Traditional Hazard Analysis

Agenda

- Today
 - Intro to Hazard Analysis
 - Traditional Qualitative Methods
 - FMEA
 - FTA
 - ETA
 - HAZOP
 - Strengths / Limitations
- Next: Traditional Quantitative Methods
 - FMECA
 - FTA
 - PRA
 - Strengths / Limitations

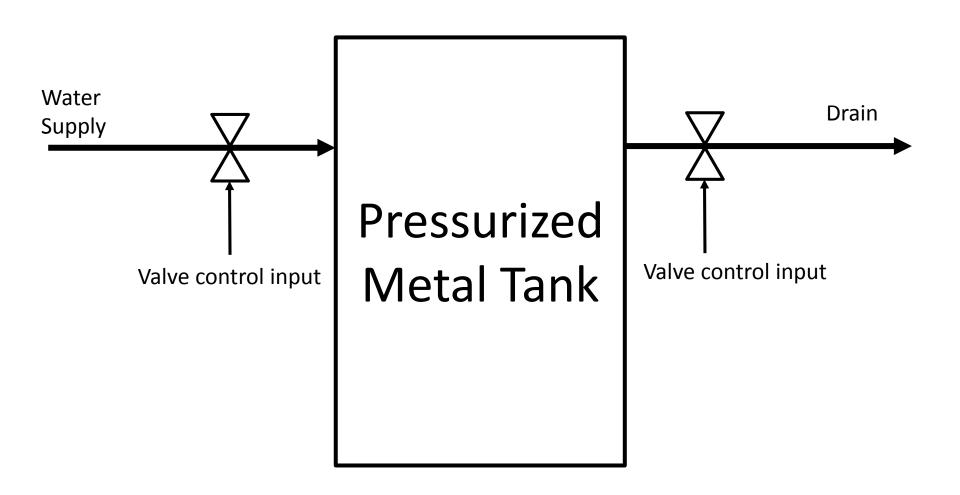
Hazard (Causal) Analysis

- "Investigating an accident before it happens"
- Goal is to identify causes of accidents (before they occur) so can eliminate or control them in
 - Design
 - Operations

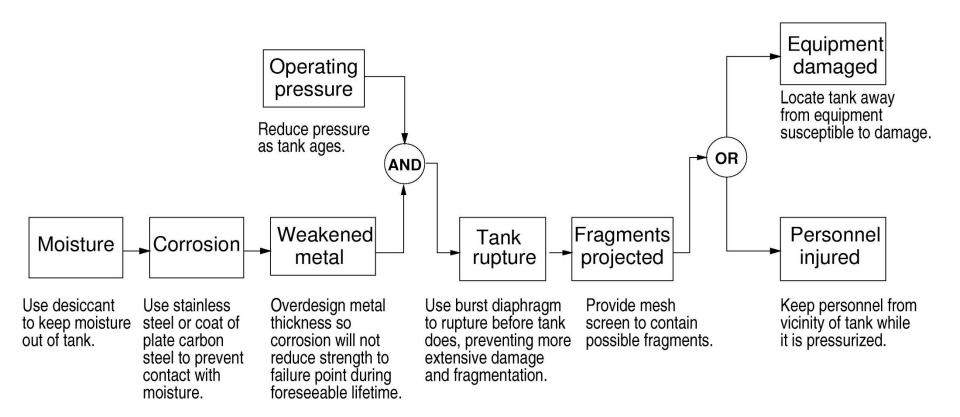
- Requires
 - A system design model
 - An accident model

(even if only in the mind of the analyst)

Physical System Design Model (simplified)



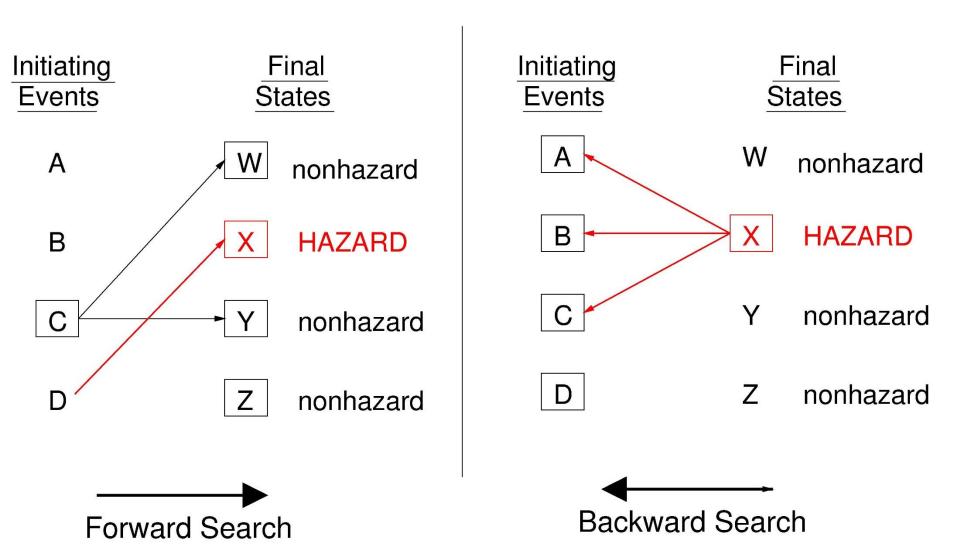
Chain-of-events example

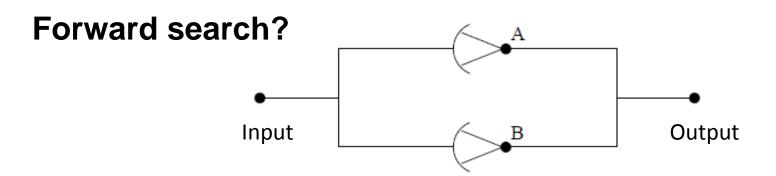


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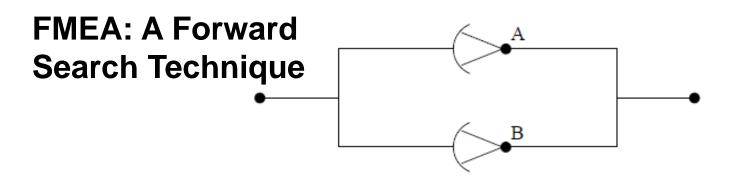
How do you find the chain of events before an accident?

Forward vs. Backward Search





a system of two amplifiers in parallel.

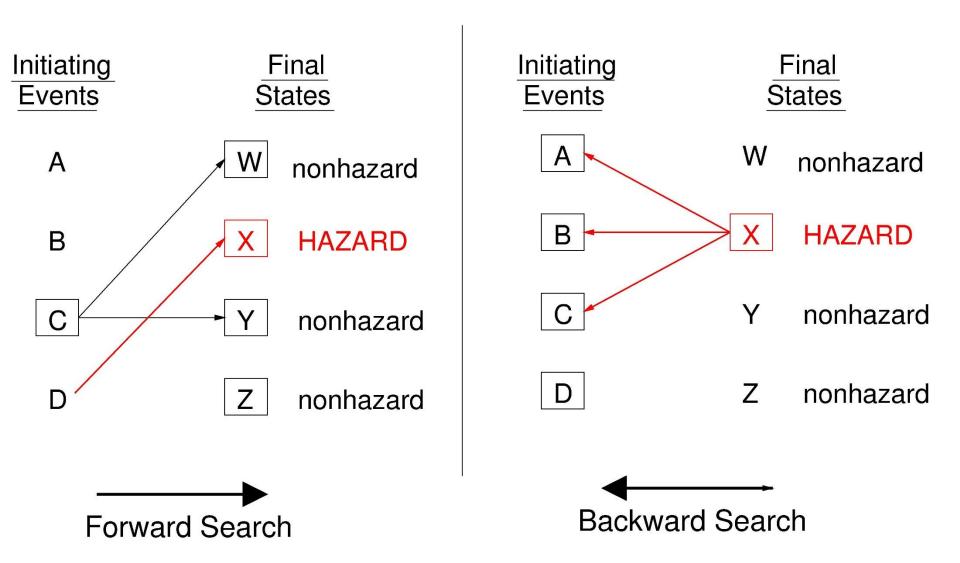


				Effects	
Component	Failure mode	1	Critical	Noncritical	
A B		Open Short Other Open Short Other		X X X	X

This figure is in the public domain.

Figure 3: FMEA for a system of two amplifiers in parallel. (Source: W.E. Vesely, F.F. Goldberg, N.H. Roberts, and D.F. Haasl, *Fault Tree Handbook*, NUREG-0492, U.S. Nuclear Regulatory Commission, Washington, D.C., 1981, page II-3)

Forward vs. Backward Search



5 Whys Example (A Backwards Analysis)

Problem: The Washington Monument is disintegrating.

Why is it disintegrating?

Because we use harsh chemicals

Why do we use harsh chemicals?

To clean pigeon droppings off the monument

Why are there so many pigeons?

They eat spiders and there are a lot of spiders at monument

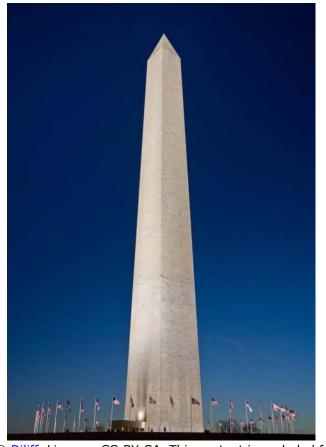
Why are there so many spiders?

They eat gnats and lots of gnats at monument Why so many gnats?

They are attracted to the lights at dusk

Solution:

Turn on the lights at a later time.



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Why was the Washington Monument disintegrating?

There was a time when the Washington Monument was disintegrating. A research team realised that this was happening because of the harsh chemicals used to clean the monument.

The reason why harsh chemicals were used was because there was a lot of pigeon poop on the monument which needed regular cleaning up.

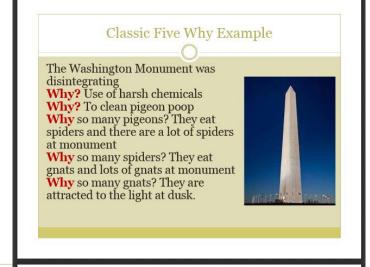
The reason why there was so much pigeon poop was that a lot of pigeons were attracted to the monument because they loved eating spiders, and there were a lot of spiders there.

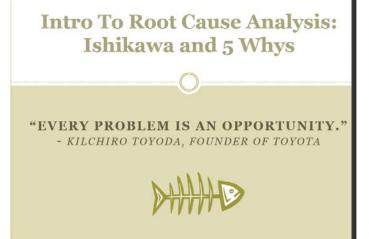
The reason why there were so many spiders was that the spiders eat gnats and there were a lot of gnats around the monument.

The reason why there were so many gnats around the monument was that they were attracted to the bright lights which were switched on at dusk.

So, at the end of the root cause analysis, the most effective solution was to turn on the lights not at dusk but a little later!

