

## Reliability: The Other Dimension of Quality

William Q. Meeker  
Iowa State University

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## Manufacturing Environment

Today's manufacturers face:

- Intense global competition
- Pressure for shorter product-cycle times
- Stringent cost constraints
- Higher customer expectations for quality and reliability

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## Reliability

- Condra (1993): "Reliability is quality over time"  
**Good quality is necessary but not sufficient!**
- **Difficulty:** Reliability assessed directly only after a product has been in the field for some time; reliability prediction is difficult.
- Reliability is an engineering discipline. Statistical methods are important tools for reliability engineering.
- Most statistical effort has been on methods for assessing reliability. Much engineering effort is (correctly) focused on reliability improvement.

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## Engineering Functions that Affect Reliability

- Define product requirements
- Product design
- Verify product design
- Design for product robustness
  - ▶ Similar, parallel steps for manufacturing process design
- Maintain quality in production

**Robustness:** Ability (for a product or a process) to perform its intended function under a variety of operating and environmental conditions

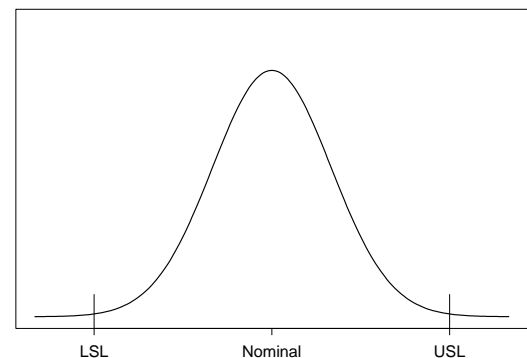
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## Overview

- Quality, variability, and reliability
- Failure modes (anticipated and unanticipated)
- Contrast between traditional **reliability demonstration** and today's need for **reliability assurance**
- The role of statisticians on the reliability team
- Reliability data and statistical methods
- Warranty and reliability
- A current example
- Future trends in reliability
- Comments on industrial/academic cooperation
- Concluding remarks

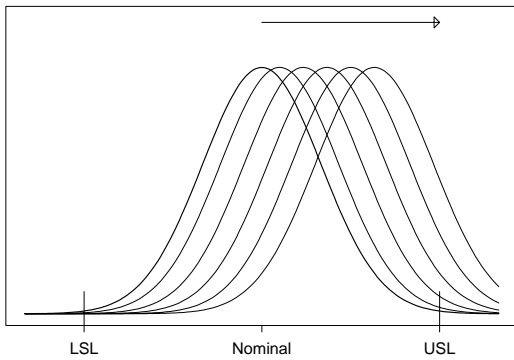
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## Three-Sigma Quality



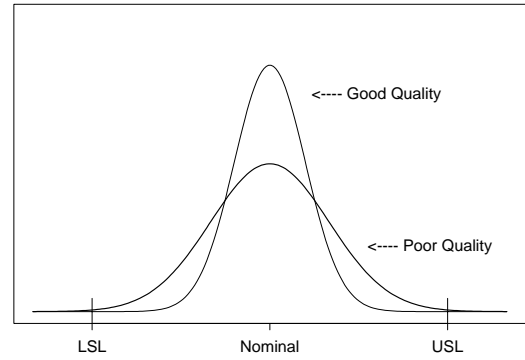
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### Drifting Three-Sigma Quality (Effect on Reliability)



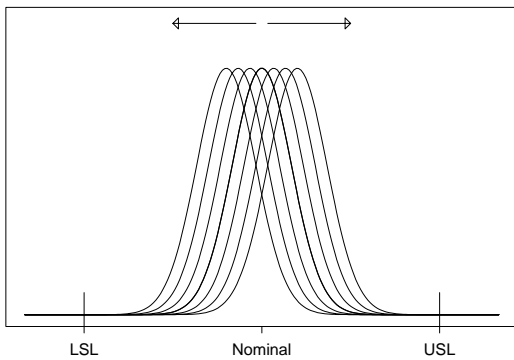
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### Good and Bad Quality



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### Six-Sigma Quality (Target: 3.4 Defects per Million Opportunities)



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### Sources of Variability (Noise) Affecting Product Reliability

- Manufacturing (including raw materials)
- Environmental conditions
- Customer use rates
- Wear/degradation

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### Anticipated Failure Modes

