

An aerial photograph of a scenic landscape featuring a large blue lake, green hills, and a winding road. The text is overlaid on this image.

Fault Tolerant Computing

CS 530

Reliability Analysis

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Reliability Analysis: Outline

Reliability measures:

- Reliability, availability, Transaction Reliability,
- MTTF and $R(t)$, MTBF

Basic Cases

- Single unit with permanent failure, failure rate
- Single unit with temporary failures

Combinatorial Reliability: Block Diagrams

- Serial, parallel. K-out-of-n systems
- Imperfect coverage

Redundancy

- TMR, spares
- Generalized

Reliability Analysis

- **Permanent faults**
 - The unit will eventually fail. Thus reliability “decays”.
- **Temporary faults**
 - Faults come and go. Often Steady state characterization is possible.
 - Permanent faults subject to repair are modeled as temporary faults.
- **Design faults**
 - Reliability growth occurs during testing & debugging. We will study this under “Software Reliability” later.

Why Mathematical Analysis?

- You can determine reliability by constructing a large number of copies of the target system, and collecting failure data. However, that would be infeasible except for special cases.
- Thus we need to be able to determine the reliability before a system is built, by using the information we have about the components and the proposed architecture.

Basic Reliability Measures

- **Reliability:** durational (default)

$$R(t) = P\{\text{correct operation in duration } (0, t)\}$$

- This is the default definition of reliability.

- **Availability:** instantaneous

$$A(t) = P\{\text{correct operation at instant } t\}$$

- Applied in presence of temporary failures
- A steady-state value is the expected value over a range of time.

- **Transaction Reliability:** single transaction

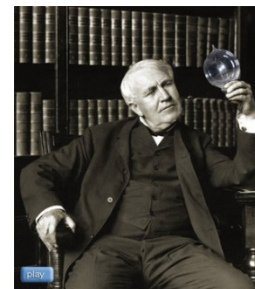
$$R_t = P\{\text{a transaction is performed correctly}\}$$

- The term “Reliability” is sometimes used with a non-standard meaning.

Mean time to ...

- **Mean Time to Failure (MTTF):** expected time the unit will work without a failure.
- **Mean time between failures (MTBF):** expected time between two successive failures.
 - Applicable when faults are temporary.
 - The time between two successive failures includes repair time and then the time to next failure.
 - Approximately equal to
- **Mean time to repair (MTTR):** expected time during which the unit is non-operational.

Mean time to ...



Average Rated Life for Various Types of Bulbs

| Type | Hours | |
|-------------------------|-----------------|--|
| Incandescent | 750-2,000 | |
| Compact Fluorescent CFL | | |
| Plug-in | 10,000-20,000 | |
| Screw-based | 8,000-10,000 | |
| Halogen | 2,000-4,000 | |
| LED | 40,000-50,000 ? | |

The Great Lightbulb Conspiracy: The Phoebus cartel engineered a shorter-lived lightbulb and gave birth to planned obsolescence [IEEE Spectrum](#)

Mean Time to Failure (MTTF)

- There is a very useful general relation between MTTF and $R(t)$. Here T is time to failure, which is a random variable.

$$\begin{aligned} MTTF &= E(T) = \int_0^{\infty} t f(t) dt \\ &= - \int_0^{\infty} t \frac{dR(t)}{dt} dt \\ &= [-tR(t)]_0^{\infty} + \int_0^{\infty} R(t) dt \end{aligned}$$

Thus $MTTF = \int_0^{\infty} R(t) dt$

**Worth
Remembering!**

Note :

$$\begin{aligned} R(t) &= 1 - P\{\text{failure in } (0, t)\} \\ &= 1 - P\{0 \leq T \leq t\} \\ &= 1 - F(t) \end{aligned}$$

$$\begin{aligned} \therefore \frac{dF(t)}{dt} &= -\frac{dR(t)}{dt} \\ \text{or } f(t) &= -\frac{dR(t)}{dt} \end{aligned}$$

Note :