Who would have imagined that the solution to protecting a monument could be so simple and yet so effective as not switching on the lights at dusk. Such is the power of finding the right root cause.





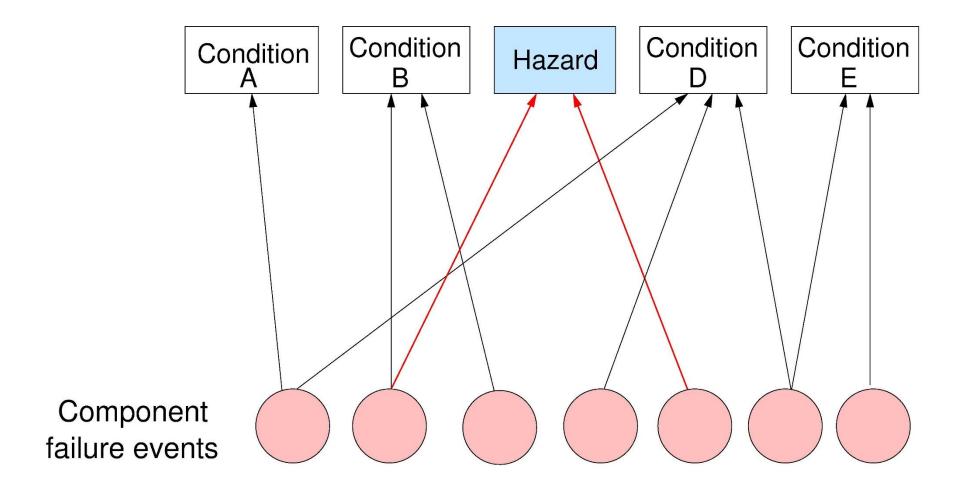


"Breaking the accident chain of events" (see video)

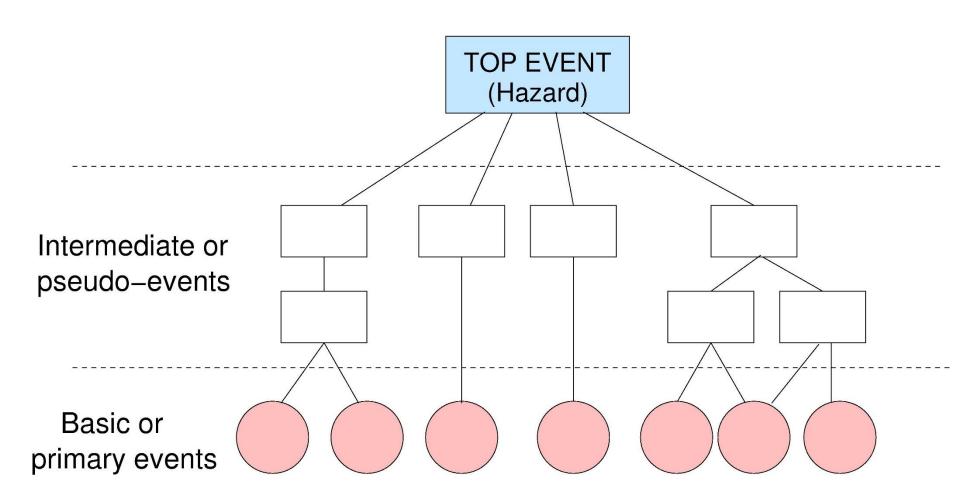
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http://www.lean.ohio.gov/Portals/0/docs/training/GreenBelt/GB_Fishbone%20Diagram.pdf

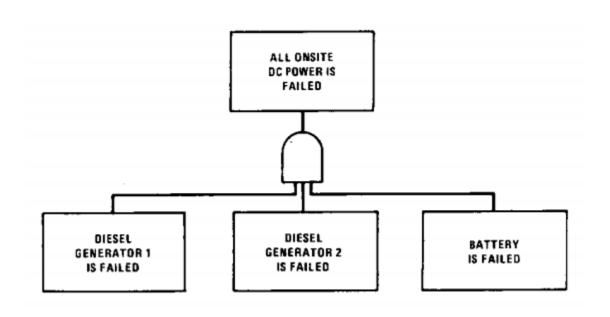
Bottom-Up Search



Top-Down Search



Top-Down Example



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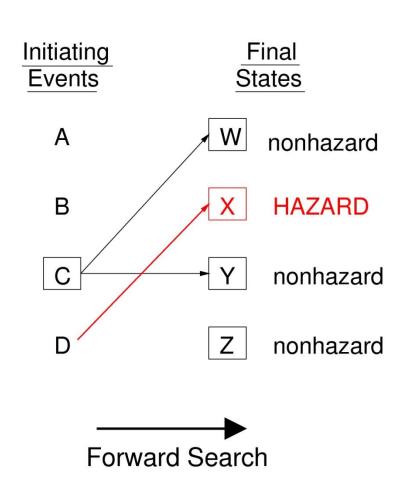
Traditional Qualitative Methods

FMEA (Failure Modes and Effects Analysis)

FMEA: Failure Modes and Effects Analysis

1949: MIL-P-1629

- Forward search technique
 - Initiating event:component failure
 - Goal: identify effect of each failure



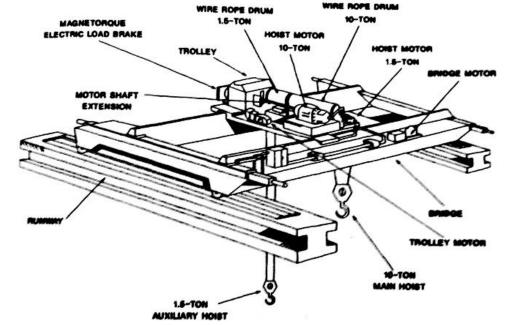
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General FMEA Process

- 1. Identify individual components
- 2. Identify failure modes
- 3. Identify failure mechanisms (causes)
- 4. Identify failure effects

FMEA worksheet

Example: Bridge crane system

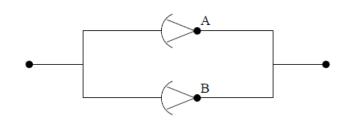


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Failure Mode and Effect Analysis System:____ Facility:____ Program:_____ Engineer:____ Date: Sheet: **Failure Mechanisms** Failure effects **Failure Modes Failure effects Component Name** (local) (system) Load held Main hoist motor Inoperative, Defective bearings Main hoist cannot be raised. Brake does not move stationary, cannot Motor brushes worn will hold hoist be raised or lowered. stationary Broken springs

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FMECA: A Forward Search Technique



Failure			0/ 6-11	Effects	
Component	probability	Failure mode	% failures by mode	Critical	Noncritical
A	1x10 ⁻³	Open Short Other	90 5 5	5x10 ⁻⁵ 5x10 ⁻⁵	х
В	1x10 ⁻³	Open Short Other	90 5 5	5x10 ⁻⁵ 5x10 ⁻⁵	X

Based on prior experience with this type of amplifier, we estimate that 90% of amplifier failures can be attributed to the "open" mode, 5% of them to the "short" mode, and the balance of 5% to the "other" modes. We know that whenever either amplifier fails shorted, the system fails so we put X's in the "Critical" column for these modes; "Critical" thus means that the single failure causes system failure. On the other hand, when either amplifier fails open, there is no effect on the system from the single failure because of the parallel configuration. What is the criticality of the other 28 failure modes? In this example we have been conservative and we are considering them all as critical, i.e., the occurrence of any one causes system failure. The numbers shown in the Critical column are obtained from multiplying the appropriate percentage in Column 4 by 10^{-3} from Column 2.

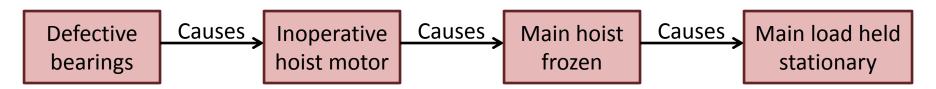
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FMEA uses an accident model

FMEA method:

Failure Mode and Effect Analysis				
Program:Engineer:	·			•
Component Name	Failure Modes	Failure Mechanisms	Failure effects (local)	Failure effects (system)
Main Hoist Motor	Inoperative, does not move	Defective bearings Loss of power	Main hoist cannot be raised. Brake will hold hoist stationary	Load held stationary, cannot be raised or lowered.
		Broken springs		

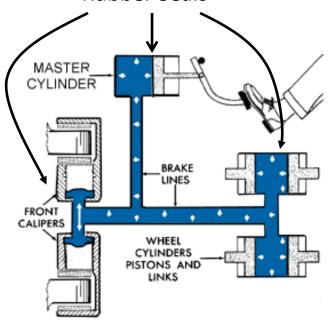
Accident model: Chain-of-events



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FMEA Exercise

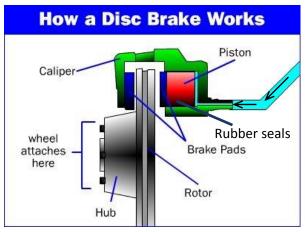
Automotive brakes



Rubber Seals



- Brake pedal
- Brake lines
- Rubber seals
- Master cylinder
- Brake pads

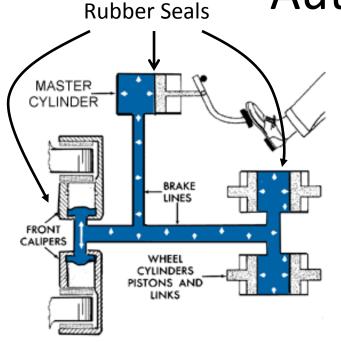


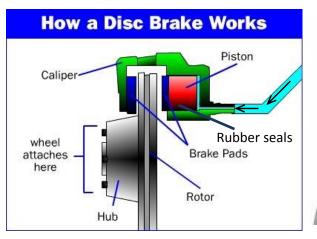


FMEA worksheet columns

- Component
- Failure mode
- Failure mechanism
- Failure effect (local)
- Failure effect (system)

FMEA Exercise Automotive brakes







System components

FMEA worksheet columns

Brake pedal

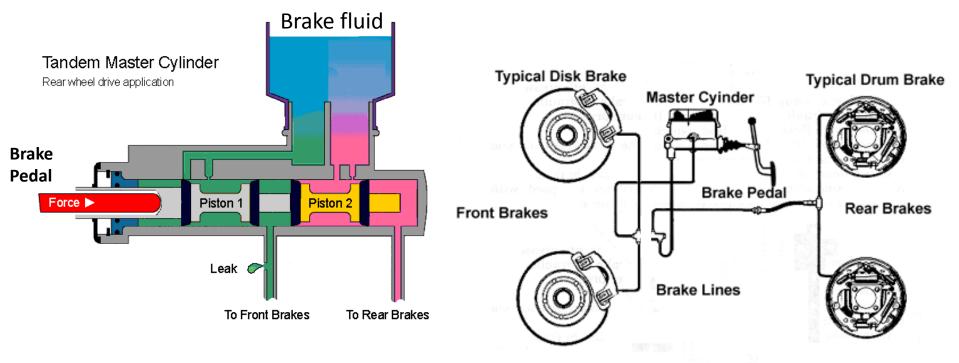
Component

How would you make this system safe?

