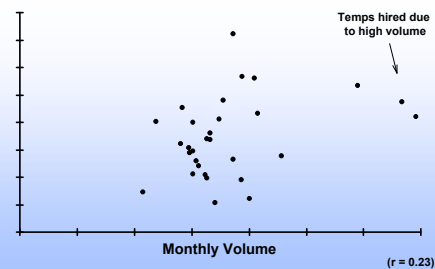
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## Due to High Volumes?

Scatterplot & Correlation Analysis



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## Control Chart Mini-Tutorial:

## Customer Satisfaction and Service Complaints

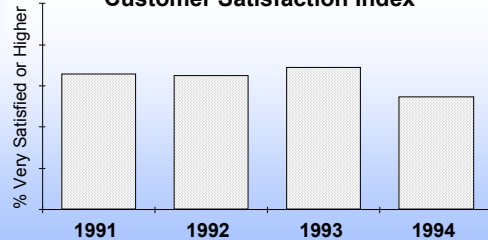
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## Given the Following, What Do You Conclude...?

### Customer Satisfaction Index



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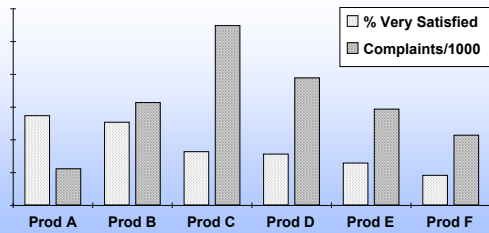
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## Annual Satisfaction Survey

Standard “Time-Static” Comparison

### Comparison by Service Line



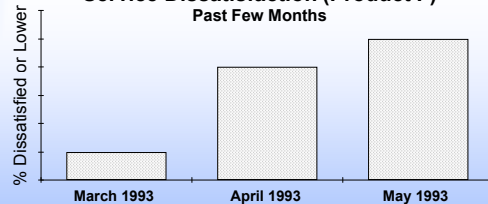
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## Given the Following, What Do You Conclude...?

### Service Dissatisfaction (Product F) Past Few Months



**What is the cause of this “trend”?**

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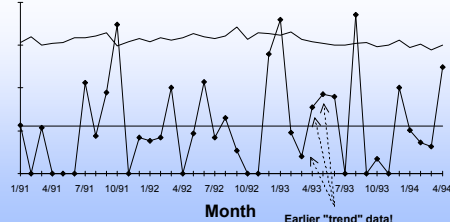
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## Yet There is Natural Variability Here

Also Unnatural Special Cause Variability

### Monthly Dissatisfaction $p$ Control Chart Product F



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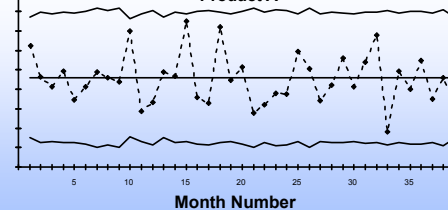
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## Example of “In Control” Process

No Irregular Events - Only “Natural” Variability<sup>4</sup>

### Monthly Dissatisfaction $p$ Control Chart Product A



4. Benneyan JC (1995). “Using Statistical Process Control (SPC) to Improve Health Care”

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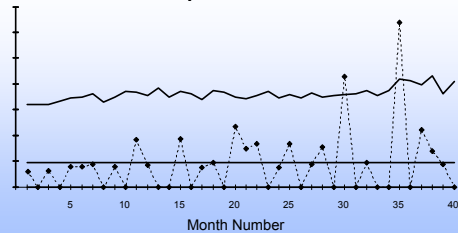
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### A Different Kind of Variability

Poor Service Quality - Deteriorating Over Time

Service Complaints  $\bar{u}$  Control Chart



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### Back to the Member Enrollment Process...