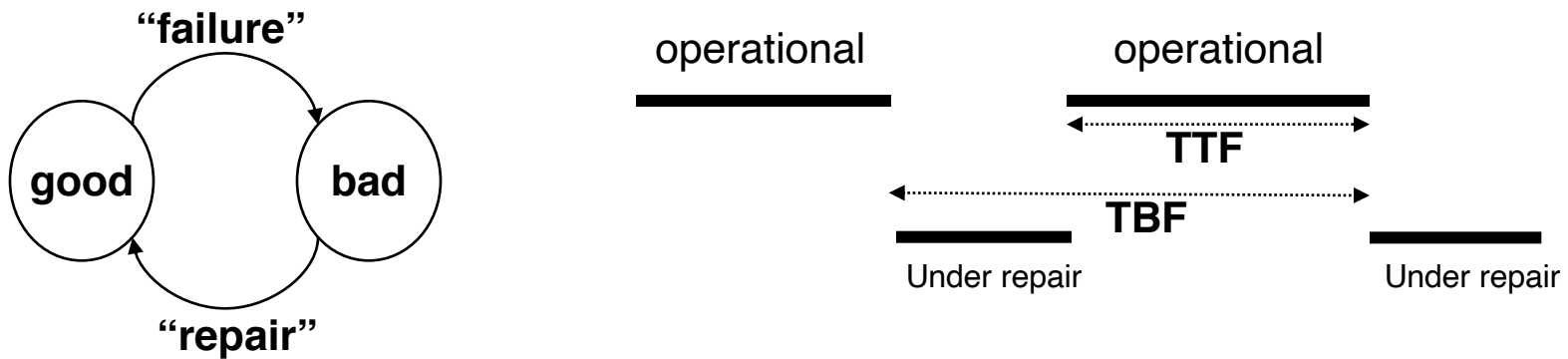
$$xe^{-x} \rightarrow 0 \text{ as } x \rightarrow \infty$$

and $R(t)$ is generally of the form e^{-at}

Thus $tR(t) \rightarrow 0 \text{ as } t \rightarrow \infty$.

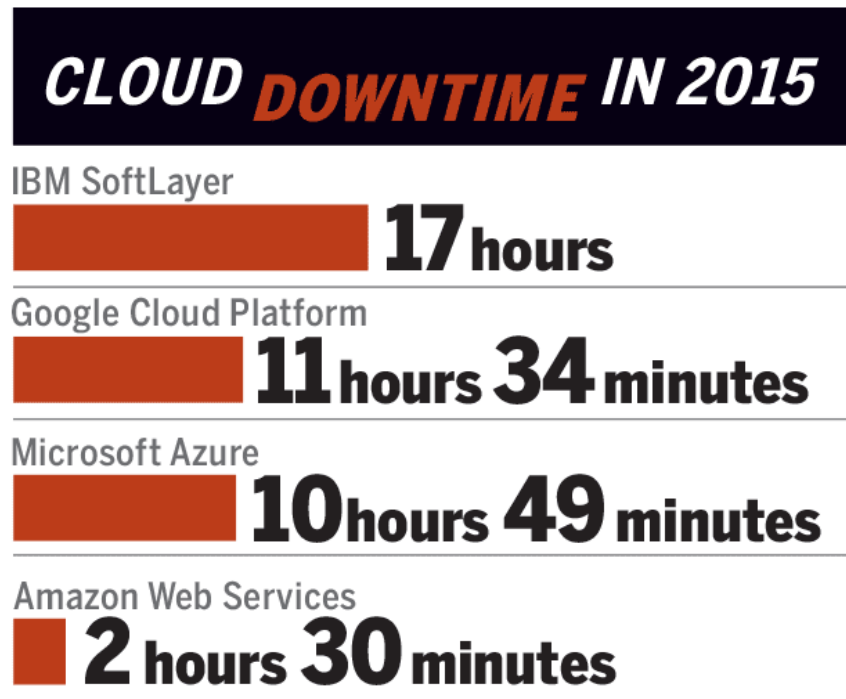
Failures with Repair

- Time between failures: time to repair + time to next failure



- **$MTBF = MTTF + MTTR$**
 - MTBF, MTTF are same when $MTTR \approx 0$
- **Steady state availability** = $MTTF / (MTTF + MTTR)$

