Columbia University | IEOR 4729 | Algorithmic Trading

A Generalized Framework for Operational Risk Management of Human and Algorithmic Trading

Operational Risk Definition

The risk of a change in value caused by the fact that actual losses, incurred for inadequate or failed internal processes, people and systems, or from external events (including legal risk), differ from the expected losses.

See: Basel II: Revised international capital framework". Bis.org.

See: Solvency II Glossary - European Commission". CEA - Groupe Consultatif.

1. A Short History Lesson

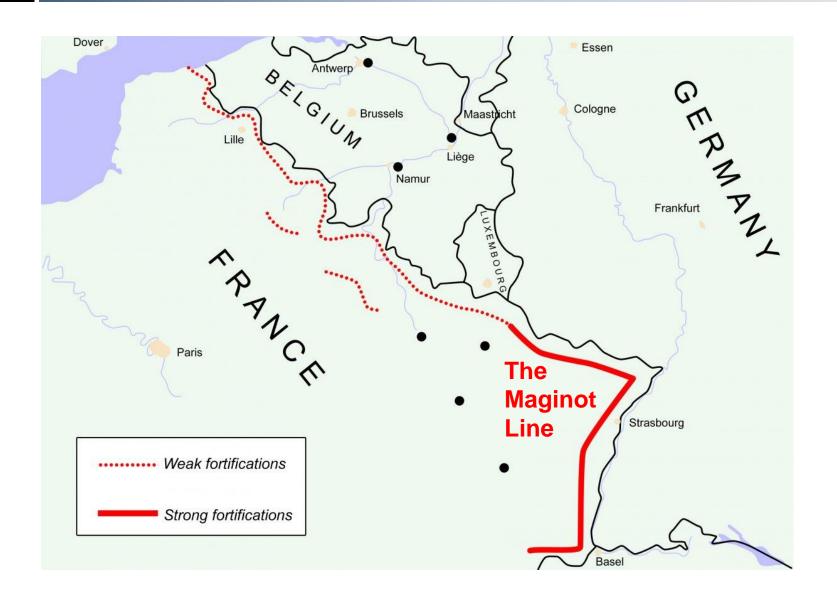
Where in the world?



