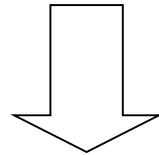


# Quantitative evaluation of Dependability

# Quantitative evaluation of Dependability

- Faults are the cause of errors and failures. Does the arrival time of faults fit a **probability distribution**? If so, what are the parameters of that distribution?
- Consider the time to failure of a system or component. It is not exactly predictable - **random variable**.



**probability theory**

**Quantitative evaluation of failure rate, Mean Time To Failure (MTTF), Mean Time To Repair (MTTR), Reliability function (R(t)), Availability function (A(t)) and Safety function (S(t))**

# Random variable

Random variable

*a random variable  $X$  is a function from a sample space ( $\Omega$ ) to reals numbers*

Let us consider the random experiment of **tossing a die**.

Let  $X$  be the random variable defined as the face you obtain

Sample space  $\Omega$  : faces of the die (1, 2, 3, 4, 5, 6)

Real numbers  $S$ : 1, 2, 3, 4, 5, 6

Any element in the sample space  $\Omega$  has a well defined probability distribution.

The probability assigned to each output of the experiment is  $1/6$ .

If the set of values the variable can assume ( $S$ ) is finite then  
 $X$  is a **discrete random variable**

# Random variable

We define the **probability distribution function** of a discrete random variable: a mapping of all possible values of the random variable ( $S$ ) to their corresponding probabilities for the given sample space  $\Omega$

$$f(x) = P(X=x)$$

$$f(x) = \begin{cases} 1/6 & \text{for all } i=1, \dots, 6 \\ 0 & \text{otherwise} \end{cases}$$

$P(X=1)=1/6$   
 $P(X=2)=1/6$   
.....

An order relation can be defined on  $\Lambda$ . The probability of the following sets can be computed:

$$P\{X \leq x\} \text{ for } x \text{ in } S$$

We define the **cumulative distribution function** of  $X$

$$F(x) = P\{X \leq x\}$$

$F$  is a non-decreasing function, if  $x_1 \leq x_2$ , then  $F(x_1) \leq F(x_2)$

$$F(3) = P\{X \leq 3\} = P\{X=1\} + P\{X=2\} + P\{X=3\} = 1/6 + 1/6 + 1/6 = 1/2$$

# Random variable

Let us consider the random experiment of the measuring the temperature in a region.

Let  $X$  be the random variable defined as the temperature you obtain.

Sample space  $\Omega$  : Real numbers

Real numbers  $S$ : Real numbers

By definition, the probability of any real number is zero. The random variable can be infinitely divided into smaller parts such that the probability of selecting a real integer value  $x$  is zero.

$$P(X=x) = 0$$

Probability is computed as:

$$P(X \leq x)$$

$$P(X \geq x)$$

$$P(x_1 \leq x \leq x_2)$$

# Random variable

We define the **probability density function**:

$$P(x_1 < X < x_2) = \int_{x_1}^{x_2} f(x)dx$$

probability that a given output will occur at a given point

An example of probability density function :

$$f(x) = \begin{cases} 3x^{-4}, & x > 1 \\ 0, & \textit{elsewhere} \end{cases}$$

**Cumulative distribution function** for a continuous random variable:

$$F(x) = P(X \leq x)$$

which is the same as

$$F(x) = \int_{-\infty}^x f(t)dt, \text{ for } -\infty < x < \infty$$

The probability density function can be computed by the cumulative distribution function if the derivative exists:

$$f(x) = \frac{dF(x)}{dx}$$

# Quantitative definition of dependability attributes

## Reliability - $R(t)$

conditional probability that the system performs correctly throughout the *interval of time*  $[t_0, t]$ , given that the system was performing correctly at the *instant* of time  $t_0$

## Availability - $A(t)$

the probability that the system is operating correctly and is available to perform its functions at the *instant* of time  $t$

## Safety - $S(t)$

the probability that the system either behaves correctly or will discontinue its functions in a manner that causes no harm throughout the *interval of time*  $[t_0, t]$ , given that the system was performing correctly at the *instant* of time  $t_0$

# Definitions

Reliability  $R(t)$

$$R(0) = 1 \quad R(\infty) = 0$$

Failure probability  $Q(t)$

$$Q(t) = 1 - R(t)$$

Failure probability density function  $f(t)$

the failure density function  $f(t)$  at time  $t$  is the number of failures in  $\Delta t$

$$f(t) = \frac{dQ(t)}{dt} = \frac{-dR(t)}{dt}$$

Failure rate function  $\lambda(t)$

the failure rate  $\lambda(t)$  at time  $t$  is defined by the number of failures during  $\Delta t$  in relation to the number of correct components at time  $t$