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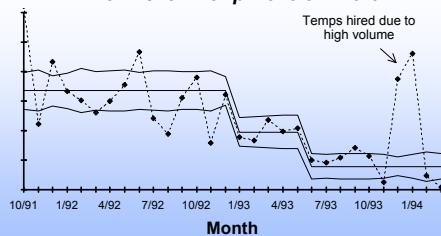
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### Improving Enrollment Process

(Turn-Around-Time Also Control Charted)

Enrollment Error  $p$  Control Chart



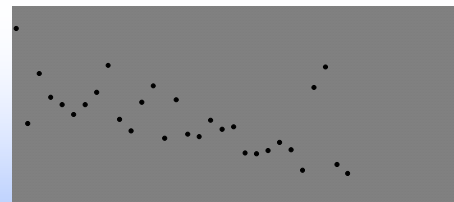
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### Suppose Improving Trend Continues?

(Special-Purpose Trend Control Chart)



Month

( $r = .82$ )

Expected Fraction Errors = .05323 - (.00138 x Month Num)

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### Should They Be Inspecting At All?

Dr. Deming's “14 Points” (Point 3)

“Cease dependence on inspection to achieve quality. Eliminate the need for inspection on a mass basis by building quality into the product in the first place.”

- Dr. W. E. Deming

**Inspection Time & Cost Still Justified ... ?**

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### 4 General Inspection Approaches

Objective: Minimize Total Quality Costs

~ 100% Inspection ~

To ensure no costly errors passed along

~ 0% Inspection ~

To save associated time and \$\$\$

~ Inspect a Random Sample ~

To balance above costs?

~ Multiple 100% Inspections ~

If costly inspection errors exists

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## Deming's $k_1/k_2$ Cost Model

Simple “Cost of Poor Quality” Method

### Simple Method to Minimize Costs

#### Cost / Input Estimates:

- Fraction Data Entry Errors ( $p$ ) - 0.005
- Number Entered per year - 150,000
- Cost to Inspect an Item ( $k_1$ ) - \$0.52
- Cost of Undetected Error ( $k_2$ ) = ??? (\$0.58  $\leftrightarrow$  \$35)

#### Annual Cost for Each Inspection Policy

- See references for formulas

Benneyan JC (1994) “Tutorial on Applying Deming's  $k_1/k_2$  Inspection Cost Minimization Rule”

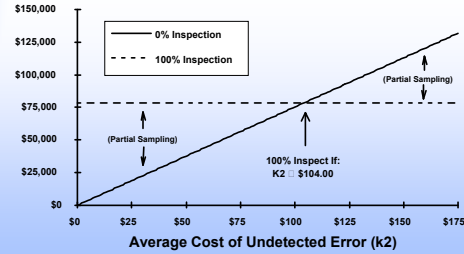
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## Cost of Poor Process Quality

0% vs. 100% vs. Partial Inspection



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## Simple $k_1/k_2$ Criterion

Minimize Total Poor Quality Cost

If	Optimal Inspection Policy
$k_1 / k_2 \leq p$	$\Rightarrow$ 100% Inspect
$k_1 / k_2 > p$	$\Rightarrow$ 0% Inspect

**Partial Sampling Never Minimizes Total Costs!!**  
(Counter-Intuitive)

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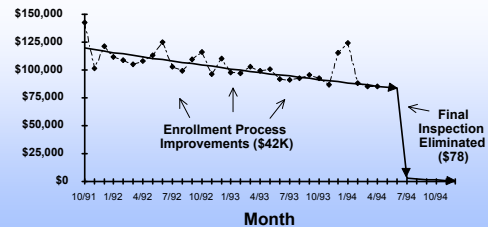
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## Higher Quality $\Rightarrow$ Lower Costs

Deming was Right!

### Annual Savings of Process Improvements



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## Other Benefits

“We have eliminated unnecessary work, streamlined our key processes, and replaced frustrating work with more meaningful work. The new process also significantly reduces turn-around-time... with less resources.”

- Manager of Enrollment Process

- Increased staff & customer satisfaction
- Other applications, transfer process . . .