Downtime of Cloud Services



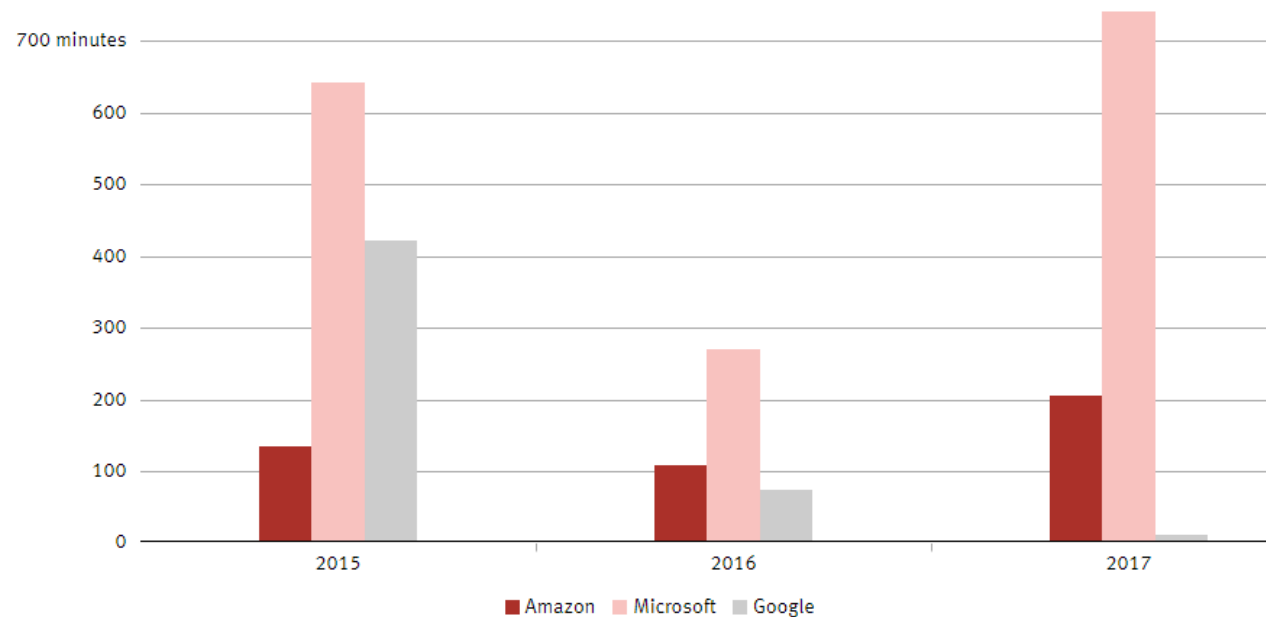
SOURCE: CLOUDHARMONY

And the cloud provider with the best uptime in 2015
is .. [Network World](#)