- Information on component reliability
  - ▶ Handbook values
  - ▶ Previous experience
  - ▶ Physical models (e.g. FEM) with some empirical model verification.
  - ▶ Test data and accelerated test data
- System reliability model

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### Unanticipated Failure Modes

**Goal:** To discover and eliminate failure modes as early as possible

- FMEA analysis in up-front design
- Robust design ideas (make product robust to external noises)
- HALT testing
- Early feedback from the field

**Downstream discoveries are more expensive!**

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## Reliability Demonstration versus Reliability Assurance

- **Example:** Using minimal assumptions, to demonstrate that reliability at time  $t_0$  hours is .99, with 95% confidence, requires testing at least 230 units for  $t_0$  hours with zero failures. To have a 80% chance of passing the test, requires that the true reliability be approximately .999
- For complicated, expensive systems, traditional reliability demonstration is usually not practicable
- Reliability assurance is the alternative

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## Reliability Assurance

Based on Reliability Modeling and Combining Information

Inputs:

- Engineering knowledge
- Physical models
- Previous experience (e.g., field data)
- Physical experimentation
- Factors of safety

**Challenge:** Quantify uncertainty

**Approach:** Responsible use of Bayesian methods (e.g. LANL PREDICT)

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## Structured Programs for Design for Reliability

Design for Reliability implies the use of product and process design to eliminate problems before they occur

- Design for Six Sigma (DFSS developed at GE) has the DMADV steps: Define, Measure, Analyze, Design, Verify
- Other company-specific reliability improvement programs.

Contrast with the traditional Build,Test,Fix,Test,Fix,... approach that uses "reliability growth modeling."

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## The Role of Statisticians on the Reliability Team

- Contribute to the understanding and modeling of variation
- Help fill in the gaps in engineering knowledge by designing experiments and interpreting results
- Use appropriate statistical method to make the most effective use of field and warranty data
- Develop appropriate methods for combining information
- Develop methods for quantifying uncertainty (statistical and model)
- Develop methods (especially graphical methods) for the effective presentation of results.

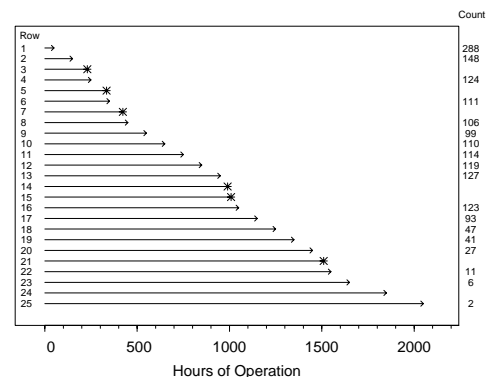
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## Distinguishing Features of Reliability Data

- Data are typically censored (bounds on observations).
- Models for positive random variables (e.g., exponential, lognormal, Weibull, gamma). Normal distribution not common.
- Model parameters **not** of primary interest (instead, failure rates, quantiles, probabilities).
- Extrapolation often required (e.g., have one year of data, but want proportion failing after three years).

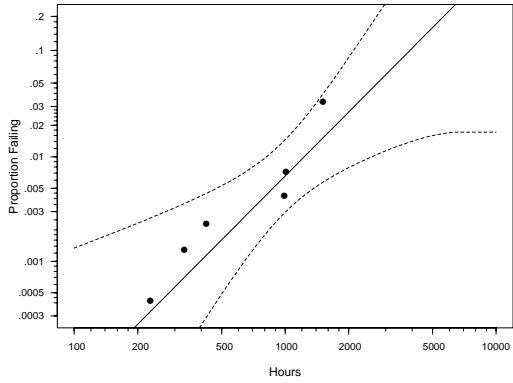
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## Failure Pattern in the Bearing Cage Data