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## Other SPC and Inspection Service Applications

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### Other Identified HMO Applications

Possible Savings □ \$600,000 / year

- Medical Records
- Prescription Accuracy
- Internal Audit, Cash Handling
- Accounts Receivable
- Outside Utilization Authorization
- Clinical laboratories . . .

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### Other $k_1/k_2$ Applications

Average □ 5% net operating costs common

- Accounts Receivable Dept (\$5M - \$1M / year)
- Bank Payroll Dept (\$4.75 per transaction)
- Insurance Eligibility Review
- Integrated TV circuits (\$24 / set - 15% of mfg cost)
- Auto Engine Testing (\$47 / motor - \$185,000 / day)
- Biomedical Device lawsuit (Loss of life)

**Where do You Partial, 0%, or 100% “Inspect”?**

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### Some Other Service SPC Uses

Many Others . . .

- Budget Variances, Sales, Utilization
- Timeliness of Subways, Trains, Planes
- Census Data Accuracy, Process Times
- U.S. Postal Service
- Banking, Finance, Insurance
- Public Utilities, Government, Accident Rates
- Customer Satisfaction / Complaints
- Service Calls & Response Times . . .

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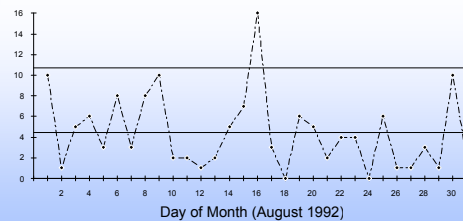
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### Information Systems Support

Help Desk Service Calls

Number of Service Calls  $\bar{u}$  Control Chart



(\* Also significant Day-of-Week differences...)

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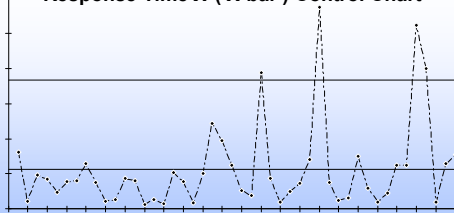
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### Time to Return Service Calls

Where Would You Start Investigating?

Response Time  $\bar{X}$  (“X-bar”) Control Chart



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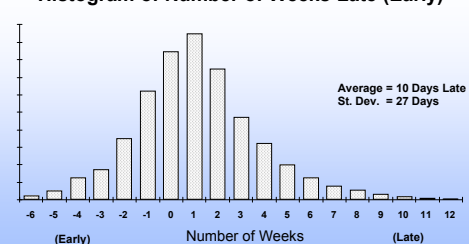
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### On-Time Delivery

Deviation from Customer Requested Date

Histogram of Number of Weeks Late (Early)



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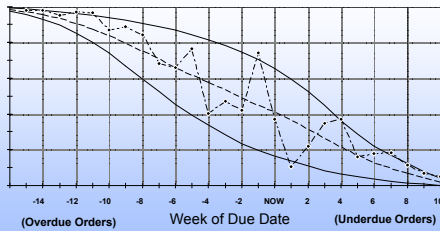
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### Is It Getting Any Better?

A Special Type of Control Chart: In-Process Orders

Fraction of Due Orders Shipped



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### Laboratory Applications

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### Lab Pap Smear Figures

- Approximately 50 Million Annually (USA)
- 200,000 Cervical Cancer Deaths/year
- Estimated 1.5% of Pathologists Involved in Litigation for False Negative Readings
- Cure Rate in Early Stages Near 100%
- Advanced Cervical Cancer Much Less Successfully Treated

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### Laboratory Quality Concerns

- Several Recent False Negative Settlements:
  - \$3.5 Million
  - \$6.3 Million
  - Recent Criminal Charges
- Diane Sawyer (Newport Hospital) - 1994
- 1988: Congressional Hearings and Federal *Clinical Laboratory Improvements Act (CLIA)*

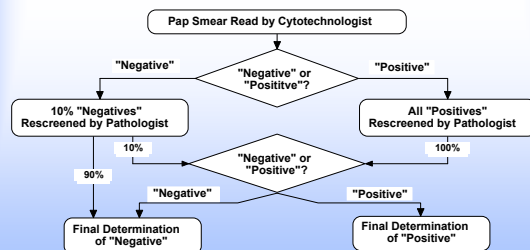
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### CLIA'88 10% QC Requirement

How Well Does This [Process](#) Perform?