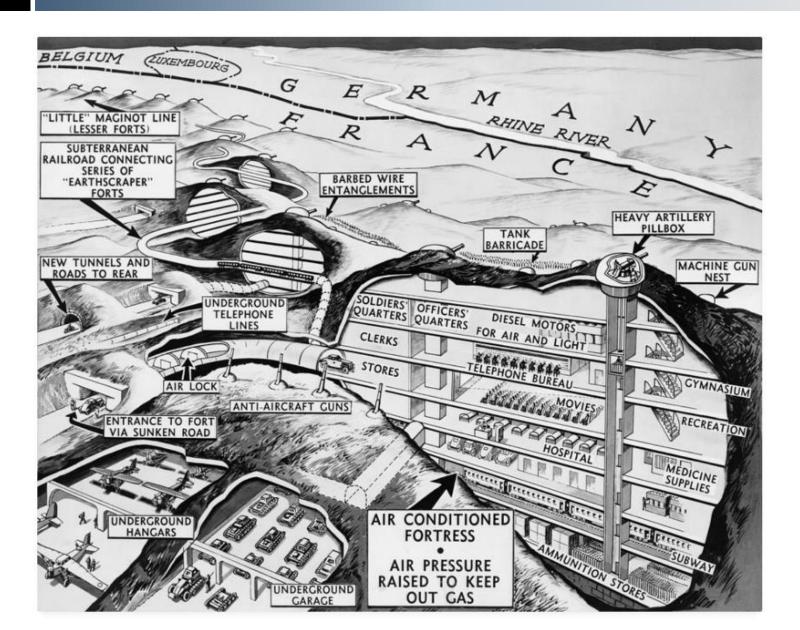




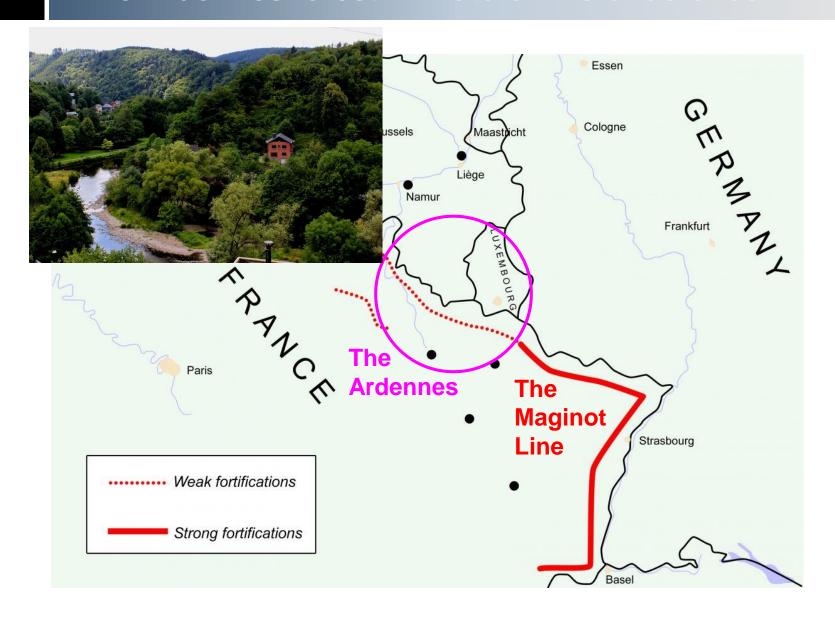
Europe 1940: The Maginot Line



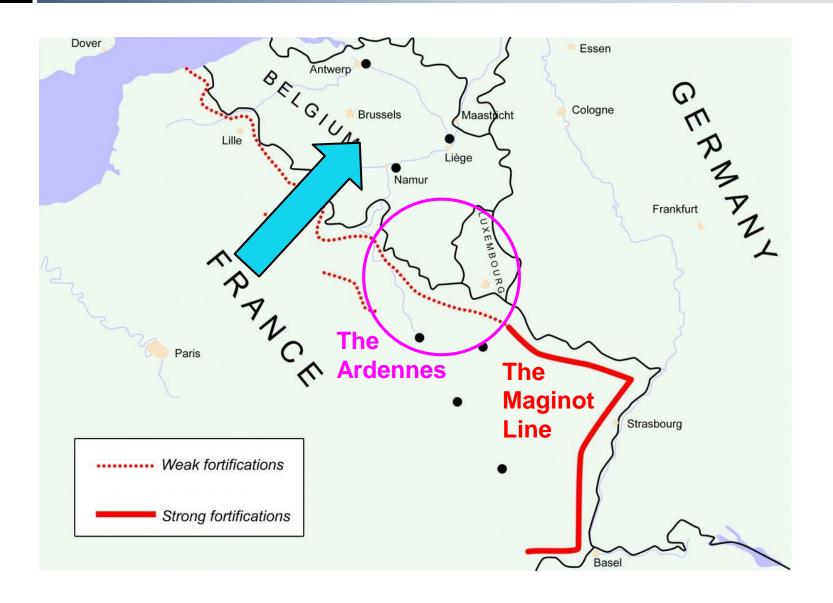
A Maginot Line fortress



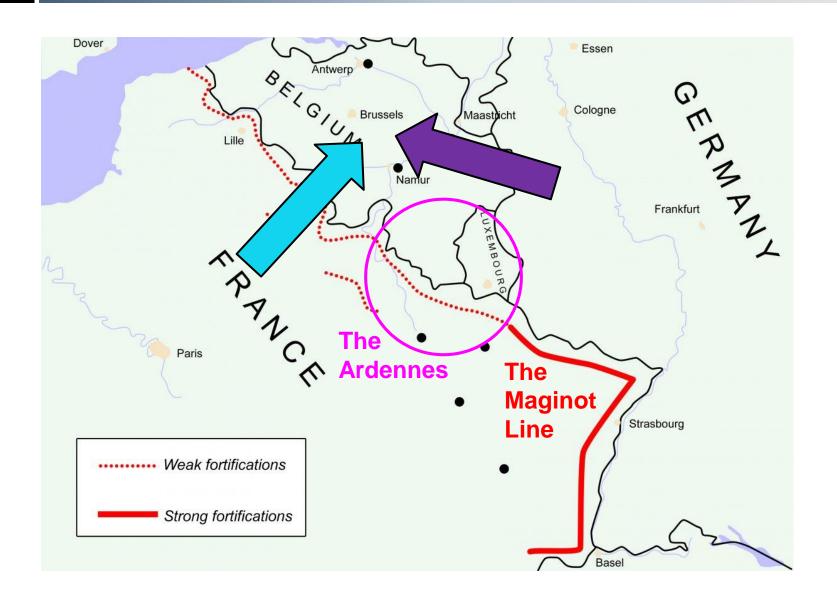
The Ardennes forest: A natural line of defense