Brake pads

Failure effect (system)

Actual automotive brakes



Typical Automotive Braking System

- FMEA heavily used in mechanical engineering
- Tends to promote redundancy
- Useful for physical/mechanical systems to identify single points of failure

A real accident: Toyota's unintended acceleration

• 2004-2009

- 102 incidents of stuck accelerators
- Speeds exceed 100 mph despite stomping on the brake
- 30 crashes
- 20 injuries

• 2009, Aug:

- Car accelerates to 120 mph
- Passenger calls 911, reports stuck accelerator
- Some witnesses report red glow / fire behind wheels
- Car crashes killing 4 people

• 2010, Jul:

Investigated over 2,000 cases of unintended acceleration

Captured by FMEA?



Failure discussion

Component Failure

Vs.

Design problem

Vs.

Requirements problem

FMEA Limitations

- Component failure incidents only
 - Unsafe interactions? Design issues? Requirements issues?
- Single component failures only
 - Multiple failure combinations not considered
- Requires detailed system design
 - Limits how early analysis can be applied
- Works best on hardware/mechanical components
 - <u>Human</u> operators? (Driver? Pilot?)
 - Software failure?
 - Organizational factors (management pressure? culture?)
- Inefficient, analyzes unimportant + important failures
 - Can result in 1,000s of pages of worksheets
- Tends to encourage redundancy
 - Often leads to inefficient solutions
- Failure modes must already be known
 - Best for standard parts with few and well-known failure modes

Safety vs. Reliability

- Common assumption:Safety = reliability
- How to improve safety?
 - Make everything more reliable!
- Making car brakes safe
 - Make every component reliable
 - Include redundant components

Parking Brake Cables

Power Booster

Master Cylinder ABS (Speed) Sensor Caliper Assembly

ABS System Wiring

Rotor

ABS Hydraulic Fluid Lines/Hoses

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Is this a good assumption?

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Safety vs. reliability

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A simpler example



Safe or unsafe?

Safety is not a component property

- Safety is an emergent property of the system
 - Depends on context and environment!

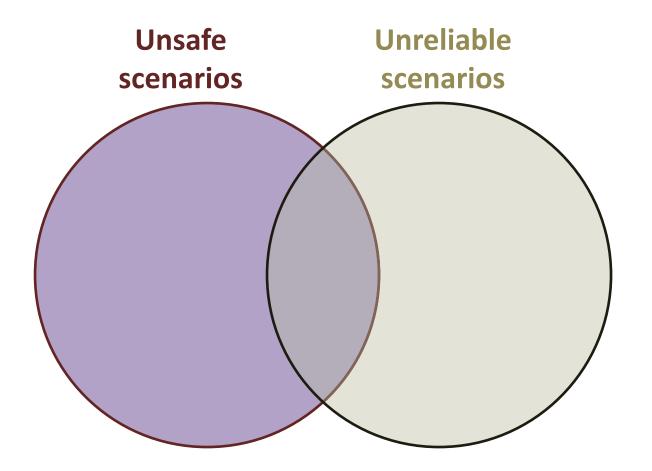




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Individual components are not inherently safe or unsafe

Safety vs. Reliability



Safe ≠ Reliable

- Safety often means making sure X never happens
- Reliability usually means making sure Y always happens

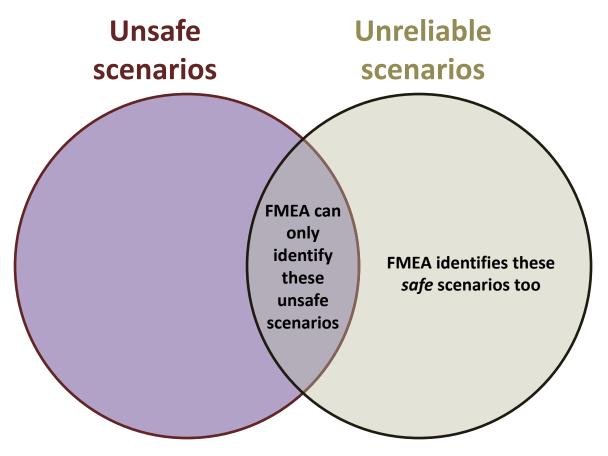
	Safe	Unsafe
Reliable	•Typical commercial flight	
Unreliable		Aircraft engine fails in flight

Safe ≠ Reliable

- Safety often means making sure X never happens
- Reliability usually means making sure Y always happens

	Safe	Unsafe
Reliable	•Typical commercial flight	 Computer reliably executes unsafe commands Increasing tank burst pressure A nail gun without safety lockout
Unreliable	Aircraft engine won't start on groundMissile won't fire	•Aircraft engine fails in flight

Safety vs. Reliability



- FMEA is a reliability technique
 - Explains the inefficiency
- FMEA sometimes used to identify unsafe outcomes

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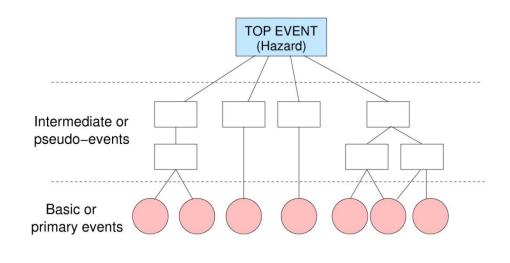
Failure Modes, Mechanisms, Effects

 Examples and definitions of "Failure modes, mechanisms, effects"

FTA Fault Tree Analysis

FTA: Fault Tree Analysis

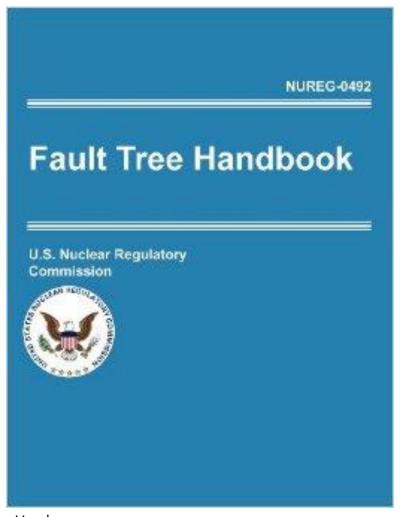
- 1961: Bell labs analysis of Minuteman missile system
- Today one of the most popular hazard analysis techniques
- Top-down search method
 - Top event: undesirable event
 - Goal is to identify causes of hazardous event



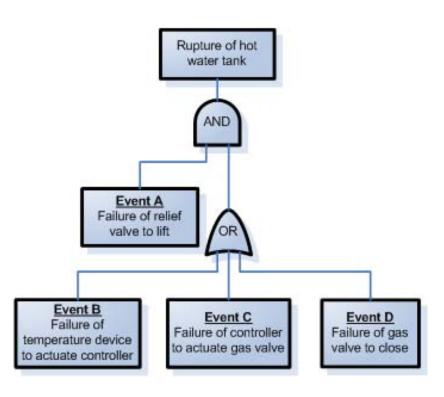
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FTA Process

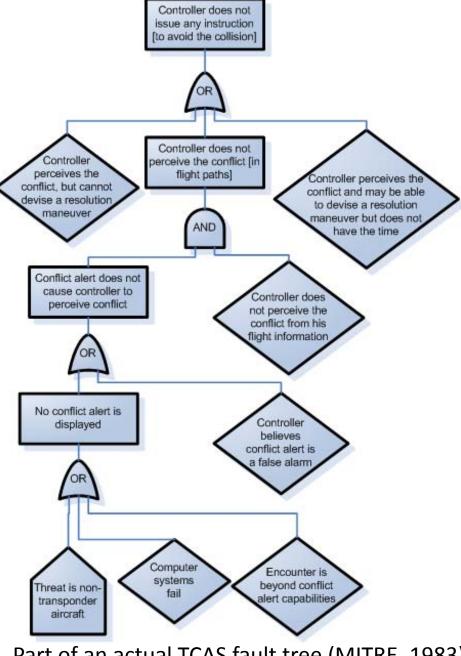
- 1. Definitions
 - Define top event
 - Define initial state/conditions
- 2. Fault tree construction
- 3. Identify *cut-sets* and *minimal cut-sets*



Fault tree example



Example from original 1961 Bell Labs study



Part of an actual TCAS fault tree (MITRE, 1983)

Fault tree symbols

BASIC EVENT - A basic initiating fault requiring no further development CONDITIONING EVENT - Specific conditions or restrictions that apply to any logic gate fused primarily with PRIORITY AND an INHIBIT gates) UNDEVELOPED EVENT - An event which is not further developed either because it is of insufficient consequence or because information is unavailable EXTERNAL EVENT - An event which is normally expected to occur INTERMEDIATE EVENT SYMBOLS INTERMEDIATE EVENT - A fault event that occurs because of one or more antecedent causes acting through logic gates

GATE SYMBOLS

AND - Output fault occurs if all of the input faults occur

OR - Output fault occurs if at least one of the input faults occurs

EXCLUSIVE OR — Output fault occurs if exactly one of the input faults occurs

PRIORITY AND — Output fault occurs if all of the input faults occur in a specific sequence (the sequence is represented by a CONDITIONING EVENT drawn to the right of the gate)

INHIBIT — Output fault occurs if the (single) input fault occurs in the presence of an enabling condition (the enabling condition is represented by a CONDITIONING EVENT drawn to the right of the oate)

TRANSFER SYMBOLS

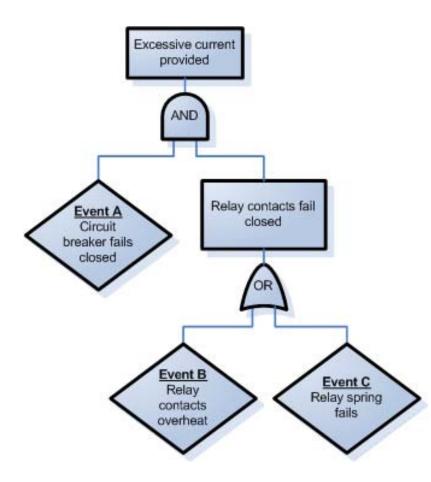
TRANSFER IN — Indicates that the tree is developed further at the occurrence of the corresponding TRANSFER OUT (e.g., on another page)

TRANSFER OUT - Indicates that this portion of the tree must be attached at the corresponding TRANSFER IN

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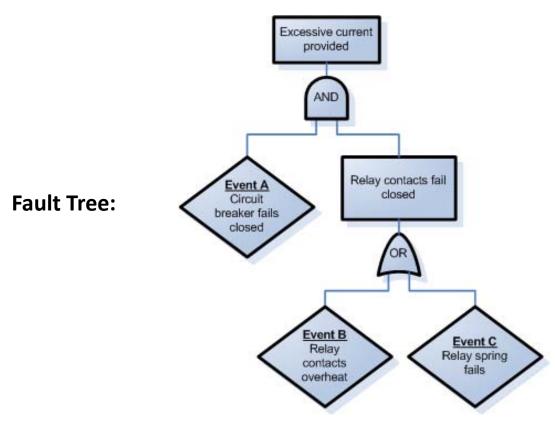
Fault Tree cut-sets

- <u>Cut-set</u>: combination of basic events (leaf nodes) sufficient to cause the toplevel event
 - Ex: (A and B and C)
- Minimum cut-set: a cut-set that does not contain another cut-set
 - Ex: (A and B)
 - Ex: (A and C)



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FTA uses an accident model



Accident model: Chain-of-failure-events



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Thrust reversers

- 1991 Accident
- B767 in Thailand
- Lauda Air Flight 004
 - Thrust reversers deployed in flight, caused in-flight breakup and killing all 223 people. Deadliest aviation accident involving B767
 - Simulator flights at Gatwick Airport which appeared to show that deployment of a thrust reverser was a survivable incident.
 - Boeing had insisted that a deployment was not possible in flight. In 1982 Boeing established a test where the aircraft was slowed to 250 knots, and the test pilots then used the thrust reverser. The control of the aircraft had not been jeopardized. The FAA accepted the results of the test.
 - Recovery from the loss of lift from the reverser deployment "was uncontrollable for an unexpecting flight crew". The incident led Boeing to modify the thrust reverser system to prevent similar occurrences by adding sync-locks, which prevent the thrust reversers from deploying when the main landing gear truck tilt angle is not at the ground position.