Downtime of Cloud Services

Cloud Outages

Total time lost

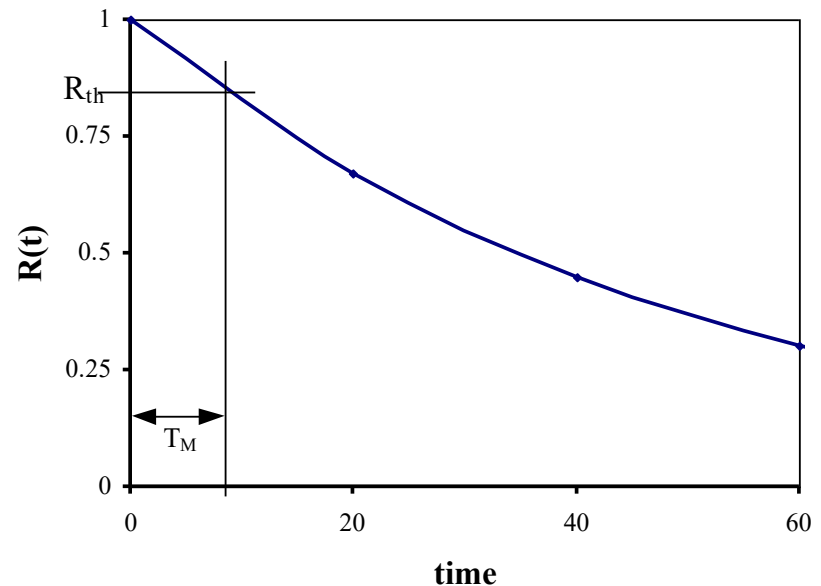


<https://www.theinformation.com/articles/how-aws-stacks-up-against-rivals-on-downtime?shared=cMitFeGtWn4>

<https://www.geekwire.com/2019/google-really-run-reliable-cloud-service-even-sources-skeptical/>

Mission Time (High-Reliability Systems)

- Reliability throughout the mission must remain above a threshold reliability R_{th} .
- **Mission time** T_M : defined as the duration in which $R(t) \geq R_{th}$.
- R_{th} may be chosen to be perhaps 0.95.
- Mission time is a strict measure, used only for very high reliability missions.

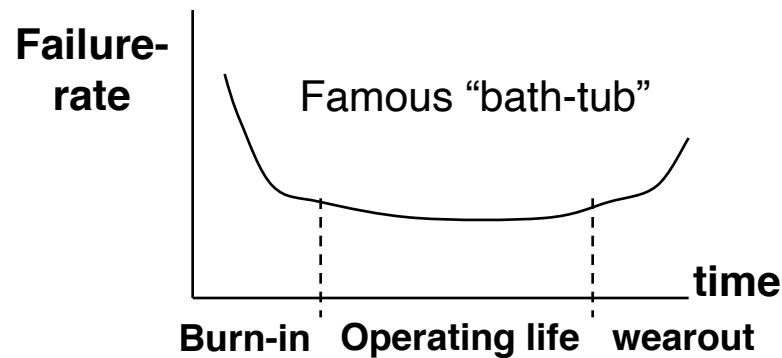


Two Basic cases

- We next consider two very important basic cases that serve as the basis for time-dependent analysis.
- 1. **Single unit subject to permanent failure**
 - We will assume a constant failure rate to evaluate reliability and MTTF.
- 2. **Single unit with temporary failures**
 - System has two states Good and Bad, and transitions among them are defined by transition rates.
- Both of these are example of Markov processes.

Constant Failure Rate Assumption

- We will always assume a **constant failure rate**.
 - It keeps analysis simple.
 - During operating life, the failure rate is approximately constant.
- **The Bath-Tub curve:**
 - In the beginning the failure rate is high because the weaker devices fail due to “infant mortality”. Near the end the failure rate is again high due to “aging” or wear-out of devices.



FAQ

Disjoint vs independent

- If A and B are **disjoint**, i.e. if $A \cap B = \varphi$ (i.e. empty set),

$$P\{A \cup B\} = P\{A\} + P\{B\}$$

- If A and B are **independent**, $P\{A|B\} = P\{A\}$. Then

$$P\{A \cap B\} = P\{A\}P\{B\}$$

- **Estimation by Inspection Sampling:** assuming Team 1 discovers the same fraction of faults, of all and those found by Team
- Then $x_1/x = x_3/x_2$
- **Problem:** those found by Team 2 are easier to find.

Thus actually

$$\frac{x_3}{x_2} > \frac{x_1}{x} \text{ hence } x > \frac{x_1 x_2}{x_3}$$

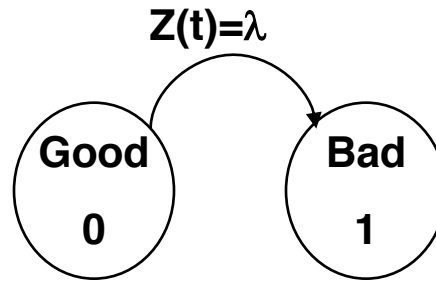
Policies

<https://www.cs.colostate.edu/~cs530dl/>

- Use of electronic devices (phones, pads or laptops) is not permitted in during the class.
- No collaboration of any type is permitted among the students in homework assignments and quizzes.