$$\lambda(t) = \frac{f(t)}{R(t)} = \frac{-dR(t)}{dt} \frac{1}{R(t)}$$

# Hardware Reliability

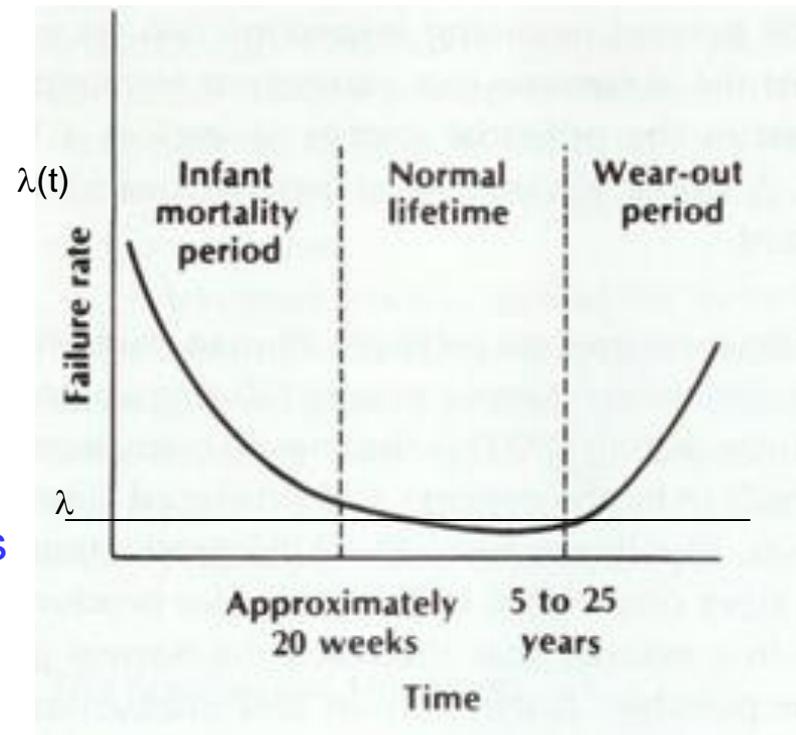
$\lambda(t)$  is a function of time  
( bathtub-shaped curve )

$\lambda(t)$  constant  $> 0$  in the  
useful life period

Constant failure rate  $\lambda$

(usually expressed in number of failures  
for million hours)

$\lambda = 1/2000$   
one failure every 2000 hours



From: D. P. Siewiorek R.S. Swarz, *Reliable Computer Systems*, Prentice Hall, 1992

Early life phase: there is a higher failure rate, called infant mortality, due to the failures of weaker components. Often these infant mortalities result from defect or stress introduced in the manufacturing process.

Operational life phase: the failure rate is approximately constant.

Wear-out phase: time and use cause the failure rate to increase.

# Hardware Reliability

Constant failure rate

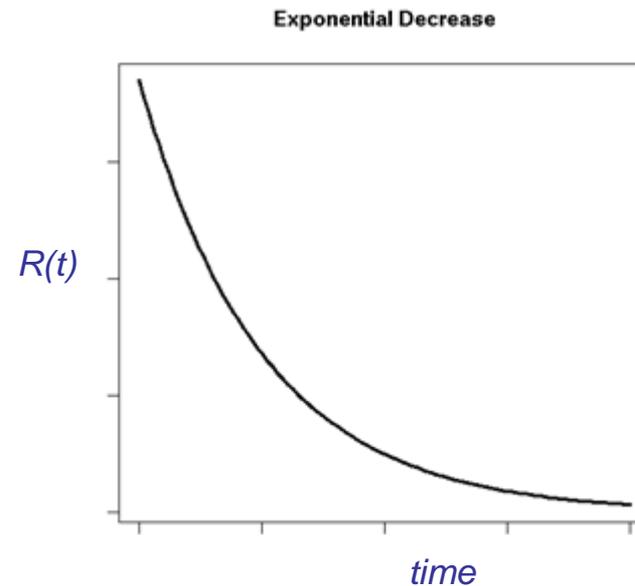
$$\lambda(t) = \lambda$$

Reliability function

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

Probability density function

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



the exponential relation between reliability and time is known as  
***exponential failure law***

# Time to failure of a component

Time to failure of a component can be modeled by a **random variable**  $X$

$f_X(t)$  probability density function  $P[X=t]$  (X discrete)

$F_X(t)$  cumulative distribution function  $P[X \leq t]$

Unreliability of the component at time  $t$  is given by

$$Q(t) = P[X \leq t] = F_X(t)$$

Reliability of the component at time  $t$  is given by

$$R(t) = P[X > t] = 1 - P[X \leq t] = 1 - F_X(t) \quad \text{reliability function}$$

$R(t)$  is the probability of not observing any failure before time  $t$

# Hardware Reliability

## Mean time to failure (MTTF)

is the expected time that a system will operate before the first failure occurs (e.g., 2000 hours)

$$MTTF = \int_0^{\infty} t f(t) dt = \int_0^{\infty} t \lambda e^{-\lambda t} dt = \frac{1}{\lambda}$$

$$\lambda = 1/2000$$

0.0005 per hour

$$MTTF = 2000$$

time to the first failure 2000 hours

## Failure in time (FIT)

measure of failure rate in  $10^9$  device hours

1 FIT means 1 failure in  $10^9$  device hours

# Failure Rate

- Handbooks of failure rate data for various components are available from government and commercial sources.