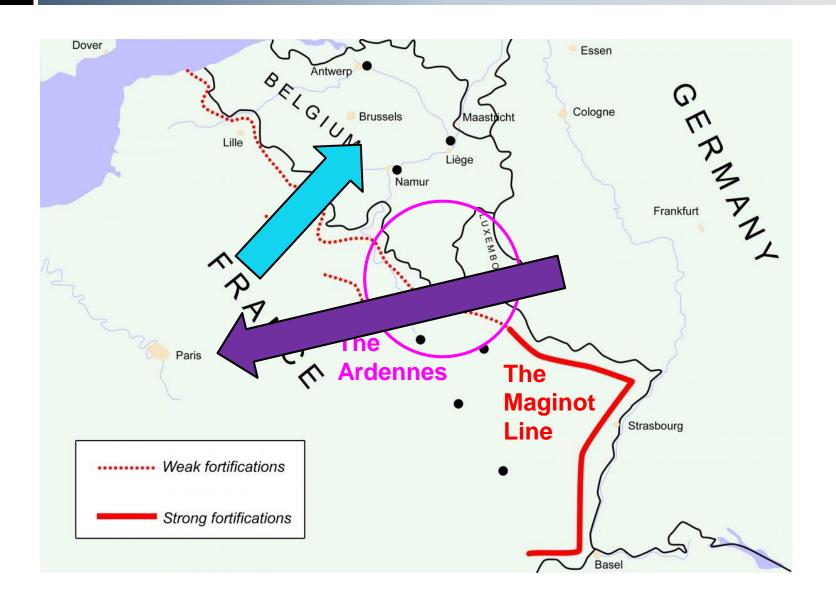
The French battle plan



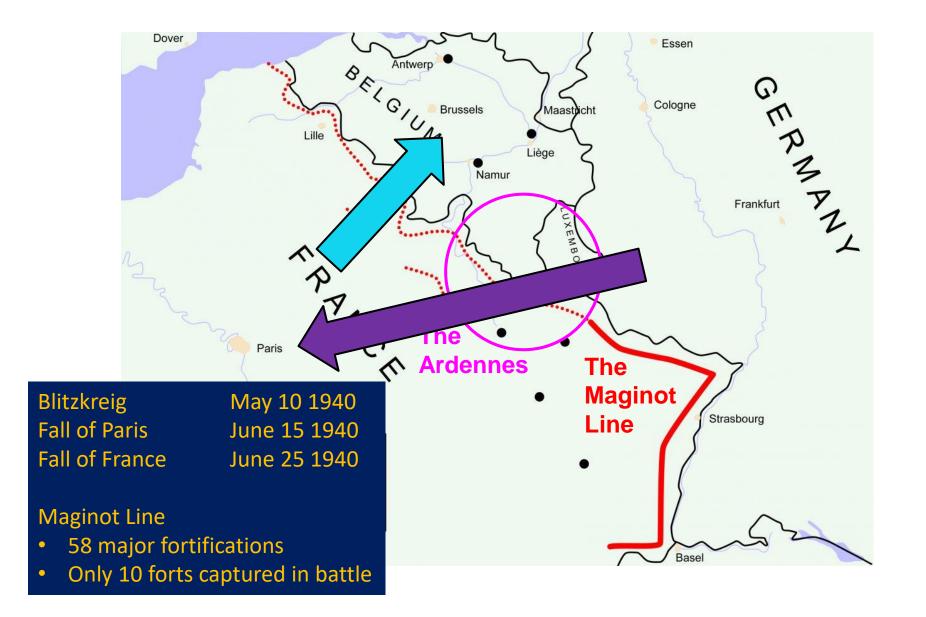
The French battle plan



The German battle plan

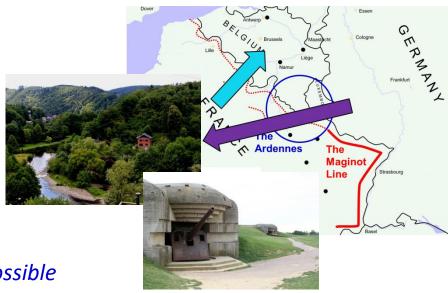


The German battle plan



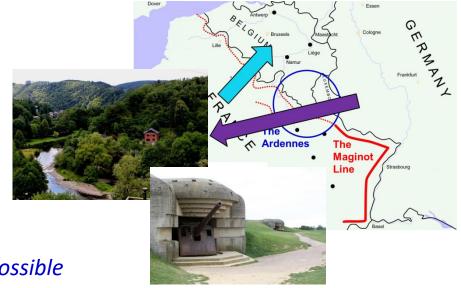
What can we learn about lines of defense?

- Static lines of defense are inflexible
 - → Build adaptive defenses
- Single lines of defense are vulnerable
 - → Layered defense in depth
 - → Mobile reserve
- The enemy is wily and determined
 - → Difficult attack vectors are not impossible
 - → Learn to think like the enemy...



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Homework: Please research these cases