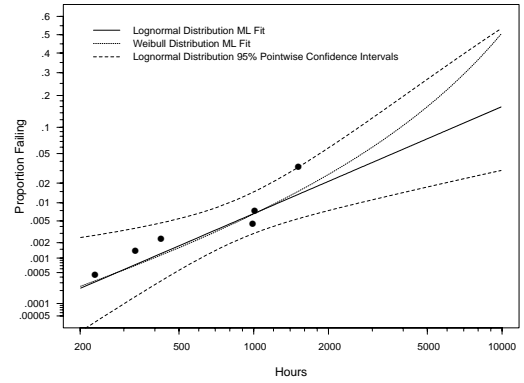


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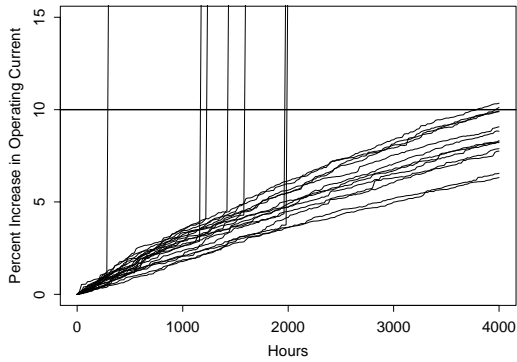
### Weibull Probability Plot for Bearing Cage Data



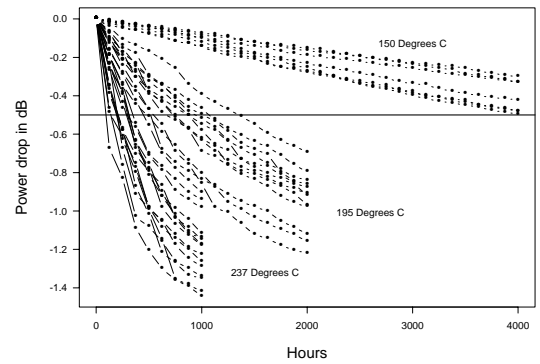
### Lognormal Probability Plot for Bearing Cage Data



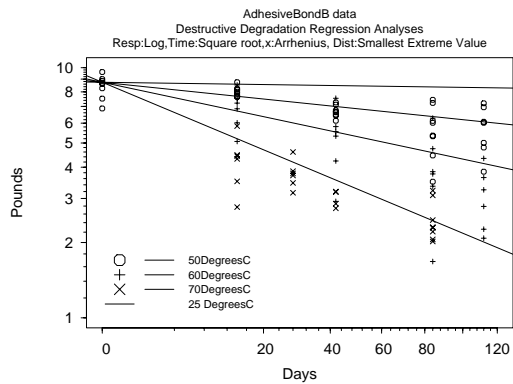
### Percent Increase in Operating Current for GaAs Lasers Tested at 80°C (Use conditions 10°C)



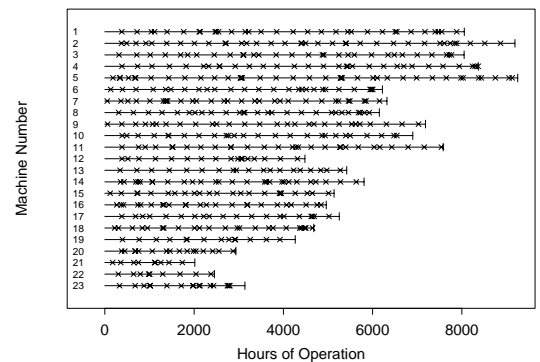
### Device-B Power Drop Accelerated Degradation Test Results at 150°C, 195°C, and 237°C (Use conditions 80°C)



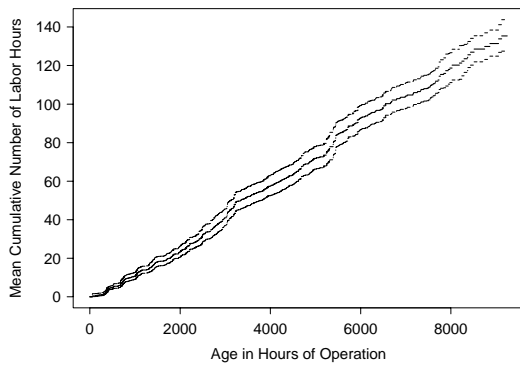
### Adhesive Bond Accelerated Degradation Test



### Maintenance Events for a Fleet of Earth-Moving Machines



### Mean Cumulative Cost for a Fleet of Earth-Moving Machines



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### Warranty and Reliability

- Warranties are more related to marketing than reliability!
- In many industries, warranty costs are substantial.
- Warranty data are messy
- Useful information in warranty data for:
  - ▶ Financial reporting
  - ▶ Feedback for the next product generation
  - ▶ Early warning of unanticipated problems
  - ▶ Connection with laboratory testing and environmental characterization.