Basic Cases: Single Unit with Permanent Failure

- Failure rate is the probability of failure/unit time
- Assumption: constant failure-rate λ



The state transition diagram & the differential equation represent What we call **Markov Modeling**.

$$\frac{dp_0(t)}{dt} = -\lambda p_0(t) \text{ since the rate of leaving state 0 depends}$$

on probability of being in state 0

$$p_0(0) = 1$$

initial condition

Single Unit with Permanent Failure (2)

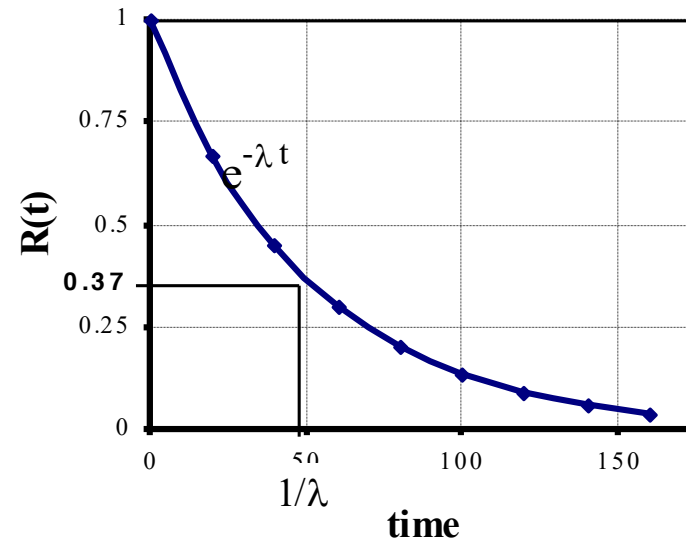
$$\frac{dp_0(t)}{dt} = -\lambda p_0(t)$$

$$p_0(0) = 1$$

$$\text{Solution : } p_0(t) = e^{-\lambda t}$$

$$\text{Since } R(t) = p_0(t)$$

$$R(t) = e^{-\lambda t}$$



"The Exponential reliability law"

$$\text{At } t = \frac{1}{\lambda}, R(t) = e^{-1} = 0.368$$

Single Unit: Permanent Failure (3)

$$R(t) = e^{-\lambda t}$$

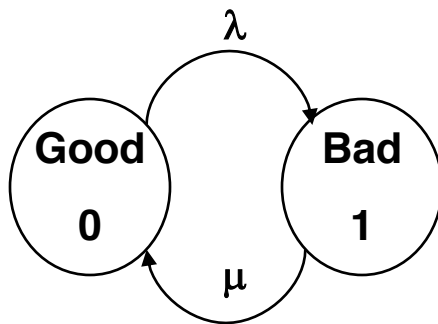
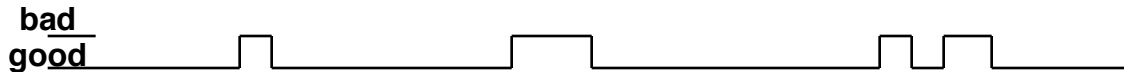
A(t) is same as R(t) in this case.

$$\begin{aligned} MTTF &= \int_0^{\infty} R(t) dt = \int_0^{\infty} e^{-\lambda t} dt \\ &= \left[-\frac{e^{-\lambda t}}{\lambda} \right]_0^{\infty} \\ &= \frac{1}{\lambda} \end{aligned}$$

- **Ex 1:** a unit has MTTF = 30,000 hrs. Find failure rate.
 $\lambda = 1/30,000 = 3.3 \times 10^{-5}/\text{hr}$
- **Ex 2:** Compute mission time T_M if $R_{th} = 0.95$.
 $e^{-\lambda T_M} = 0.95 \quad T_M = -\ln(0.95)/\lambda \approx 0.051/\lambda$
- **Ex 3:** Assume $\lambda = 3.33 \times 10^{-5}$, and $R_{th} = 0.95$ find T_M .
Ans: $T_M = 1538.8$ hrs
(compare with MTTF = 30,000)