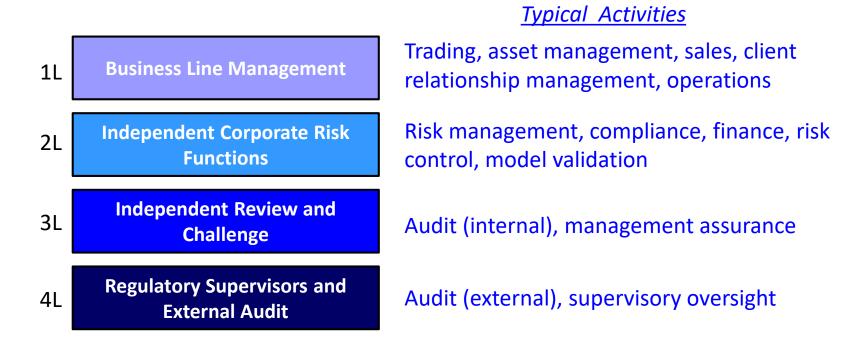
Think about....

- Insider threats vs outsider threats
- White hat actors vs criminal actors vs chaos actors vs espionage actors
- Human actors vs machine actors
- Velocity of disaster
- Potential countermeasures

2. Organization

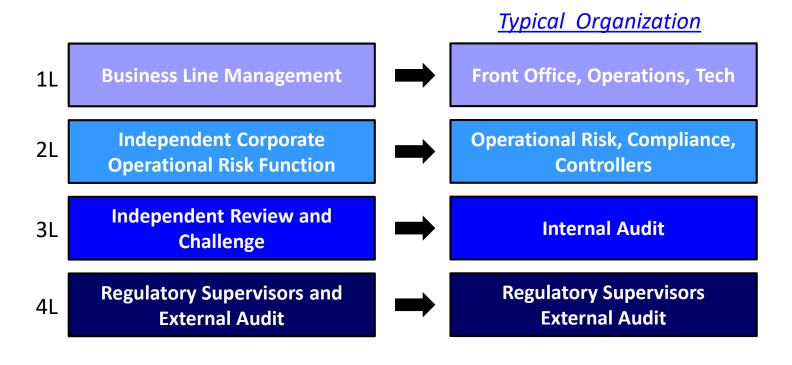
The three (or possibly four) lines of defense

- Principles for the Sound Management of Operational Risk (BIS / Basel Committee on Banking Supervision, June 2012)
- Occasional Paper No. 11: The "four lines of defence" model for financial institutions (BIS / Financial Stability Institute, December 2015)