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### Current Example Service Life of Organic Paints and Coatings

- **Goal:** Develop useful accelerated testing methods to allow the rapid screening and assessment of service life of potential new products.
- Previous efforts in this industry have not been satisfactory
- Useful discussions at two international conferences on the subject

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### NIST Cooperative Research and Development Agreement (CRADA)

- Multi-year project at National Institute of Standards and Technology, Materials and Construction Research Division, Building and Fire Research Laboratory (Jon Martin, Project Leader)
- **Approach:** Use careful experimentation and physical/chemical theory to understand degradation mechanisms and to build (and verify) the necessary predictive models.
- Focus on an important industrial problem.

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### Scientific Plan

- Careful laboratory experiments controlling UV radiation intensity and spectrum, temperature, and humidity.
- Experimental setup based on the NIST SPHERE (Simulated Photodegradation by High Energy Radiant Exposure)
- Outdoor experimental sites in four different climates, with monitoring of UV radiation intensity and spectrum, temperature, and humidity.
- Environmental realization, when used to drive the physical/chemical model, should produce results similar to outdoor exposure.

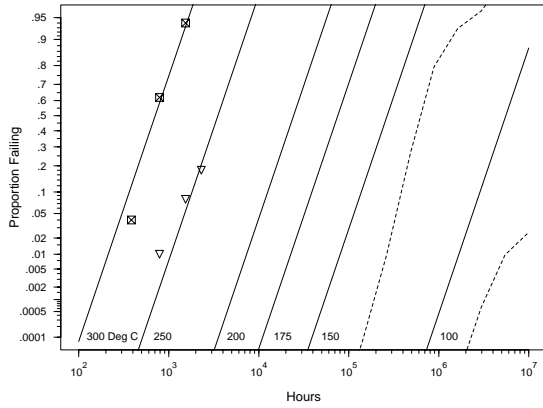
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### Trends in the Use of Statistics in Reliability

- More use of degradation data and models
- Increased use of statistical methods for producing robust product and process designs
- More use of computer models to reduce reliance on expensive physical experimentation
- Better understanding of the product environment (e.g. through the use of "smart chips").
- More efforts to combine data from different sources and other information (through the use of "Responsible Bayes" methods).

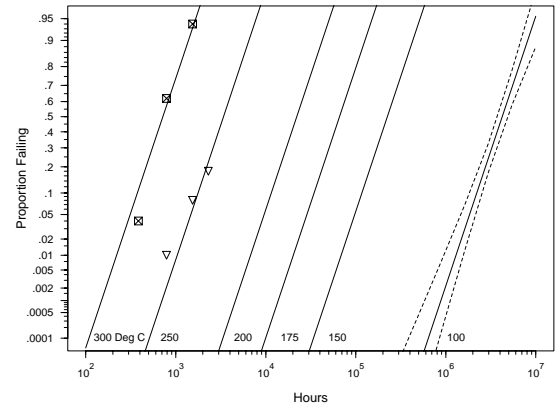
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### Accelerated Test Results Using Standard Censored Data Regression



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### Accelerated Test Results Using Standard Censored Data Regression Assuming That Arrhenius Activation Energy is Known



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### Academic Involvement in Manufacturing Reliability Problems

- Manufacturing industries have interesting, challenging, technical problems in reliability.
- There should be more academic involvement in these projects
- Benefits:
  - ▶ The quality of academic research will improve with access to real problems
  - ▶ High probability of impact
  - ▶ Cost-effective for industry
  - ▶ Better industry/academic relationships

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### Facilitating Academic Involvement in Manufacturing Reliability Problems

- Student internships with opportunities for faculty visits (LANL model).
- NSF GOALI (Grant Opportunities for Academic Liaison with Industry) program
- Work for free
- Needs:
  - ▶ Academics willing to get their hands dirty (and learn the language and science used in real problems)
  - ▶ Industrial sponsors willing to invest the time needed to lead and conduct the project.

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### Concluding Remarks

- SPC and designed experiments have been useful for improving quality and reliability
- Statisticians have an important supporting role to play in the reliability area
- Further improvements in reliability possible by focusing on causes of failure
- Upstream reliability testing/analysis has important advantages
- Use downstream information (e.g. Warranty data) on current and previous product to make upstream improvements in future product
- **Problem:** Importantly large savings may be difficult to quantify to management.

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