FTA example

- Aircraft reverse thrust
 - Engines
 - Engine reverse thrust panels
 - Computer
 - Open reverse thrust panels after touchdown
 - Fault handling: use 2/3 voting. (Open reverse thrust panels if 2/3 wheel weight sensors AND 2/3 wheel speed sensors indicate landing)
 - Wheel weight sensors (x3)
 - Wheel speed sensors (x3)



Create a fault tree for the top-level event: Reverse thrusters don't operate on landing.

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Warsaw

- Warsaw
- Crosswind landing (one wheel first)
- Wheels hydroplaned
- Thrust reverser would not deploy
 - Pilots could not override and manually deploy
- Thrust reverser logic
 - Must be 6.3 tons on each main landing gear strut
 - Wheel must be spinning at least 72 knots



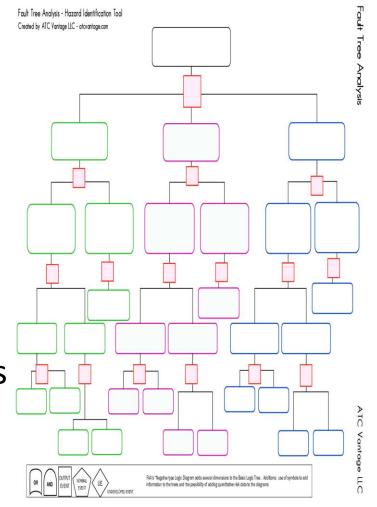
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FTA Strengths

- Captures combinations of failures
- More efficient than FMEA
 - Analyzes only failures relevant to top-level event
- Provides graphical format to help in understanding the system and the analysis
- Analyst has to think about the system in great detail during tree construction
- Finding minimum cut sets provides insight into weak points of complex systems

FTA Limitations

- Independence between events is often assumed
- Common-cause failures not always obvious
- Difficult to capture nondiscrete events
 - E.g. rate-dependent events,
 continuous variable changes
- Doesn't easily capture systemic factors



FTA Limitations (cont)

- Difficult to capture delays and other temporal factors
- Transitions between states or operational phases not represented
- Can be labor intensive
 - In some cases, over 2,500 pages of fault trees
- Can become very complex very quickly, can be difficult to review

Controller does not Fault tree example issue any instruction [to avoid the collision] Rupture of hot Controller does not water tank Controller perceive the conflict (in perceives the flight paths] Controller perceives the conflict, but cannot conflict and may be able devise a resolution to devise a resolution maneuver maneuver but does not AND have the time Conflict alert does not cause controller to Gas valve stays open Controller does Event A perceive conflict not perceive the Failure of relief conflict from his OR valve to lift flight information Missing: Conflict alert Event B No conflict alert is Event C Event D displayed, but Controller Failure of displayed Failure of controller Failure of gas never observed believes temperature device to actuate gas valve valve to close conflict alert is by controller to actuate controller a false alarm

Example from original 1961 Bell Labs study

Part of an actual TCAS fault tree (MITRE, 1983)

Encounter is

beyond conflict

alert capabilities

Computer

systems

Threat is non-

transponder

Vesely FTA Handbook

Considered by many to be the textbook definition of fault trees

Failure-based methods

- Tend to treat safety as a component property
- Use divide-and-conquer strategies
- Reductionism

Reasonable?

Toyota to pay \$1.2B settlement in vehicle acceleration lawsuit

By Bob Fredericks and Post Wires

March 19, 2014 | 9:19am



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Toyota Unintended Acceleration

• 2004-2009: 102 incidents



Toyota Unintended Acceleration

- 2004: Push-button ignition
- 2004-2009
 - 102 incidents of uncontrolled acceleration
 - Speeds exceed 100 mph despite stomping on the brake
 - 30 crashes
 - 20 injuries

Today

Software fixes for pushbutton ignition, pedals



Pushbutton was reliable! Software was reliable!

Toyota

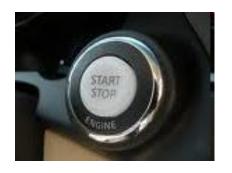
- 2004: Push-button ignition
- 2004-2009
 - 102 incidents of uncontrolled acceleration
 - Speeds exceed 100 mph despite stomping on the brake
 - 30 crashes
 - 20 injuries

• 2009, Aug:

- Car accelerates to 120 mph
- Passenger calls 911, reports stuck accelerator
- Car crashes killing 4 people
- Driver was offensive driving instructor for police

Today

Software fixes for pushbutton ignition, pedals





All component requirements were met...
Yet system behavior was unexpected, unsafe!

Systems-Theoretic Approaches

- Focus of next class
- Need to identify and prevent failures, but also:
 - Go beyond the failures
 - Why weren't the failures detected and mitigated?
 - By operators
 - By engineers
 - Prevent issues that don't involve failures
 - Human-computer interaction issues
 - Software-induced operator error
 - Etc.

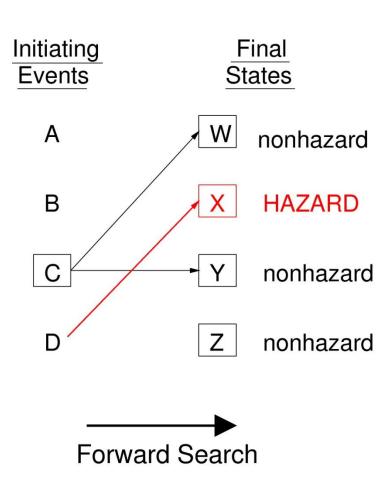
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Event Tree Analysis

Event Tree Analysis

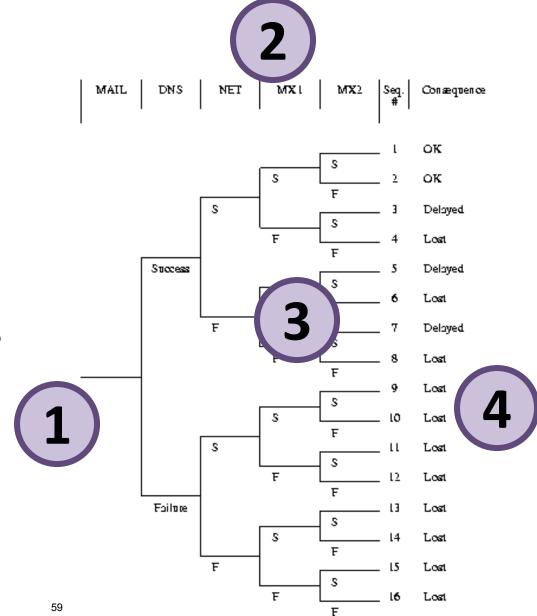
1967: Nuclear power stations

- Forward search technique
 - Initiating event: component failure (e.g. pipe rupture)
 - Goal: Identify all possible outcomes

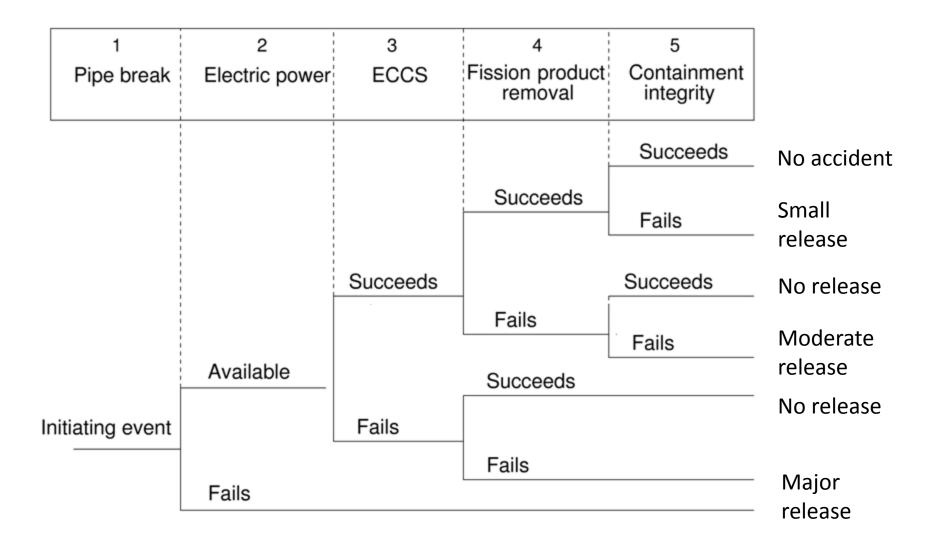


Event Tree Analysis: Process

- Identify initiating event
- 2. Identify barriers
- 3. Create tree
- 4. Identify outcomes



Event Tree Example



Event Trees vs.