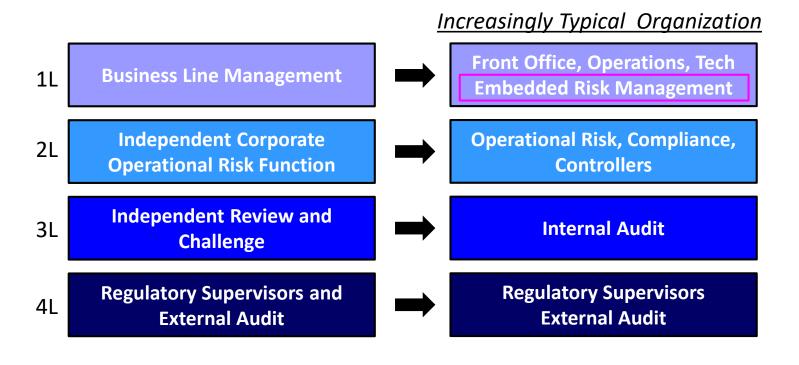
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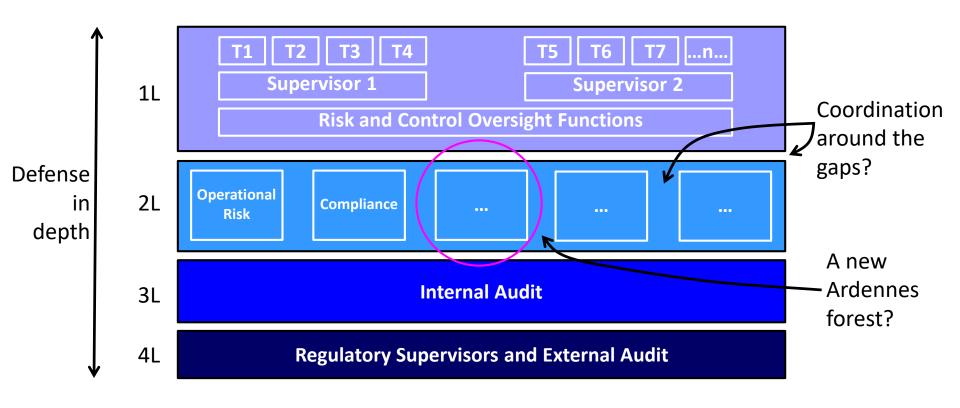


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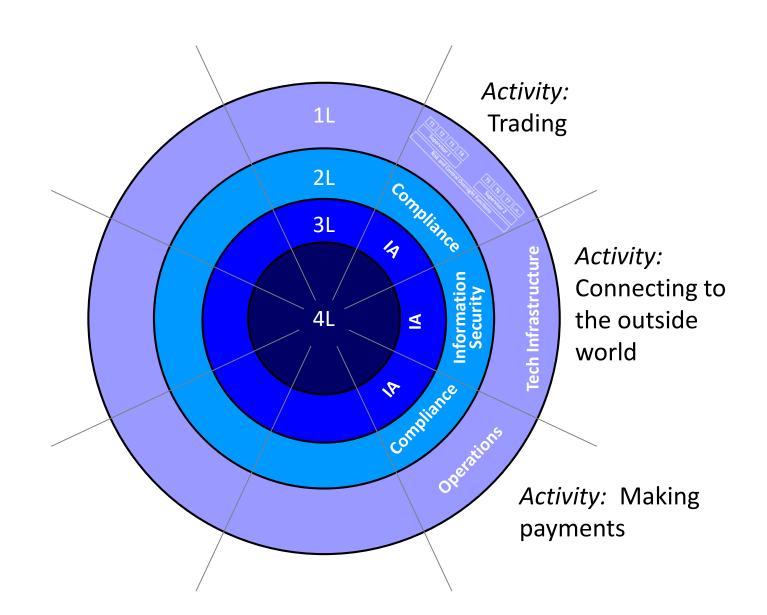


A new Maginot Line?