- *Reliability Data Sheet of product*

- **Commercially available databases**

- Military Handbook MIL-HDBK-217F

- Telcordia,

- PRISM User's Manual,

- International Electrotechnical Commission (IEC) Standard 61508

- ...

Databases used to obtain reliability parameters in  
"Traditional Probabilistic Risk Assessment Methods  
for Digital Systems",  
U.S. Nuclear Regulatory Commission,  
NUREG/CR-6962, October 2008

# Distribution model for permanent faults

MIL-HBDK-217 (*Reliability Prediction of Electronic Equipment* -Department of Defence) is a model for chip failure. Statistics on electronic components failures are studied since 1965 (periodically updated).

Typical component failure rates in the range 0.01-1.0 per million hours.

Failure rate for a single chip :

$$\lambda = \tau_L \tau_Q (C_1 \tau_T \tau_V + C_2 \tau_E)$$

$\tau_L$  = learning factor, based on the maturity of the fabrication process

$\tau_Q$  = quality factor, based on incoming screening of components

$\tau_T$  = temperature factor, based on the ambient operating temperature and the type of semiconductor process

$\tau_E$  = environmental factor, based on the operating environment

$\tau_V$  = voltage stress derating factor for CMOS devices

**$C_1, C_2$  = complexity factors, based on the number of gates, or bits for memories in the component and number of pins.**

*From Reliable Computer Systems. D. P. Siewiorek R.S. Swarz, Prentice Hall, 1992*

# Model-based evaluation of dependability

MODEL-BASED evaluation of dependability

(a model is an abstraction of the system that highlights the important features for the objective of the study)

Dependability of a system is calculated in terms of the dependability of individual components

“divide And conquer approach”: the solution of the entire model is constructed on the basis of the solutions of individual sub-models



Methodologies that employ combinatorial models  
Reliability Block Diagrams, Fault tree, ....



State space representation methodologies  
Markov chains, Petri-nets, SANs, ...

# Model-based evaluation of dependability

## Combinatorial methods

offer simple and intuitive methods of the construction and solutions of models

independent components

each component is associated a failure rate

model construction is based on the structure of the systems (series/parallel connections of components)

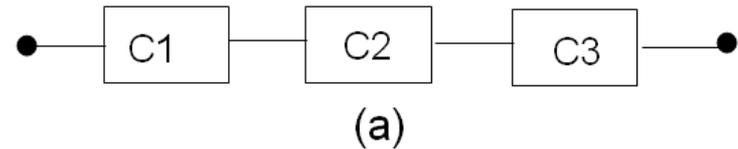
inadequate to deal with systems that exhibits complex dependencies among components and repairable systems

# Combinatorial models

**Series:** all components must be operational (a)

$R_i(t)$  reliability of module  $i$  at time  $t$

$R_{series}(t) = \prod_{i=1}^n R_i(t)$   
where  $\prod$  is the product



If each individual component  $i$  satisfies the exponential failure law with constant failure rate  $\lambda_i$ :

$$R_{series}(t) = e^{-\lambda_1 t} \dots e^{-\lambda_n t} = e^{-\sum_{i=1}^n \lambda_i t}$$

Unreliability function

$$Q_{series}(t) = 1 - R_{series}(t) = 1 - \prod_{i=1}^n R_i(t) = 1 - \prod_{i=1}^n [1 - Q_i(t)]$$

# Combinatorial models

If the system does not contain any redundancy, that is any component must function properly for the system to work, and if component failures are independent, then

- the **system reliability** is the product of the component reliability, and it is exponential
  
- the **failure rate of the system** is the sum of the failure rates of the individual components

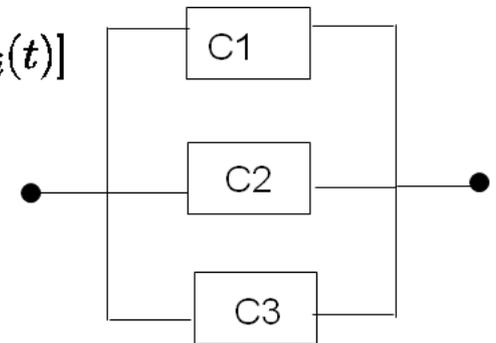
# Combinatorial models

**Parallel:** at least one of the components must be operational (b)

$$Q_{parallel}(t) = \prod_{i=1}^n Q_i(t)$$

$$R_{parallel}(t) = 1 - Q_{parallel}(t) = 1 - \prod_{i=1}^n Q_i(t) = 1 - \prod_{i=1}^n [1 - R_i(t)]$$

Note the duality between  $Q$  and  $R$  in the two cases



(b)