Fault Trees

Opens Opens Opens Pressure decreases Pressure decreases Pressure decreases

Explosion

Fails

Explosion

Event Tree

- Shows what failed, but not how.
- Shows order of events

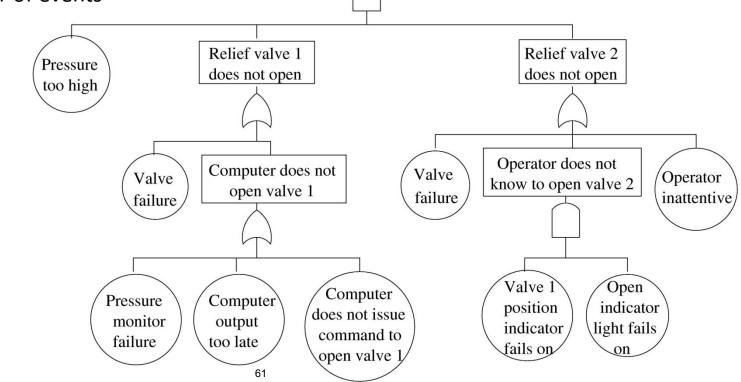
Fault Tree

- Complex, but shows how failure occurred

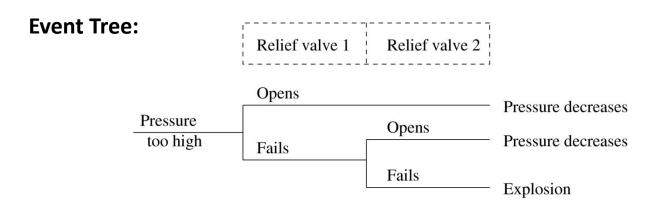
Pressure

too high

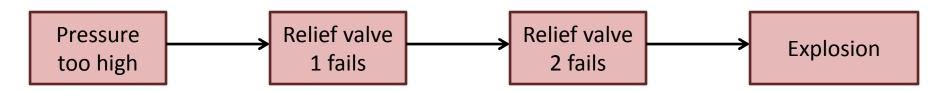
- Does not show order of events



ETA uses an accident model



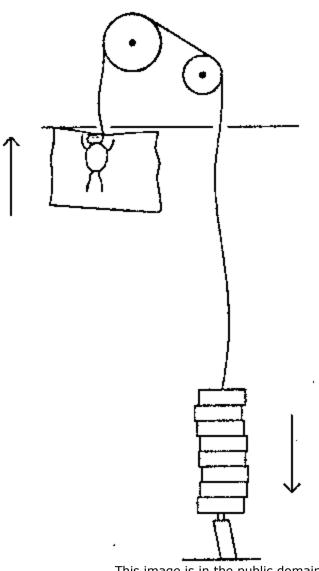
Accident model: Chain-of-events



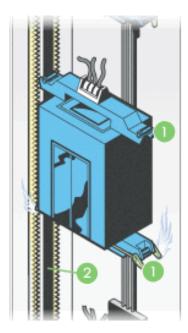
Event Tree Analysis: Exercise

Elevator

- 1. Identify initiating event
 - Cable breaks
- 2. List Barriers
- 3. Create Tree
- 4. Identify outcomes



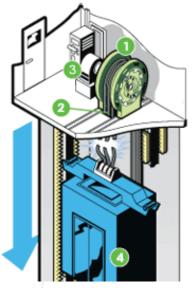
Event Tree Analysis: Exercise

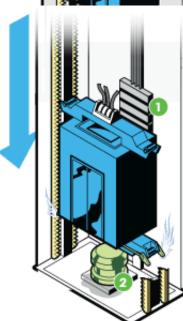


- If the cables snap, the elevator's safeties would kick in. Safeties are braking systems on the elevator.
- 2 Some safeties clamp the steel rails running up and down the elevator shaft, while others drive a wedge into the notches in the rails.



What are the barriers?





- Steel cables bolted to the the car loop over a sheave.
- 2 The sheave's grooves grip the steel cables.
- The electric motor rotates the sheave, causing the cables to move, too.
- As the cables move, the car is lifted.
- The cables that lift the car are also connected to a counterweight, which hangs down on the other side of the sheave.
- 2 The built-in shock absorber at the bottom of the shaft - typically a piston in an oil-filled cylinder - helps cushion the imact in the event of snapping cables.

Event Tree Analysis: Strengths

- Handles ordering of events better than fault trees
- Most practical when events can be ordered in time (chronology of events is stable)
- Most practical when events are independent of each other.
- Designed for use with protection systems (barriers)

Event Tree Analysis: Limitations

- Not practical when chronology of events is not stable (e.g. when order of columns may change)
- Difficult to analyze non-protection systems
- Can become exceedingly complex and require simplification
- Separate trees required for each initiating event
 - Difficult to represent interactions among events
 - Difficult to consider effects of multiple initiating events

Event Tree Analysis: Limitations (cont)

- Can be difficult to define functions across top of event tree and their order
- Requires ability to define set of initiating events that will produce all important accident sequences
- Most applicable to systems where:
 - All risk is associated with one hazard
 - (e.g. overheating of fuel)
 - Designs are fairly standard, very little change over time
 - Large reliance on protection and shutdown systems

HAZOP Hazard and Operability Analysis

HAZOP: Hazards and Operability Analysis

- Developed by Imperial Chemical Industries in early 1960s
- Not only for safety, but efficient operations

An image of a chemical plant is removed due to copyright restrictions.

Accident model:

 Chain of failure events (that involve deviations from design/operating intentions)

HAZOP

- Guidewords applied to variables of interest
 - E.g. flow, temperature, pressure, tank levels, etc.

Image removed due to copyright restrictions.

- Team considers potential causes and effects
 - Questions generated from guidewords
 - Could there be no flow?
 - If so, how?
 - How will operators know there is no flow?
 - Are consequences hazardous or cause inefficiency?

HAZOP: Generate the right questions, not just fill in a tree

HAZOP Process

Guidewords	Meaning
NO, NOT, NONE	The intended result is not achieved, but nothing else happens (such as no forward flow when there should be)
MORE	More of any relevant property than there should be (such as higher pressure, higher temperature, higher flow, or higher viscosity)
LESS	Less of a relevant physical property than there should be
AS WELL AS	An activity occurs in addition to what was intended, or more components are present in the system than there should be (such as extra vapors or solids or impurities, including air, water, acids, corrosive products)
PART OF	Only some of the design intentions are achieved (such as only one of two components in a mixture)
REVERSE	The logical opposite of what was intended occurs (such as backflow instead of forward flow)
OTHER THAN	No part of the intended result is achieved, and something completely different happens (such as the flow of the wrong material)

Figure removed due to copyright restrictions. See: Leveson, Nancy. *GUZYk UfY. GmghYa GUZYhmUbX 7ca di hYfg*. Addison-Wesley Professional, 1995. pp. 337.

HAZOP Strengths

- Easy to apply
 - A simple method that can uncover complex accidents
- Applicable to new designs and new design features
- Performed by diverse study team, facilitator
 - Method defines team composition, roles
 - Encourages cross-fertilization of different disciplines

HAZOP Limitations

- Requires detailed plant information
 - Flowsheets, piping and instrumentation diagrams, plant layout, etc.
 - Tends to result in protective devices rather than real design changes
- Developed/intended for chemical industry
- Labor-intensive
 - Significant time and effort due to search pattern
- Relies very heavily on judgment of engineers
- May leave out hazards caused by stable factors
- Unusual to consider deviations for systemic factors
 - E.g. organizational, managerial factors, management systems, etc.
- Difficult to apply to software
- Human behavior reduces to compliance/deviation from procedures
 - Ignores why it made sense to do the wrong thing

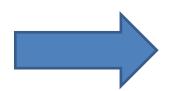
Summary

- Well-established methods
- Time-tested, work well for the problems they were designed to solve
- Strengths include
 - Ease of use
 - Graphical representation
 - Ability to analyze many failures and failure combinations
 - Application to well-understood mechanical or physical systems
- Limitations include
 - Inability to consider accidents without failures
 - Difficulty incorporating systemic factors like managerial pressures, complex human behavior, and design/requirements flaws
- Other methods may be better suited to deal with the challenges introduced with complex systems

Quantitative Hazard Analysis

Agenda

- Traditional hazard analysis
- Qualitative techniques
 - Failure Modes and Effects Analysis
 - Fault Tree Analysis
 - Event Tree Analysis
 - HAZOP
 - Quantitative techniques
 - FMECA
 - Quant. Fault Tree Analysis
 - Quant. ETA



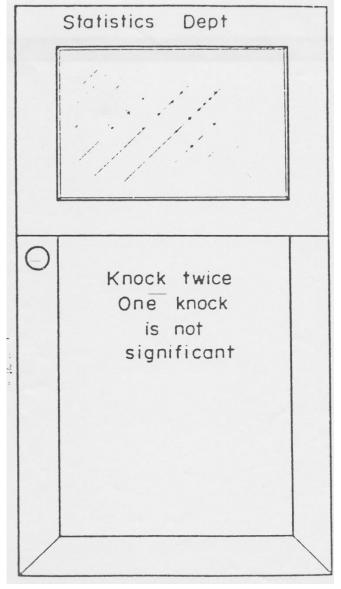
Quantitative analysis

- How do you include numbers and math?
 - What do you quantify?
- Tends to focus on two parameters
 - Severity
 - Probability

Quantitative methods

- The quantification is usually based on probability theory and statistics
- Common assumptions
 - Behavior is random
 - Each behavior independent

Good assumptions?



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Quantitative methods

- The quantification is usually based on probability theory and statistics
- Common assumptions
 - Behavior is random
 - Each behavior independent
 - Identical distributions / EV

Good assumptions?

- -Hardware?
- -Humans?
- -Software?

An image of a pinball table removed due to copyright restrictions.

Risk

- Common idea:
 - Some combination of severity and likelihood

- How would you combine severity and likelihood mathematically?
 - Risk = f(Severity, Likelihood)
 - What is f?

Risk Matrix

Based on common quantification:

Risk = Severity * Likelihood



Severity

Risk Matrix

Based on common quantification:

Risk = Severity * Likelihood

Likelihood

Very Likely	Low Med	Medium	Med Hi	High	High	
Likely	Low	Low Med	Medium	Med Hi	High	
Possible	Low	Low Med	Medium	Med Hi	Med Hi	
Unlikely	Low	Low Med	Low Med	Medium	Med Hi	
Rare	Low	Low	Low Med	Medium	Medium	
	Negligible	Minor	Moderate	Significant	Severe	

Severity

Automotive Severity Levels

- Level 0: No injuries
- Level 1: Light to moderate injuries
- Level 2: Severe to life-threatening injuries (survival probable)
- Level 3: Life-threatening to fatal injuries (survival uncertain)

Aviation Severity Levels

- Level 1: Catastrophic
 - Failure may cause crash.
 - Failure conditions prevent continued safe flight and landing
- Level 2: Severe
 - Failure has negative impact on safety, may cause serious or fatal injuries
 - Large reduction in functional capabilities
- Level 3: Major
 - Failure is significant, but less impact than severe
 - Significant reduction in functional capabilities
- Level 4: Minor
 - Failure is noticeable, but less impact than Major
 - Slight reduction in safety margins; more workload or inconvenience
- Level 5: No effect on safety

Risk Matrix

Based on common quantification:

Risk = Severity * Likelihood

Aviation Severity Levels

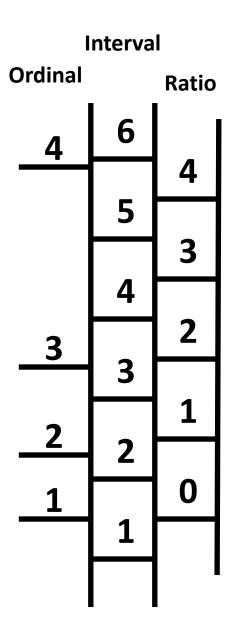
- Level 1: Catastrophic
- Level 2: Severe
- Level 3: Major
- Level 4: Minor
- Level 5: No effect on safety

How to quantify?