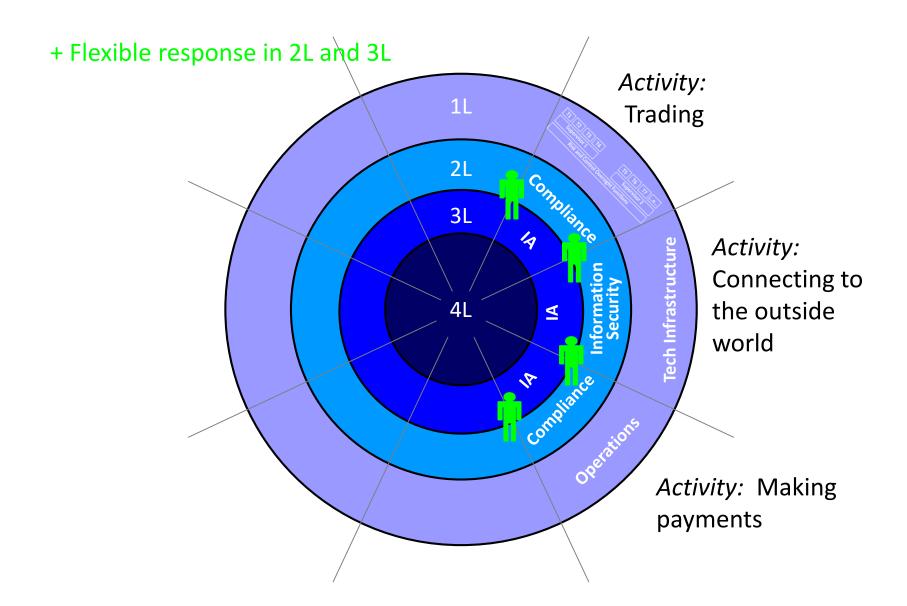


Too inflexible?

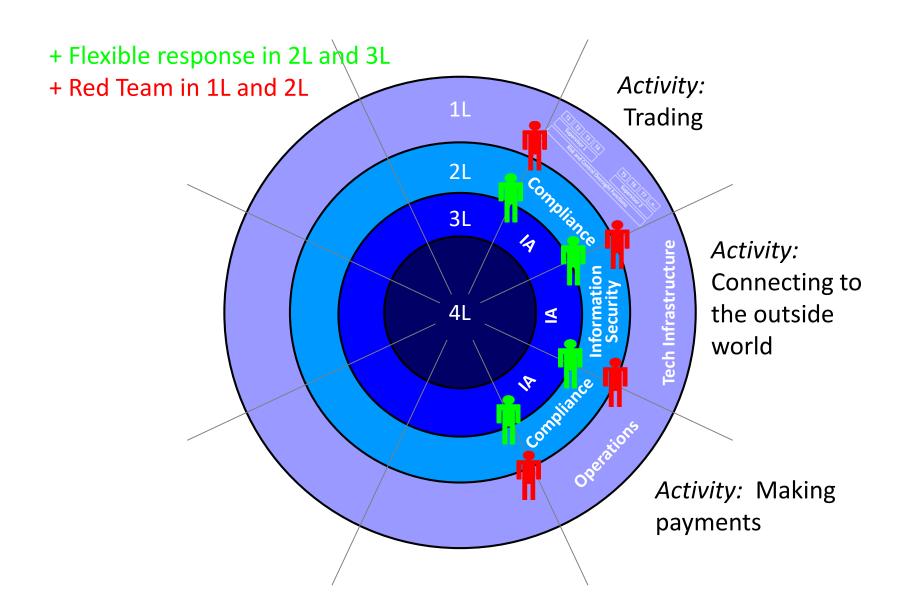
Four Adaptive Lines of Defense



Four Adaptive Lines of Defense



Four Adaptive Lines of Defense



3. Methodology

8 elements of operational risk management

- 1. Risk identification
- 2. Risk assessment ("Inherent Risk")
 - a) Expected
 - b) Stressed
- 3. Control identification
- 4. Control assessment
- 5. Risk and Control Balancing ("Residual Risk")
- 6. Risk Appetite Assessment
- 7. Event collection and back-testing
- 8. Event remediation

1. Risk Identification

- What could go wrong?
 - **Human factors**
 - Environment / infrastructure
 - Information
 - Software / Algos
 - Fraud
 - Threat actors
- Balance between standardized risks and specific risks
- A commercially useful list, for example
 - Trades could be entered with excessive size
 - Unauthorized persons may access sensitive data or code
 - Sensitive information may be sent to unintended external persons
 - Flooding in New York may disrupt trading operations
- Non-financial risks must be included