**M-of-N systems - a generalisation of parallel model**  
at least M modules of N are required to function

Assume N identical modules and M of those are required for the system to function properly, the expression for reliability of M-of-N subsystems can be written as:

$$R_{M-of-N}(t) = \sum_{i=0}^{N-M} \frac{N!}{(N-i)!i!} R^{N-i}(t)(1 - R(t))^i$$

$i$  number of faulty components

$$\binom{N}{i} = \frac{N!}{(N-i)! i!}$$

*Binomial coefficient*

# Combinatorial models

If the system contain redundancy, that is a subset of components must function properly for the system to work, and if component failures are independent, then

- the **system reliability** is the reliability of a series/parallel combinatorial model

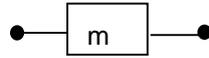
# TMR

## Simplex system

$\lambda$  failure rate of module  $m$

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

$$R_{\text{simplex}} = e^{-\lambda t}$$



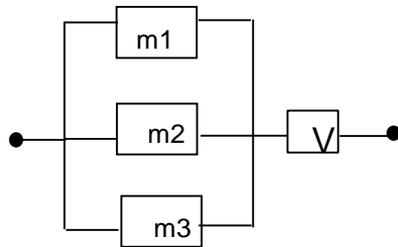
## TMR system

$$R_V(t) = 1$$

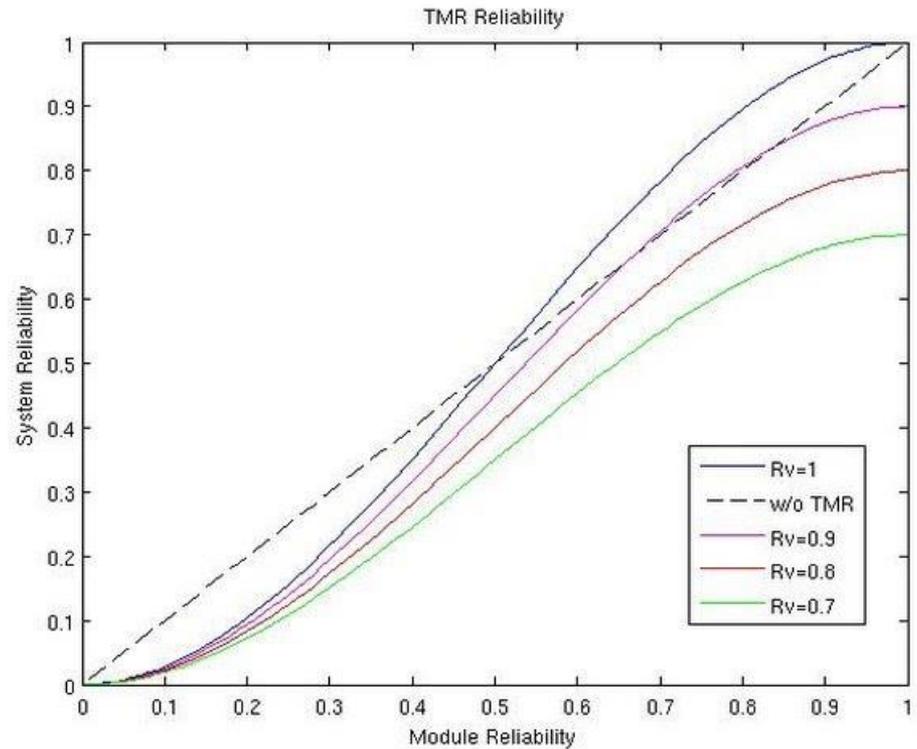
$$R_{\text{TMR}} = \sum_{i=0}^1 \binom{3}{i} (e^{-\lambda t})^{3-i} (1 - e^{-\lambda t})^i$$

$$= (e^{-\lambda t})^3 + 3(e^{-\lambda t})^2 (1 - e^{-\lambda t})$$

$$R_{\text{TMR}} > R_m \text{ if } R_m > 0.5$$



2 of 3



From [www.google.com](http://www.google.com)