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### Some Criticisms of CLIA'88

“... 10% rescreening ... is a waste of every-one's time and effort.”

W.M. Hindman, M.D.

“Using rescreening of 10% of the negative gynecologic smears, it would take 11 years to distinguish between acceptable and unacceptable performance of a cytotechnologist.”

G.M. Lundberg, M.D.

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# "Successfully Using Statistical Process Control (SPC) in Service Applications"

## Lab "Inspection" Costs?

Multiple  $n$  Readings,  $r\%$  Re-read

### Expected Cost per $n$ Processed Smears

$$EC = k_1 n \left\{ \frac{(1 - \alpha_c^j)}{1 - \alpha_c} + (1 - p) \frac{[1 - (1 - \beta_c)^j]}{\beta_c} \right\} k_2 [1 - (1 - r) p^j] + k_3 n (1 - p) \beta_p \left[ 1 - (1 - \beta_c)^j (1 - r) \right] + k_4 p n \left\{ - (1 - \alpha_p) \left[ 1 - \alpha_c^j (1 - r) \right] \right\}$$

where  $p^j = p \alpha_c^j + (1 - p) (1 - \beta_c)^j$   
and  $p$  = Incidence rate of truly positive patients

Benneyan JC, Kaminsky FC (1996). "Statistical and Economic Models for Analysis and Optimal Design of Laboratory Screening Policies for Cervical Cancer", *Annals of Operations Research*

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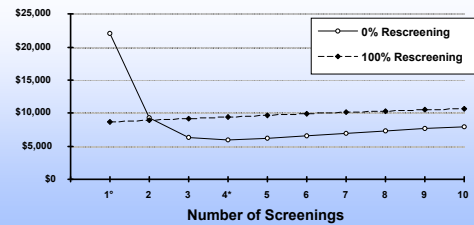
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## Optimal Number of Readings?

One Example

### Total Cost per 100 Smears



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## Partial Rescreening Never Optimal!

Similar to the  $k_1/k_2$  Criterion

$$\frac{k_2 + k_3 (1 - \beta_c)^j \left[ \frac{1 - p}{p} \beta_p \right]}{k_4 \left[ \frac{p}{p^j} (1 - \alpha_p) \alpha_c^j \right]} < 1 \Rightarrow 100\% \text{ Rescreen}$$

$$> 1 \Rightarrow 0\% \text{ Rescreen}$$

**Sound Familiar . . . ?**

(Widely applicable in many other settings . . .)

Benneyan JC and Kaminsky FC (1995). "Proof of Sub-Optimality of the CLIA 10% Pap Smear and Other Clinical Laboratory Partial Rescreening Policies from a Minimum Cost Viewpoint", working paper.

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## Summary of Pap Smear Analysis

Studied via SPC & Quality Cost Methods

- CLIA'88 Increases Total Costs
- Negligible Reduction in False Negatives
- Never Optimal Policy
- Automated Screening often Much Worse!

**SPC is a Correct Quality Assurance Method**

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## Management Recommendations

What To Do Instead? (Any Process)

1. **Optimize** Current Process via Cost Models
2. **Control** Current Quality via SPC
3. **Improve** Process (Sensitivity & Specificity) via CQI, DOE, Human Factors, etc.

**What does doing it right mean?**

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## Role of SPC in Lab Quality

Mammography (Spring *et al*)

"A **continuing longitudinal study**, reviewing data over several years, may **detect** unexpected **sources** of false-negative errors..."

"**Monitoring** may identify areas of patient care that fall short of evolving national standards..."