Single Unit: Temporary Failures(1)

- **Temporary:** intermittent, transient, permanent with repair



$$\frac{dp_0(t)}{dt} = -\lambda p_0(t) + \mu p_1(t)$$

$$\frac{dp_1(t)}{dt} = +\lambda p_0(t) - \mu p_1(t)$$

can be solved by laplace transform etc.

Note state diagram &
Differential equations for
Markov modeling

Y. K. Malaiya, S. Y. H. Su: Reliability
Measure of Hardware Redundancy
Fault-Tolerant Digital Systems with
Intermittent Faults. IEEE Trans.
Computers 30(8): 600-604 (1981)

$$p_0(t) = p_0(0)e^{-(\lambda + \mu)t} + \frac{\mu}{\lambda + \mu}(1 - e^{-(\lambda + \mu)t})$$

Similarly we can get an expression for $p_1(t)$, however it is
not needed since $p_1(t) = 1 - p_0(t)$.

Single Unit: Temporary Failures(2)

- $p_0(t) = p_0(0)e^{-(\lambda + \mu)t} + \frac{\mu}{\lambda + \mu}(1 - e^{-(\lambda + \mu)t})$

- Availability $A(t) = p_0(t)$

Thus $A(t) = p_0(0)e^{-(\lambda + \mu)t} + \frac{\mu}{\lambda + \mu}(1 - e^{-(\lambda + \mu)t})$

- Note that steady – state probabilities exist :

$$t \rightarrow \infty, p_0(t) = \frac{\mu}{\lambda + \mu} \quad p_1(t) = \frac{\lambda}{\lambda + \mu}$$

- Steady - state availability is $\frac{\mu}{\lambda + \mu}$

Single Unit: Temporary Failures(3)

- Reliability (durational)

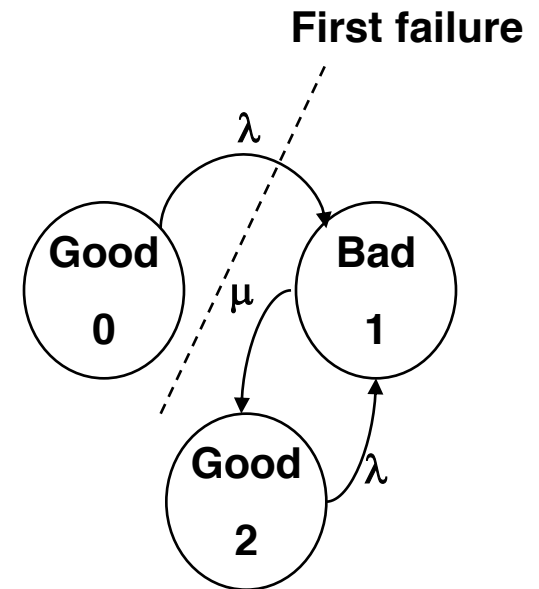
$$R(t) = P\{\text{no failures in } (0, t)\}$$

$$= P\{\text{in Good 0 at } t\}$$

$$= e^{-\lambda t}$$

same as permanent failure

- Thus $MTTF = \frac{1}{\lambda}$
- Mission time : also same



Note that when we say **no failures in (0,t)**, even a brief failure is a failure. Thus $R(t)$ may be too strict a measure when brief failures may be acceptable.

Combinatorial Reliability

This is a part of classic reliability theory.

Objective is: Given a

- systems structure in terms of its units
- reliability attributes of the units
- some simplifying assumptions
- We need to **evaluate the overall reliability** measure.

There are **two extreme cases** we will examine first:

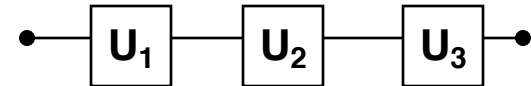
- Series configuration
- Parallel configuration
- Other cases involve combinations and other configurations.
- Note that conceptual modeling is applicable to $R(t)$, $A(t)$, $R_t(t)$. A system is either good or bad.