# TMR: reliability function and mission time

$$R_{\text{simplex}} = e^{-\lambda t}$$

$$MTTF_{\text{simplex}} = \frac{1}{\lambda}$$

TMR system

$$R_{\text{TMR}} = 3e^{-2\lambda t} - 2e^{-3\lambda t}$$

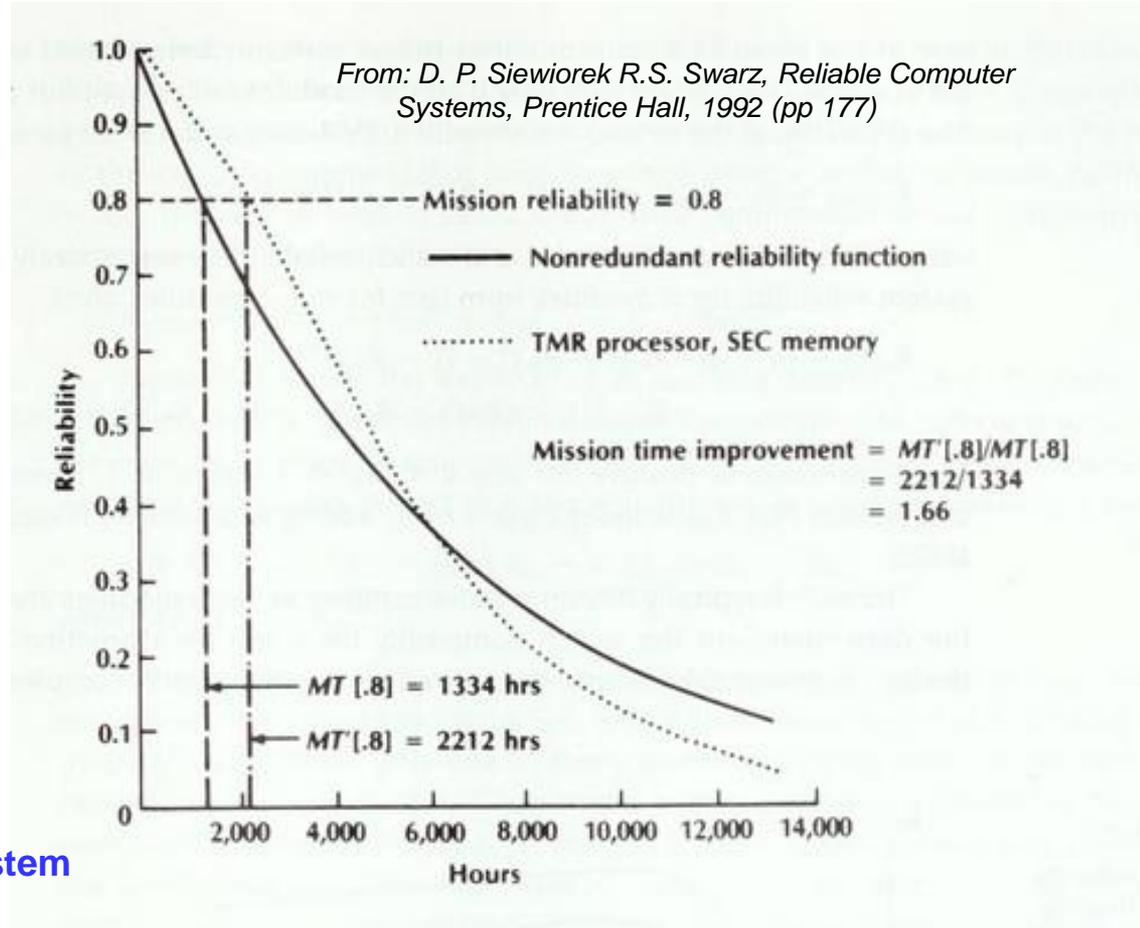
$$MTTF_{\text{TMR}} = \frac{3}{2\lambda} - \frac{2}{3\lambda} = \frac{5}{6\lambda} < \frac{1}{\lambda}$$

TMR worse than a simplex system !

TMR has a higher reliability for the first 6.000 hours of system life

TMR operates at or above 0.8 reliability 66 percent longer than the simplex system

- S shape curve is typical of redundant systems (there is the well known knee):  
 above the knee the redundant system has components that tolerate failures;  
 after the knee there is a sharper decrease of the reliability function in the redundant system (the system has exhausted redundancy, there is more hardware to fail than in the non redundant system )



# Hybrid redundancy with TMR

## Symplex system

$\lambda$  failure rate  $m$

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

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

## Hybrid system

$n=N+S$  total number of components

$S$  number of spares

Let  $N = 3$

$$R_{SDV}(t) = 1$$

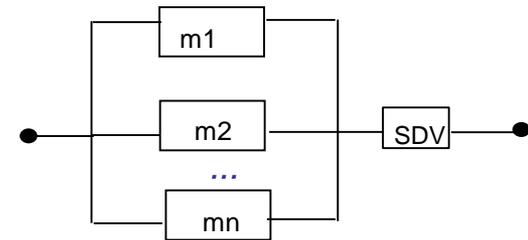
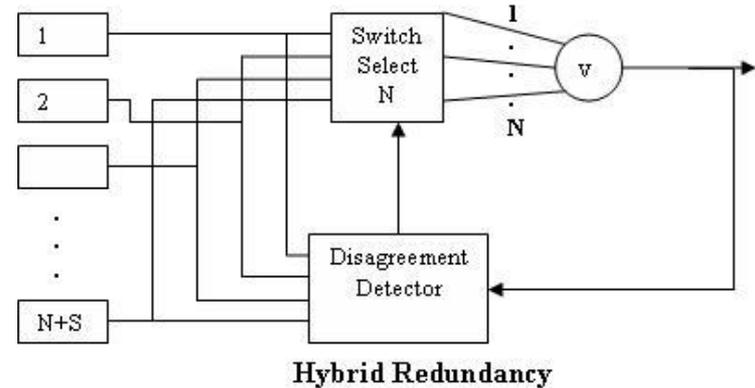
$\lambda$  failure rate of on line comp