- 1. Risk identification 2. Risk assessment ("Inherent Risk")
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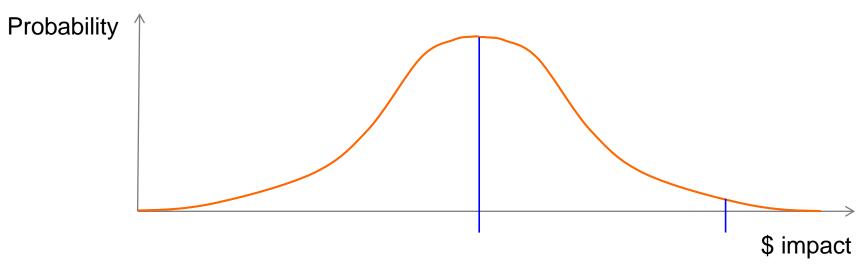
2. Risk Assessment

- Risk assessment ("Inherent Risk")
 Expected
- a) Expected b) Stressed

Risk identification

- 3. Control identification
- 4. Control assessment
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Inherent Risk
 What could go wrong if there were no controls?



- Consider both Expected case and Stressed case
 - → Low probability, high impact events prove to be the most harmful (look back to the Rogues Gallery on page 15)
 - → Is some level of "shrinkage" acceptable?

3. Control Identification

- 2. Risk assessment ("Inherent Risk")
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1. Risk identification

- 4. Control assessment
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- Consider:
 - Automated controls

eg: Fat finger controls

Message rate controls

Human controls

eg: Reconciliation between reports

Supervisor sign off

Preventative vs detective controls

eg: Cannot enter a value > \$50 billion in a field

Values > \$50 billion appear in an exception report

Environmental controls

eg: Heartbeat check between processes

Physical access controls to hardware

Redundancy of pathways

Exogenous controls

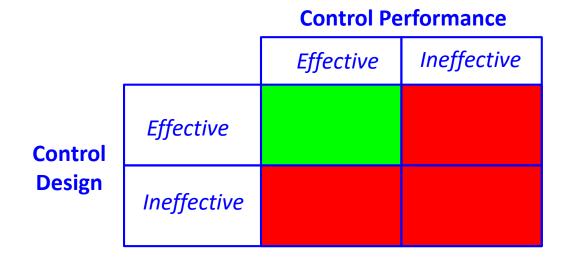
eg: Exchange message rate controls

Exchange credit limits

Key controls only

4. Control Assessment

- Is a control Effective or Ineffective?
- Both control <u>design</u> and control <u>performance</u> are critical:



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5. Risk and Control Balancing

Inherent Risk – Control Effectiveness = Residual Risk

1. Risk identification

2. Risk assessment ("Inherent Risk")

a) Expected b) Stressed

3. Control identification

4. Control assessment

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6. Risk Appetite Assessment

7. Event collection and back-testing

8. Event remediation

For example:





6. Risk Appetite Assessment

2. Risk assessment ("Inherent Risk") b) Stressed Control identification

Control assessment

1. Risk identification

Risk and Control Balancing ("Residual Risk")

Risk Appetite Assessment

7. Event collection and back-testing

8. Event remediation

Risk Appetite = f (Severity, Probability, Regret*, Capital)

If you have \$100 of capital, how much risk are you willing to assume?

For each legal entity, as a function of capital, determine risk appetite on the

following dimensions:

Single Event | Cumulative **Expected** Inherent Residual Stressed

Risk Assessment

If Risk > Appetite, the options are:

- → Treat the risk (and make a plan to do so)
- → Accept the risk (and document why)
- → Transfer the risk to somebody else
- → Stop doing the thing which creates risk

^{*}Seeing Tomorrow: Rewriting the Rules of Risk, Ron S. Dembo, Andrew Freeman, Wiley

7. Event Collection and Back-Testing

- Event detection / collection network which:
 - Spans the entire enterprise
 - Operates close to real time
 - Is easy to use
- Use past events to challenge forward risk assessments

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8. Event Remediation

This isn't academic! The objective is to fix things



- **Process**
 - **Event collection**
 - Triage
 - Emergency remediation
 - Long-term remediation where commercial to do so

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To conclude...



Know your enemy



Know your weak spots



Don't build defenses that can only face in one direction



Build layered, adaptable defense in depth



Know your appetite for risk



Understand the balance of risks and controls



If it's broken, fix it. Properly.

Thank you...

Questions?