"**Trends** in clinical performance that indicate less than optimal care can be identified..."

**Sounds Like SPC!**

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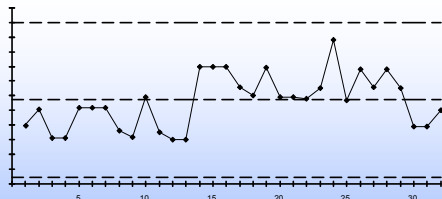
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## Pap Smear Test for Cervical Cancer



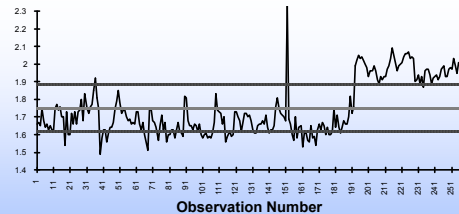
Lab process quality has significantly changed.

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## Mammography Control Chart



Poor Quality is Preventable!

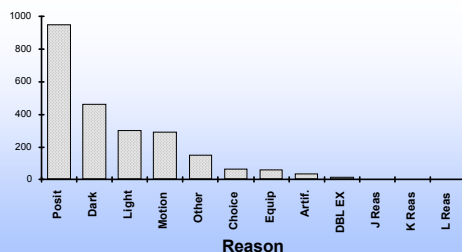
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## Reasons for Poor X-rays?

Pareto Chart



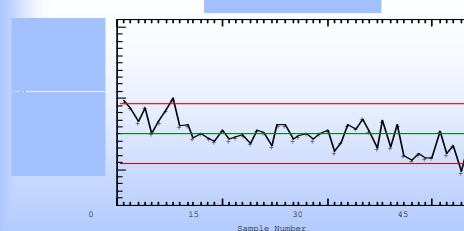
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## HIV Quality Control Chart

Downward Trend in Calibration



How Concerned Should Patients Be?

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## Pitfalls to Avoid and References

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## Endemic Philosophical Errors

- Non-Mfg processes can not be interpreted via SPC and natural variability...?
- QA should focus on outcomes (inspection), rather than on processes (prevention)...?
- Over-reliance on high level metrics
- SPC ° Software and automation

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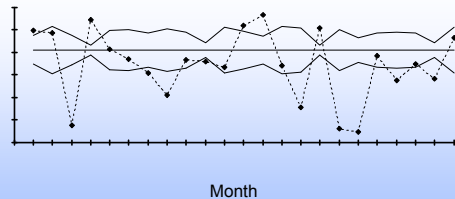
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## "SPC Not Applicable Here" Syndrome

### Voluntary Disenrollment (Customer Dissatisfaction)



"Our processes shouldn't be in control" !?

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## Common Statistical Errors

Much Bad Lay-Advice Out There

- Using an  $\bar{X}$  chart without an S or  $S^2$  chart
- Overuse / misuse of "individuals" chart
- "Short-cut" control limit formulas
  - Invalid...!!
  - Not using 3 standard deviation limits
  - Not using at least 25 to 35 subgroups
- Frequent use of incorrect chart . . .

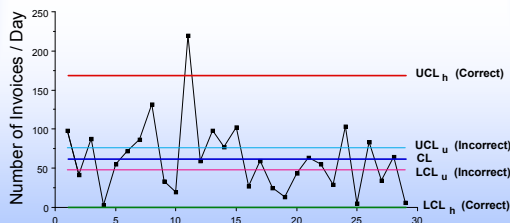
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## Accounts Receivable Controls

### Freight Administration $h$ Control Chart



Benneyan, J. C. (1994). "The Importance of Modeling Discrete Data in SPC: The  $g$ ,  $h$ , and Related Charts", invited paper, *Tenth International Conference of the Israel Society for Quality*, pp. 640-646.

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## For More Information . . .

For additional references, tutorial articles, case studies, specifics on any of the illustrated applications, and/or assistance with statistical quality control, please contact:

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