Series configuration

Series configuration: all units are essential. System fails if one of them fails .

- **Assumption:** statistically independent failures in units.

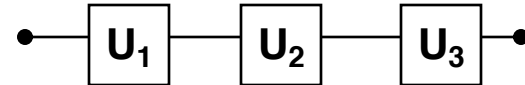
$$\begin{aligned} R_S &= P\{U_1 \text{ good} \cap U_2 \text{ good} \cap U_3 \text{ good}\} \\ &= P\{U_1 g\}P\{U_2 g\}P\{U_3 g\} \\ &= R_1 R_2 R_3 \end{aligned}$$



In general
$$R_S = \prod_{i=1}^n R_i$$

Series configuration

The reliability block diagrams like this are only conceptual, not physical.



If $R_i(t) = e^{-\lambda_i t}$

then $R_s(t) = \prod e^{-\lambda_i t} = e^{-(\lambda_1 + \lambda_2 + \dots + \lambda_n)t}$

i.e. system failure rate is the sum of individual failure rates :

$$\lambda_s = \lambda_1 + \lambda_2 + \dots + \lambda_n$$

This gives us a nice way to estimate the overall failure rate, when all the individual units are essential. This is the basis of the approach used in the popular “Military Handbook” MIL-HDBK-217 approach for estimating the failure rates for different systems.

The failure rates of individual units are estimated using empirical formulas. For example the failure rate of a VLSI chip is related to its complexity etc.

“A chain is as strong as it's weakest link”

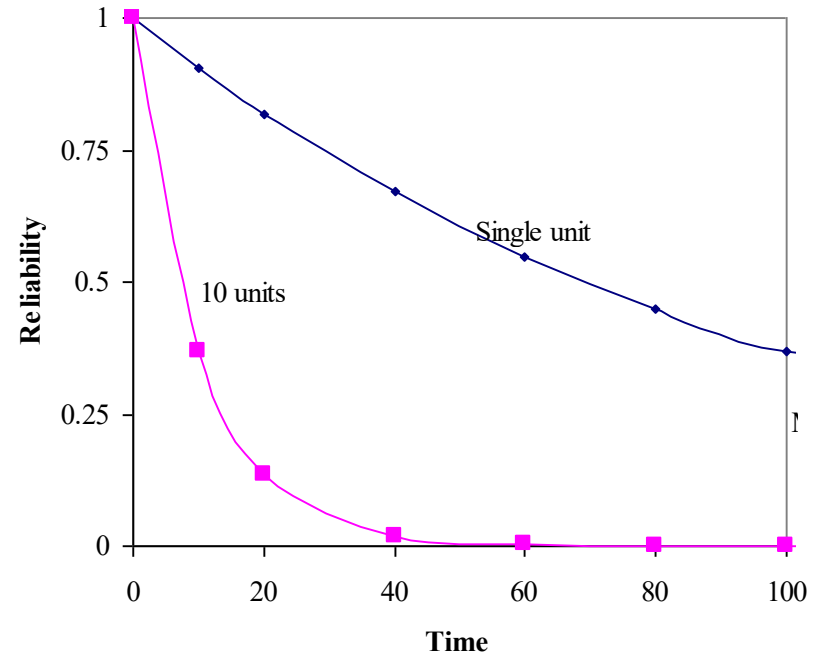
Do you agree?

Let us see for a 4-unit series system

- Assume $R_1=R_2=R_3=0.95$, $R_4=0.75$
 - $R_S = 0.95 \times 0.95 \times 0.95 \times 0.75$
 $= 0.643$
- Thus a chain is slightly weaker than its weakest link!

The plot gives reliability of a 10-unit system vs a single system. Each of the 10 units are identical.