$\lambda$  failure rate of spare comp

The first system failure occurs if 1) all the modules fail; 2) all but one modules fail

$$R_{Hybrid} = R_{SDV}(1 - Q_{Hybrid})$$

$$R_{Hybrid} = (1 - ((1 - R_m)^n + n(R_m)(1 - R_m)^{n-1}))$$

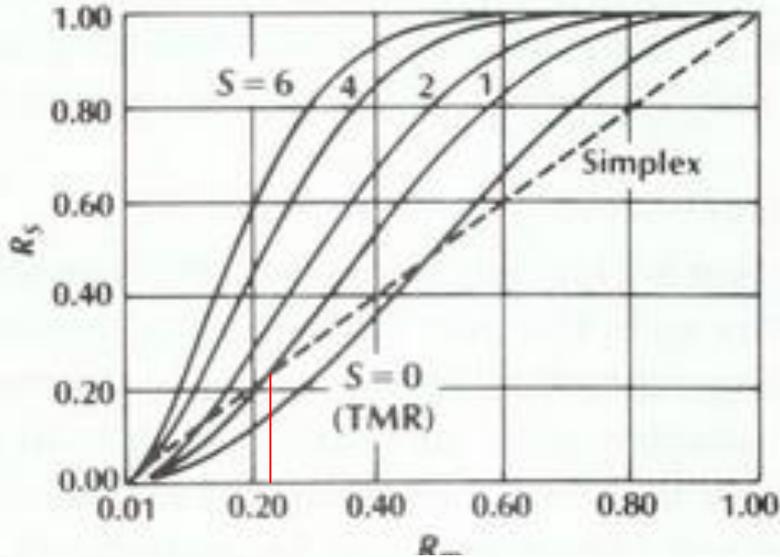


$$R_{Hybrid(n+1)} - R_{Hybrid(n)} > 0$$

*adding modules increases the system reliability under the assumption  $R_{SDV}$  independent of  $n$*

# Hybrid redundancy with TMR

Hybrid TMR system reliability  $R_S$  vs individual module reliability  $R_m$



$S$  is the number of spares  
 $R_{SDV} = 1$

Figure 1. system with standby failure rate equal to on-line failure rate

the TMR with one spare is more reliable than simplex system if  $R_m > 0.23$

From: D. P. Siewiorek R.S. Swarz, *Reliable Computer Systems*, Prentice Hall, 1992 (pp 177)

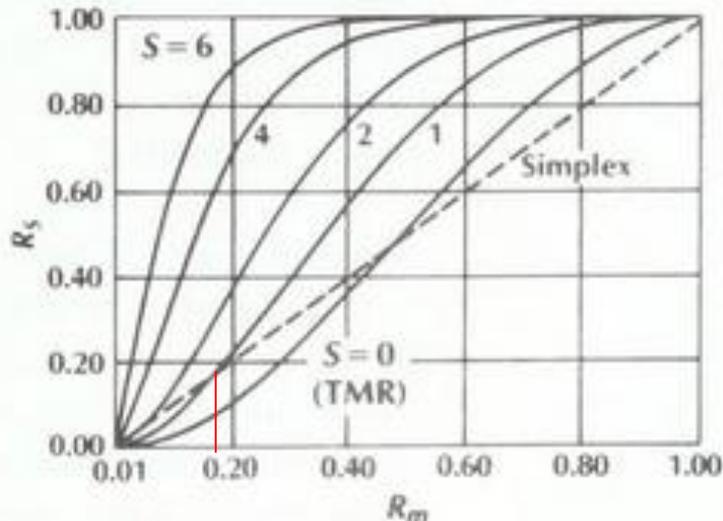


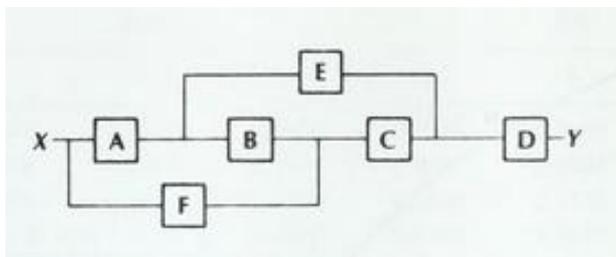
Figure 2. system with standby failure rate equal to 10% of on line failure rate

the TMR with one spare is more reliable than simplex system if  $R_m > 0.17$

From: D. P. Siewiorek R.S. Swarz, *Reliable Computer Systems*, Prentice Hall, 1992 (pp 177)

# Non-series/nonparallel models

Success diagram



System successfully operational  
for each path from X to Y

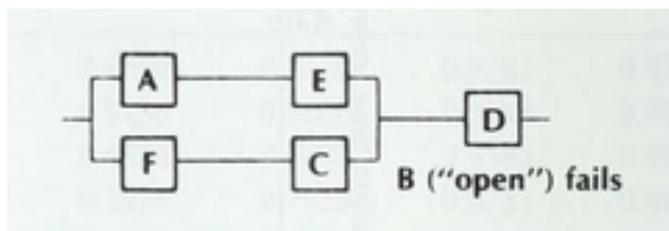
From: D. P. Siewiorek R.S. Swarz, *Reliable Computer Systems*, Prentice Hall, 1992