Numerical Scales

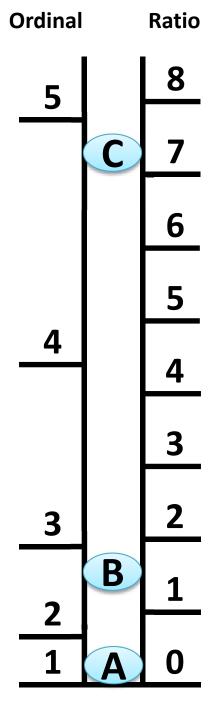
- Severity is usually ordinal
 - Only guarantees ordering along increasing severity
 - Distance between levels not comparable
- Ordinal multiplication can result in reversals
 - Multiplication assumes equal distance
 - ...and fixed 0
 - Assumes severity 4 is 2x worse than severity 2
 - A "Med Hi" result may actually be worse than "High"

Another challenge



- Event A
 - Likelihood = 20%
- Event B
 - Likelihood = 10%
- Event C
 - Likelihood = 3%

Calculate risk



Ordinal Ratio

Using Ordinal Scale:

Event A

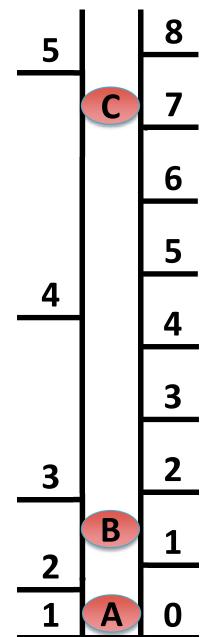
- Likelihood = 20%
- Risk = 0.20

- Severity = 1
- Event B
 - Likelihood = 10%
- Risk = 0.20

- Severity = 2
- Event C
 - Likelihood = 3%

Risk = 0.12

- Severity = 4



Ordinal Ratio



Event A

- Likelihood = 20%
- Risk = 0.00

- Severity = 0

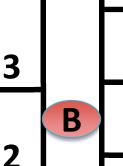
Using Ratio Scale:

- Event B
 - Likelihood = 10%
- Risk = 0.10

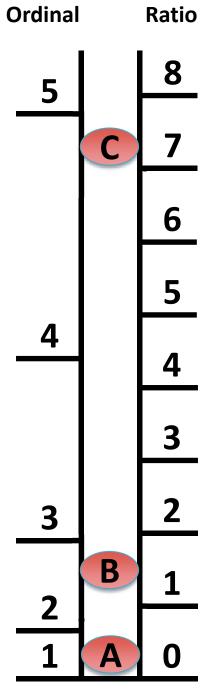
- Severity = 1
- Event C
 - Likelihood = 3%

Risk = 0.21

- Severity = 7



	Risk (using ordinal scale)	Risk (using ratio scale)
Event A	0.20	0.00
Event B	0.20	0.10
Event C	0.12	0.21



Risk Matrix

Based on common idea:
 Risk = Severity * Likelihood

Uses expected values (averages)

Likelihood

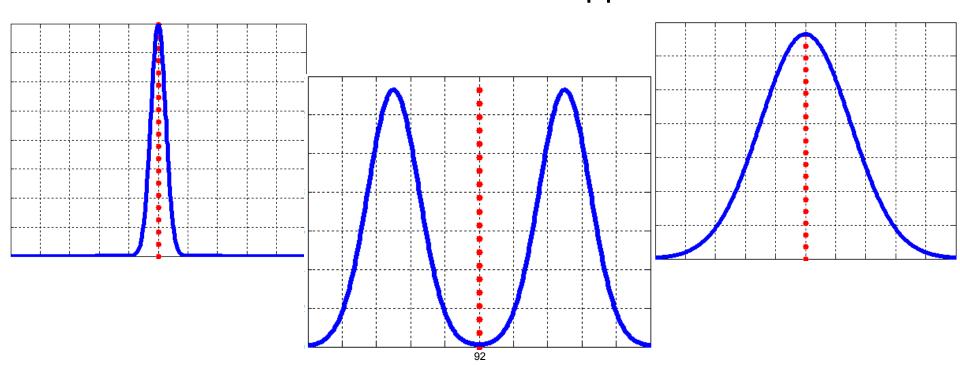
Very Likely	Low Med	Medium	Med Hi	High	High	
Likely	Low	Low Med	Medium	Med Hi	High	
Possible	Low	Low Med	Medium	Med Hi	Med Hi	
Unlikely	Low	Low Med	Low Med	Medium	Med Hi	
Rare	Low	Low	Low Med	Medium	Medium	
	Negligible	Minor	Moderate	Significant	Severe	

Severity

Expected Value Fallacy

P-value Fallacy
Flaw of Averages
Jensen's Law
Simpson's paradox

- Beware when averages are used to simplify the problem!
 - Can make adverse decisions appear correct



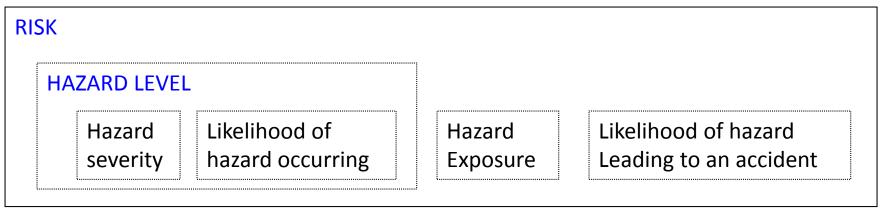
Another Example Hazard Level Matrix

	A Frequent	B Probable	C Occasional	D Remote	E Improbab	F e Imp	ssible
Catastrophic I	Design action required to eliminate or control hazard	Design action required to eliminate or control hazard	Design action required to eliminate or control hazard	Hazard must be controlled or hazard probability reduced 4		9	12
Critical II	Design action required to eliminate or control hazard 3	Design action required to eliminate or control hazard 4	Hazard must be controlled or hazard probability reduced 6	Hazard control desirable if cost effective	Assume will not occur	Assess to decide the equation	sible rence 12
Marginal III	Design action required to eliminate or control hazard 5	Hazard must be controlled or hazard probability reduced 6	Hazard control desirable if cost effective	Normally not cost effective	1:	2	12
Negligible IV	√ 10	Ne(gligible hazard - 12	12	1	2	12

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Hazard Level: A combination of severity (worst potential damage in case of an accident) and likelihood of occurrence of the hazard.

Risk: The hazard level combined with the likelihood of the hazard leading to an accident plus exposure (or duration) of the hazard.



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Safety: Freedom from accidents or losses.

Hazard Level Assessment

- Combination of Severity and Likelihood
- Difficult for complex, human/computer controlled systems
- Challenging to determine likelihood for these systems
 - Software behaves exactly the same way every time
 - Not random
 - Humans adapt, and can change behavior over time
 - · Adaptation is not random
 - · Different humans behave differently
 - Not I.I.D (independent and identically distributed)
 - Modern systems almost always involve new designs and new technology
 - Historical data may be irrelevant
- Severity is usually adequate to determine effort to spend on eliminating or mitigating hazard.

Hazard Level or Risk Level:

High

Med Hi

Medium

Low Med

Low

FMECA Failure Modes Effects and Criticality Analysis

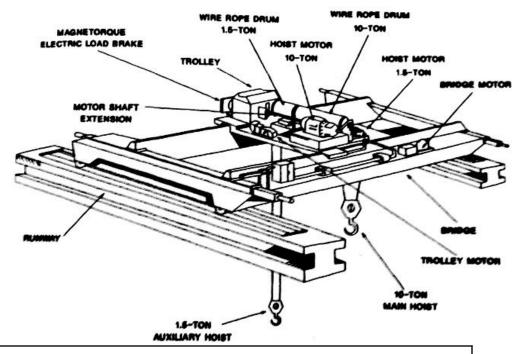
FMECA

Same as FMEA, but with "criticality" information

- Criticality
 - Can be ordinal severity values
 - Can be likelihood probabilities
 - An expression of concern over the effects of failure in the system*

FMEA worksheet

Bridge crane system



cannot be

raised or

lowered.

dissatisfied

Failure Mode and Effect Analysis

Program: System: Engineer: Date:		Facility Sheet:_			
Component Name	Failure Modes	Failure Mechanisms	Failure effects (local)	Failure effects (system)	Criticality Level
Main hoist motor	Inoperative, does not move	Defective bearings	Main hoist cannot be	Load held stationary,	(5) High, customers

raised. Brake

stationary

will hold hoist

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Loss of power

Broken springs

Severity Level Examples

Rating	Meaning
1	No effect
2	Very minor (only noticed by discriminating customers)
3	Minor (affects very little of the system, noticed by average customer)
4	Moderate (most customers are annoyed)
5	High (causes a loss of primary function; customers are dissatisfied)
6	Very high and hazardous (product becomes inoperative; customers angered; the failure may result unsafe operation and possible injury)

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Severity Level Examples

Rating	Severity of Effect
10	Safety issue and/or non-compliance with government regulation without warning.
9	Safety issue and/or non-compliance with government regulation with warning.
8	Loss of primary function.
7	Reduction of primary function.
6	Loss of comfort/convenience function.
5	Reduction of comfort/convenience function.
4	Returnable appearance and/or noise issue noticed by most customers.
3	Non-returnable appearance and/or noise issue noticed by customers.
2	Non-returnable appearance and/or noise issue rarely noticed by customers.
1	No discernable effect.

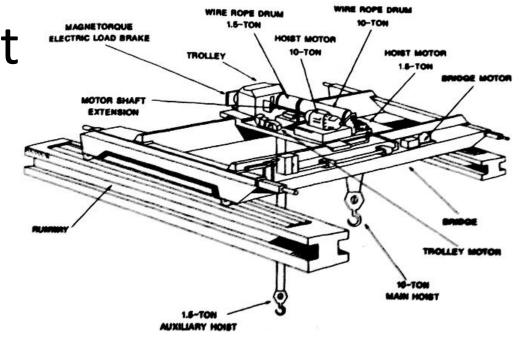
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^{*}http://www.harpcosystems.com/Design-FMEA-Ratings-Partl.htm

FMECA worksheet

Bridge crane system

Could also specify likelihood



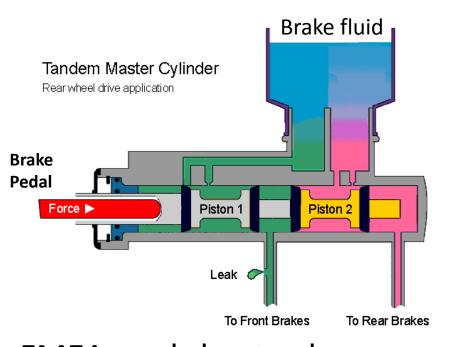
Failure Mode and Effect Analysis

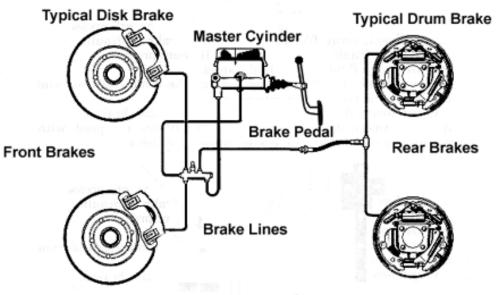
Program:	System:	Facility:
Engineer:	Date:	Sheet:

Component Name	Failure Modes	Failure Mechanisms	Failure effects (local)	Failure effects (system)	Probability of occurrence
Main hoist motor	Inoperative, does not move	Defective bearings Loss of power	Main hoist cannot be raised. Brake will hold hoist	Load held stationary, cannot be raised or	0.001 per operational hour
		Broken springs	stationary	lowered.	