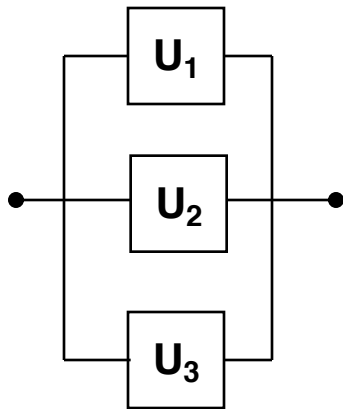
- More units, less reliability.



Combinatorial: Series

Combinatorial: Parallel

- **Parallel configuration:** System is good when least one of the several replicated units is good. A parallel configuration represents an *ideal* redundant system, ignoring any overhead.



$$\begin{aligned} R_s &= 1 - P\{all\ units\ bad\} \\ &= 1 - P\{U_1\ bad \cap U_2\ bad \cap U_3\ bad\} \\ &= 1 - P\{U_1\ b.\}P\{U_2\ b.\}P\{U_3\ b.\} \\ &= 1 - (1 - R_1)(1 - R_2)(1 - R_3) \end{aligned}$$

$$\text{In general } R_s = 1 - \prod_{i=1}^n (1 - R_i)$$

$$i.e. \quad \bar{R}_s = \prod_{i=1}^n \bar{R}_i$$

Where \bar{R} represents
1-R, i.e. “unreliability”

Parallel Configuration: Example

Problem : Need system reliability $R_s = 1 - \epsilon$
How many parallel units are needed
if $R_1 = R_2 = \dots = R_m$, $R_m < R_s$?

Sometimes it is more convenient to talk in terms of “*unreliability*”

Solution : $1 - R_s = (1 - R_m)^x$

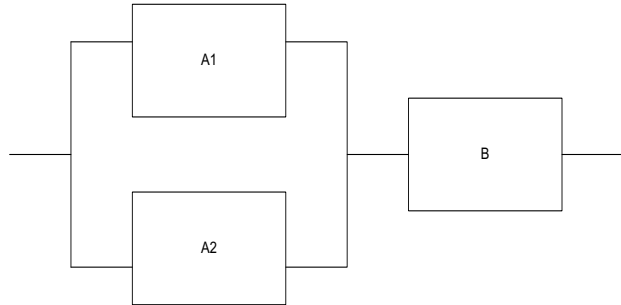
$$\epsilon = (1 - R_m)^x$$

$$x = \frac{\ln \epsilon}{\ln(1 - R_m)}$$

**Remember,
we're consider
an *ideal* system**

Assume $R_s = 0.9999$ ($\epsilon = 0.0001$),
 $R_m = 0.9$
gives $x = 4$.

An Example Problem



The failure rate for sub-units A1 and A2 is λ_A , for sub-unit B the failure rate is λ_B , You can assume independence of failures for sub-units. Find an expression for $R(t)$ and $MTTF$.

- $R(t) = [P\{A1 \text{ is good}\}P\{A2 \text{ is good}\} + P\{A1 \text{ is good}\}P\{A2 \text{ is bad}\} + P\{A1 \text{ is bad}\}P\{A2 \text{ is good}\}] \cap P\{B \text{ is good}\}$
 $= [1 - P\{A1 \text{ is bad}\}P\{A2 \text{ is bad}\}] \cap P\{B \text{ is good}\}$
 $= [1 - (1 - e^{-\lambda_A t})^2] e^{-\lambda_B t} = [2e^{-\lambda_A t} - e^{-2\lambda_A t}] e^{-\lambda_B t}$
 $= [2 - e^{-\lambda_A t}] e^{-(\lambda_A + \lambda_B)t}$
- $MTTF = \int_0^{\infty} R_1(t) dt = \int_0^{\infty} [2 - e^{-\lambda_A t}] e^{-(\lambda_A + \lambda_B)t} dt =$
 $2 \int_0^{\infty} e^{-(\lambda_A + \lambda_B)t} dt - \int_0^{\infty} e^{-(2\lambda_A + \lambda_B)t} dt = \frac{2}{\lambda_A + \lambda_B} - \frac{1}{2\lambda_A + \lambda_B}$