Reliability computed expanding around one module m:

$$R_{\text{sys}} = R_m \times P(\text{system works} \mid m \text{ works}) + (1 - R_m) \times P(\text{system works} \mid m \text{ fails})$$

Let  $m = B$

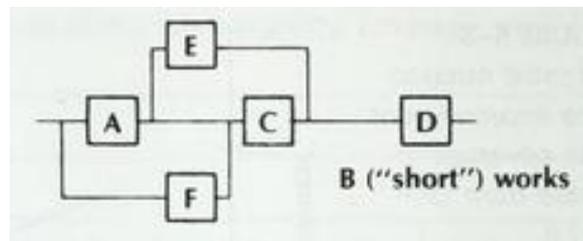
$$R_{\text{sys}} = R_B \times P(\text{system works} \mid B \text{ works}) + (1 - R_B) \times P(\text{system works} \mid B \text{ fails})$$



$$P(\text{system works} \mid B \text{ fails}) = \{ R_D [1 - (1 - R_A R_E) (1 - R_F R_C)] \}$$

$$R_i = R_m$$

$$R_{\text{sys}} \leq (R_m)^6 - 3 (R_m)^5 + (R_m)^4 + 2(R_m)^3$$

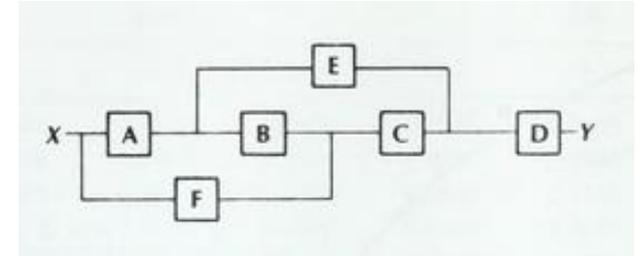
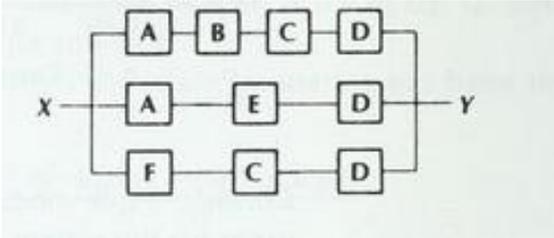


$P(\text{system works} \mid B \text{ works})$   
must be further reduced

.....

# Non-series/nonparallel upper-limit

Reliability Block Diagram: all path in parallel



From: D. P. Siewiorek R.S. Swarz, *Reliable Computer Systems*, Prentice Hall, 1992

**Upper-bound:**

$$R_{\text{Sys}} \leq 1 - \prod_i (1 - R_{\text{path } i})$$

**Upper-bound because paths are not independent, the failure of a single module affects more than one path (close approximation if paths are small)**

**Upper-bound:**

$$R_{\text{Sys}} \leq 1 - (1 - R_A R_B R_C R_D) (1 - R_A R_E R_D) (1 - R_F R_C R_D)$$

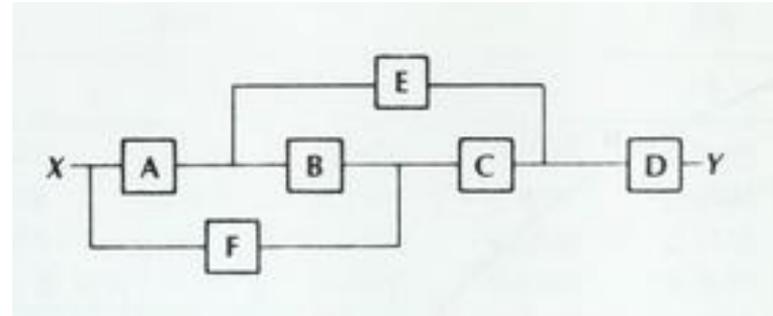
**Let  $R_m$  be the reliability of a component**

$$R_{\text{Sys}} \leq 2 (R_m)^3 + (R_m)^4 - (R_m)^6 - 2 (R_m)^7 + (R_m)^{10}$$

# Non-series/nonparallel lower-limit

Minimal cut set : is a list of sets of components such that every operational path includes at least one component from each element the list

**Minimal cut sets of the system:**  
**{D}{A,F}{E,C}{A,C}{BEF}**



*From: D. P. Siewiorek R.S. Swarz, Reliable Computer Systems, Prentice Hall, 1992*

**Lower-bound:**

$$R_{\text{Sys}} \geq \prod_i R_{\text{cut } i} \quad \text{reliability of the series of cut sets}$$

where  $R_{\text{cut } i}$  is the reliability of cut  $i$  (parallel of components)