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FMECA Exercise: Actual automotive brakes





Typical Automotive Braking System

FMEA worksheet columns

- Component
- Failure mode
- Failure mechanism
- Failure effect (local)
- Failure effect (system)
- Criticality (Severity)

Severity Levels

- No effect
- Minor, not noticed by average customer
- 3. Major, loss of primary function
- 4. Catastrophic, injury/death

Quantitative ETA

Quantitative Event Tree Analysis

он	Barrier 1a	Barrier 1b	Barrier 1c	Barrier 1d	Barrier 2	Barrier 3	OE Sev.	Effects	Pe
	0.993116 A						5	No safety effect	
ОН 2U-7		0.987384 B					4	Loss of separation 5 < x < 10 NM	6.80E-03 X & B
	6.88E-03 X		0.992699 C				3	Significant Reduction in separation 1 < x < 5 NM	8.62E-05 X&C&C
		1.26E-02 Y		0.93577236 D	0.90 E	0.80 F	2	Large reduction in safety margins x < 1 NM	6.21E-07 X&Y&Z& (D OR E OR F)
			7.30E-03 Z						
				5.36E-02 V	0.10 W	0.20 S	1	Near mid-air collision/ Collision	6.80E-10 X&Y&Z& V&W&S

- Quantify p(success) for each barrier
- Limitations
 - P(success) may not be random
 - May not be independent
 - May depend on order of events and context
 - Ex: Fukushima

Fukushima Diesel Generators



Quantitative results are affected by the way barriers are chosen

Barrier 1a

- Initial conditions keep aircraft > 10NM apart
- P(success) = 0.99
- Barrier 1b
 - Initial conditions keep aircraft > 5NM apart
 - P(success) = 0.99
- Barrier 1c
 - Initial conditions keep aircraft > 1NM apart
 - P(success) = 0.99



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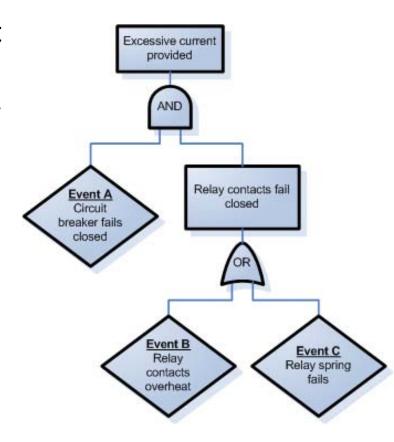
Barrier 2

- Flight crew detects traffic by means other than visual, avoid NMAC
- P(success) = 0.90
- Barrier 3
 - Flight crew detects traffic by visual acquisition, avoid NMAC
 - P(success) = 0.80

Quantitative FTA

Quantitative Fault Tree Analysis

- If we can assign probabilities to lowest boxes...
 - Can propagate up using probability theory
 - Can get overall total probability of hazard!
- AND gate
 - P(A and B) = P(A) * P(B)
- OR gate
 - P(A or B) = P(A) + P(B)

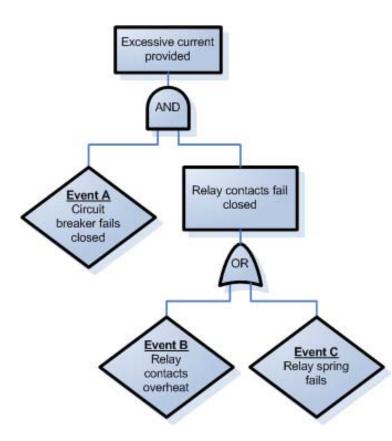


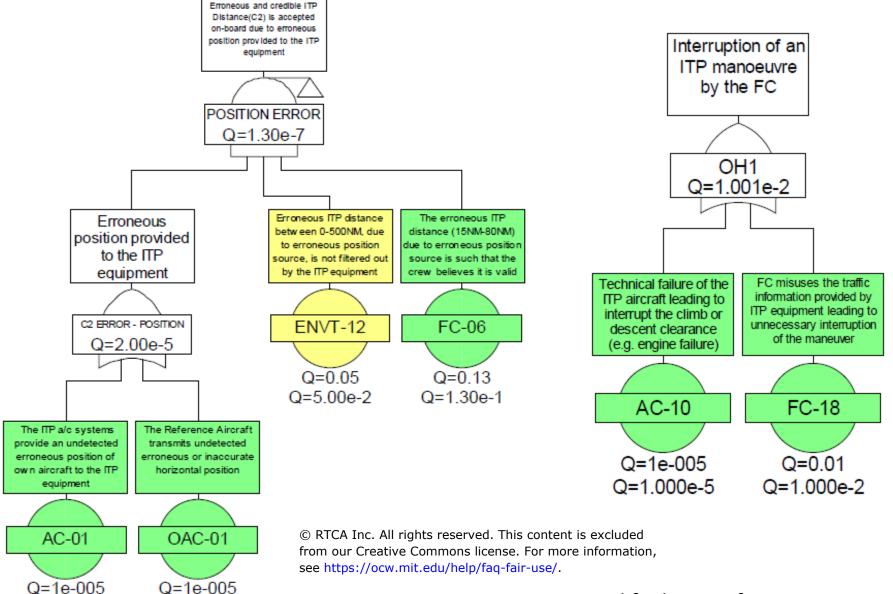
Any assumptions being made?

- If we can assign probabilities to lowest boxes...
 - Can propagate up using probability theory
 - Can get overall total probability of hazard!
- AND gate
 - P(A and B) = P(A) * P(B)
- OR gate
 - P(A or B) = P(A) + P(B)

Only if events A,B are independent!

- If we can assign probabilities to lowest boxes...
 - Can propagate up using probability theory
 - Can get overall total probability of hazard!
- AND gate
 - P(A and B) = P(A) * P(B)
- OR gate
 - P(A or B) = P(A) + P(B)
- Is independence a good assumption?
 - Hardware?
 - Software?
 - Humans?





Q = 1.00e - 5

Q = 1.00e - 5

- Where do the probabilities come from?
 - Historical data
 - Simulations
 - Expert judgment

Are there any issues using these sources?

Qualitative Frequency	Quantitative Probability
Very Often	1E-01
Often	1E-02
Rare	1E-03
Very Rare	Less than 1E-04

Table 3.1 Qualitative Frequency and Relation to Quantitative Probability for Basic Causes

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Risk Assessment and Preliminary Hazard Analysis (PHA)

Preliminary Hazard Analysis

PROGF	PROGRAM: DATE:										
ENGIN	EER:		_	PAGE:							
ITEM	HAZARD	CAUSE	EFFECTS	RAC	ASSESS-	RECOMM-					
	COND				MENTS	ENDATIONS					
Assigned number	List the nature of the condition	Describe what is causing the stated condition to exist	If allowed to go uncorrected, what will be the effect or effects of the hazardous condition	Hazard Level assign- ment	Probability, possibility of occurrence: -Likelihood -Exposure -Magnitude	Recommended actions to eliminate or control the hazard					

[Vincoli, 2005]

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Risk Assessment Matrix

	RISK ASSESSMENT MATRIX								
SEVERITY PROBABILITY	Catastrophic (1)	Critical (2)	Marginal (3)	Negligible (4)					
Frequent (A)	High	High	Serious	Medium					
Probable (B)	High	High	Serious	Medium					
Occasional (C)	High	Serious	Medium	Low					
Remote (D)	Serious	Medium	Medium	Low					
Improbable (E)	Medium	Medium	Medium	Low					
Eliminated (F)	Eliminated								

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[US DoD, 2012]

Hardware Example

"Hardware Failure"

Hazard	Hazard	Hazard	Causes	Signifi-	Likeli-	Assumed	Strength of	Outcome	Justification
ID	Name	Description		cance	hood	Mitigations	Mitigations	Risk	
TBO-	ADS-B	GBA does	Receiver	High	Low	Redundant	Medium	Medium	Strength of
0004	Ground	not receive	failure			equipment; SSR;			Mitigations
	System	ADS-B				Primary Radar;			depends on
	Comm	message				Overlapping			the type of
	Failure					ADS-B coverage;			backup;
						Multi-Lat; Design			Multi-lat
						and Equipment			should be
						Certification			used if
						Requirements			

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[JPDO, 2012]

Software Example

"Software Flaw"

Hazard	Hazard	Hazard	Causes	Signifi-	Likeli-	Assumed	Strength of	Outcome	Justification
ID	Name	Description		cance	hood	Mitigations	Mitigations	Risk	
TBO-	GBA fails	The software	Design flaw,	High	Med	Comprehensive	Low /	Med /	Anything that
0021	to recognize	lacks	coding			system testing	Medium	High	is complex
	dynamic	robustness in	error,			before			can lead to
	situation	its implemen-	insufficient			certification and			this situation
	and is	tation that	software			operational			
	unable to	leads to	testing,			approval. TCAS;			
	find a	inability to	software OS			See and avoid.			
	solution	find a	problem			Pilot could			
		solution				recognize in some			
						cases; Controller			
						could recognize in			
						some cases			

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[JPDO, 2012]

Human Error Example

"Human Error"

Hazard	Hazard	Hazard	Causes	Signifi-	Likeli-	Assumed	Strength of	Outcome	Justification
ID	Name	Description		cance	hood	Mitigations	Mitigations	Risk	
тво-	Incorrect	ANSP makes	Human error	Med	Med	Pilot will have to	High	Medium	Outcome risk
0045	change to	mistake				accept the			depends on
	4DT	during				change;			design of the
	manually	manual data				Conformance			system,
	entered into	load into				monitoring; GBA			human factors
	GBA	GBA when				tactical			issues will be
		negotiating a				separation; TCAS;			key.
		strategic				Quality of Data			
		change to				check;			
		the 4DT							

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[JPDO, 2012]

No.	Task	Hazard	Risk	Risk Reduction	Final Risk
1	Position 3 Tasks, Install ECS	Falling object crushing person or body part	Yellow	Investigate process improvements	Green
2	Test/Qualification Testing Passerby unauthorized entry	Person entering cell exposed to significant risks from robot, etc,	yellow	IML workstand gates to stop process when entered; Interlocked gates at Brand Scaffolding; access control, signage	Green
3		AGV/mobile equipment impacts person	Yellow	AGV control system, signage, crossing markings on pedestrian aisle,	Green
4		Exposure to impact, crushing, etc. when safety scanners are deactivated when OML's "leapfrog"		Establish safe procedure, use of spotters, hand guiding	Green
S	All Users normal operation	Exposure to movement of robots, motors and cylinders.	Red	Safety perimeter, category 4, that stops automation when violated; investigate use of Kuka.safesolutions, e-stop control, access control, procedures, training	Green
6		mechanical: Drill penetration of fuselage Operator exposes body part to drill penetration	Yellow	Only one operator in workspace, proper training	Green
7		AGV trapping person against immovable object or running someone over	Yellow	AGV safety system with scanners	Green
8		mechanical: Impact, pinching, crushing Exposure to impact, pinching, crushing by AGV, OML's, etc	yellow	AGV's equipped with safety Laser scanners with 360 degrees coverage, hand guiding, use of spotters, procedures	Green
9		ingress / egress : Exposure to being hit by robot performing maintenance Maintenance person exposed while working on machinery	Yellow	Lock out auto to enter, lock out other sources as required	
10		mechanical : Collision-impact two robots same side of barrier AGV impacts person	Yellow	AGV Safeguarding using SIGK area scanners 360 degree coverage to stop AGV if violated, people will be clear of cell(another line); walls (Anacortes) or 7light curtains? to stop motion if violated; Training and Amin procedures	Green

Example Risk Assessment: Manufacturing Robot

0	Task	Hazard	Risk	Risk Reduction	Final Risk
2	Site Acceptance Test/Qualification Testing Passerby unauthorized entry	Person entering cell exposed to significant risks from robot, etc,	Yellow	Access control, signage	Green
3	Robots Crossing Ped aisle in & out of replenishment cell	Mobile equipment impacts person	Yellow	AGV control system, signage, crossing markings on pedestrian aisle,	Green
4	Light Curtain Alternatives Analysis	Exposure to impact, crushing, etc. when safety scanners are deactivated when OML's "leapfrog"	Yellow	Establish safe procedure, use of spotters, hand guiding	Green
	Position 3 Tasks, Install ECS	Falling object crushing person or body part	Red	Investigate process improvements	Green

UH-60MU SAR Hazard Classification

UH-60MU SAR marginal hazards

- Loss of altitude indication in DVE
- Loss of heading indication in DVE
- Loss of airspeed indication in DVE
- Loss of aircraft health information
- Loss of external communications
- Loss of internal communications

UH-60MU SAR identifies various hazards as marginal that actually could lead to a catastrophic accident

STPA Unsafe Control Action

The Flight Crew does not provide collective control input necessary for level flight, resulting in controlled flight into terrain

Scenario 1: The Flight Crew has a flawed process model and believes they are providing sufficient control input to maintain level flight. This flawed process model could result from:

- a)The altitude indicator and attitude indicator are malfunctioning during IFR flight and the pilots are unable to maintain level flight
- b)The Flight Crew believes the aircraft is trimmed in level flight when it is not
- c)The Flight Crew has excessive workload due to other tasks and cannot control the aircraft
- d)The Flight Crew has degraded visual conditions and cannot perceive slow rates of descent that result in a continuous descent
- e)The Flight Crew does not perceive rising terrain and trims the aircraft for level flight that results in controlled flight into terrain

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Current State of the Art: PRA

- Risk and Risk Assessment
 - Little data validating PRA or methods for calculating it
 - Other problems
 - May be significant divergence between modeled system and as-built and as-operated system
 - Interactions between social and technical part of system may invalidate technical assumptions underlying analysis
 - Effectiveness of mitigation measures may change over time
 - Why are likelihood estimates inaccurate in practice?
 - Important factors left out (operator error, flawed decision making, software) because don't have probability estimates
 - Non-stochastic factors involved in events
 - Heuristic biases

Heuristic Biases

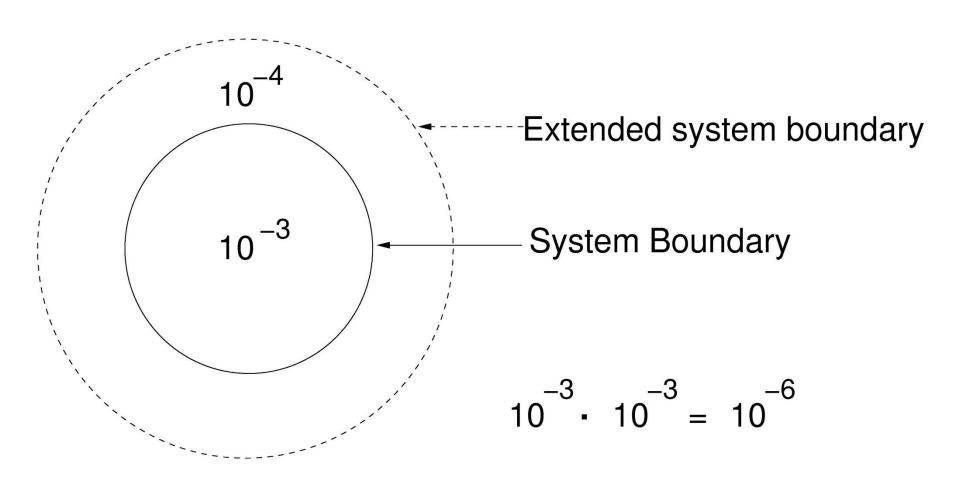
- Confirmation bias (tend to deny uncertainty and vulnerability)
 - People look for evidence that supports their hypothesis
 - Reject evidence that does not
- Construct simple causal scenarios
 - If none comes to mind, assume impossible
- Tend to identify simple, dramatic events rather than events that are chronic or cumulative
- Incomplete search for causes
 - Once one cause identified and not compelling, then stop search
- Defensive avoidance
 - Downgrade accuracy or don't take seriously
 - Avoid topic that is stressful or conflicts with other goals

Controlling Heuristic Biases

- Cannot eliminate completely but can reduce
- Use structured method for assessing and managing "risk"
 - Following a structured process and rules to follow can diminish power of biases and encourage more thorough search
 - Concentrate on causal mechanisms vs. likelihood
 - Require action or procedures (to avoid defensive avoidance)
- Use worst case analysis (vs. "design basis accident")
- "Prove" unsafe rather than "safe"
 - Hazard analysis vs. safety case

Misinterpreting Risk

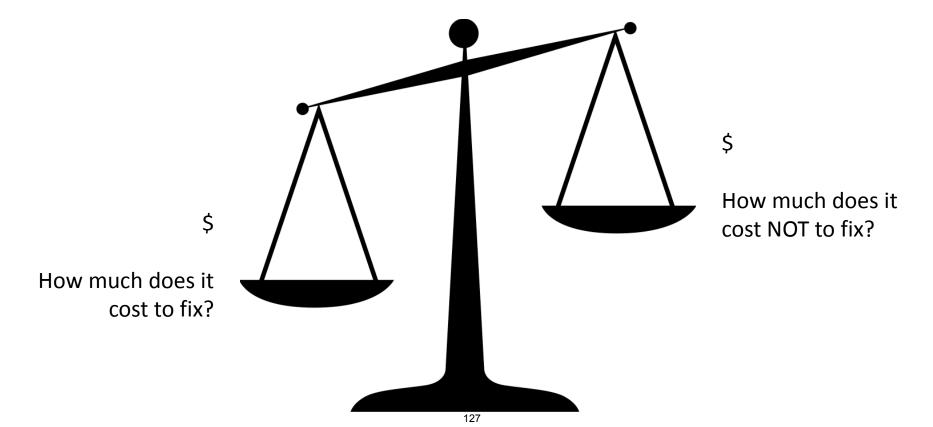
Risk assessments can easily be misinterpreted:



Cost Benefit Analysis

Cost-benefit analysis

- Goes beyond identifying risk
- Is it worth fixing?



Ford Pinto

- Ford noticed design flaw too late to eliminate
 - Fuel tank directly behind axle
 - Rear-end collision can cause disaster
- Engineers developed a patch
 - \$11 per car, reinforced structure
- Cost-benefit analysis
 - Total cost to fix: \$137.5 million
 - Human life is worth \$200,000
 - 180 expected burn deaths
 - Serious human injury is worth \$67,000
 - 180 expected serious burn injuries
 - Burned out vehicle is worth \$700
 - 2,100 expected burned out vehicles
 - Total cost if not fixed: \$49 million

One lawsuit ruling (1972):

- Ford to pay \$2.5 million compensatory damages
- Ford to pay \$3.5 million because Ford was aware of design defects before production but did not fix the design

Ford Pinto

- Cost of human life was based on National Highway Traffic Safety Administration regulations
 - \$200,725 per life
- Fuel tank location was commonplace at that time in American cars
- California supreme court had tolerated and encouraged manufacturers to trade off safety for cost
- NHTSA recorded 27 Pinto rear-impact fires
 - Lower than average for compact cars at the time

General Motors

- 13 deaths, 130 reported incidents
- Design flaws
 - Ignition switches easily switch to "off" position
 - Bumps, vehicle collision, heavy keychain, etc.
 - Keys have wide slot, increased torque
 - Airbags and other safety systems immediately disabled when key is off
- Cost-benefit analysis
 - GM aware of problem for over a decade
 - Developed a fix, costs \$0.57 per car
 - Recommended no further action because there was "no acceptable business case"
 - Tooling cost and piece price was too high
- CEO response
 - That is very disturbing if true
 - This is not how GM does business
 - If there is a safety issue we take action. We do not look at the cost associated with it.

General Motors

- Systemic factors
 - Wrote service bulletin to fix key slot, but kept it private
 - Knew in 2001 that ignition switches did not meet specification
 - 4-10 vs. 15-25
 - Updated part in 2006
 - Kept old part number, confusion
 - Still didn't meet specification (10-15 vs. 15-25)

Boeing

- Boeing 787 LiCo Batteries
- Prediction/Certification:
 - No fires within 10⁷ flight hours
 - Followed 4761 certification paradigm
- Actual experience:
 - Within 52,000 flight hours 2 such events
 - 2.6 x 10⁴ flight hours [NTSB 2013]





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Boeing 787 Lithium Battery Fires

- A module monitors for smoke in the battery bay, controls fans and ducts to exhaust smoke overboard.
- Power unit experienced low battery voltage, shut down various electronics including ventilation.
- Smoke could not be redirected outside cabin





All software requirements were satisfied! The requirements were inadequate

Lord Kelvin quote

- "I often say that when you can measure what you are speaking about, and express it in numbers, you know something about it; but when you cannot measure it, when you cannot express it in numbers, your knowledge is of a meagre and unsatisfactory kind; it may be the beginning of knowledge, but you have scarcely in your thoughts advanced to the state of *Science*, whatever the matter may be."
 - [PLA, vol. 1, "Electrical Units of Measurement", 1883-05-03]

A response

- "In truth, a good case could be made that if your knowledge is meagre and unsatisfactory, the last thing in the world you should do is make measurements; the chance is negligible that you will measure the right things accidentally."
 - George Miller (a psychologist)

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