Let  $R_m$  be the reliability of a component

$$R(\{D\}) = R_m \quad R(\{A,F\}) = R(\{E,C\}) = R(\{A,C\}) = 1 - (1 - R_m)^2 \quad R(\{B,E,F\}) = 1 - (1 - R_m)^3$$

**Lower-bound:**

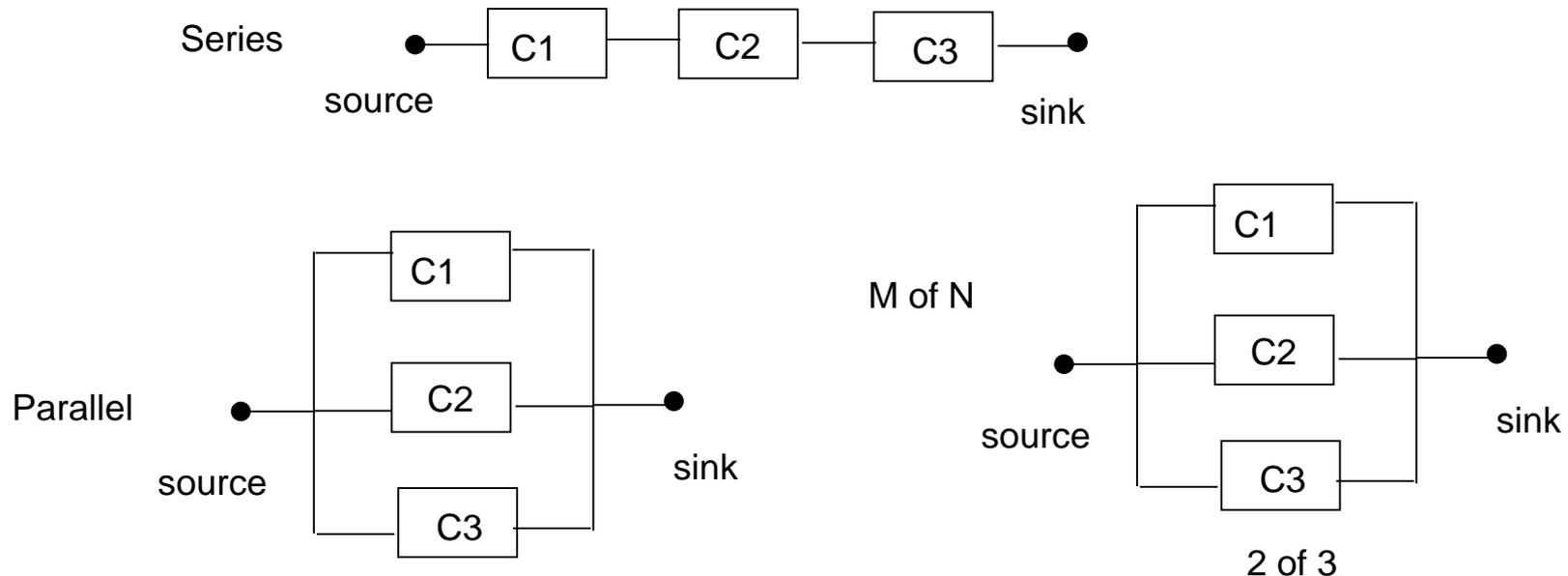
$$R_{\text{Sys}} \geq R_m (1 - (1 - R_m)^2)^3 (1 - (1 - R_m)^3)$$

$$R_{\text{Sys}} \geq 24 R_m^5 - 60 R_m^6 + 62 R_m^7 - 33 R_m^8 + 9 R_m^9 - R_m^{10}$$

# SHARPE tool

## Reliability Blocks diagrams

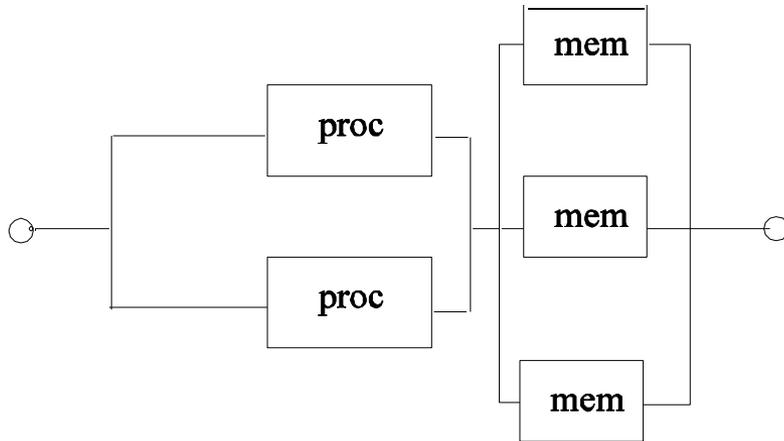
- Blocks are components connected among them to represent the temporal order with which the system uses components, or the management of redundancy schemes or the success criteria of the system
- System failure occurs if there is no path from source to sink



# Example

Multiprocessor with 2 processors and three shared memories

-> analysis under different conditions



Series/Parallel