

Cambridge Centre for Risk Studies
Risks and Benefits of Artificial Intelligence and Robotics – 6 February



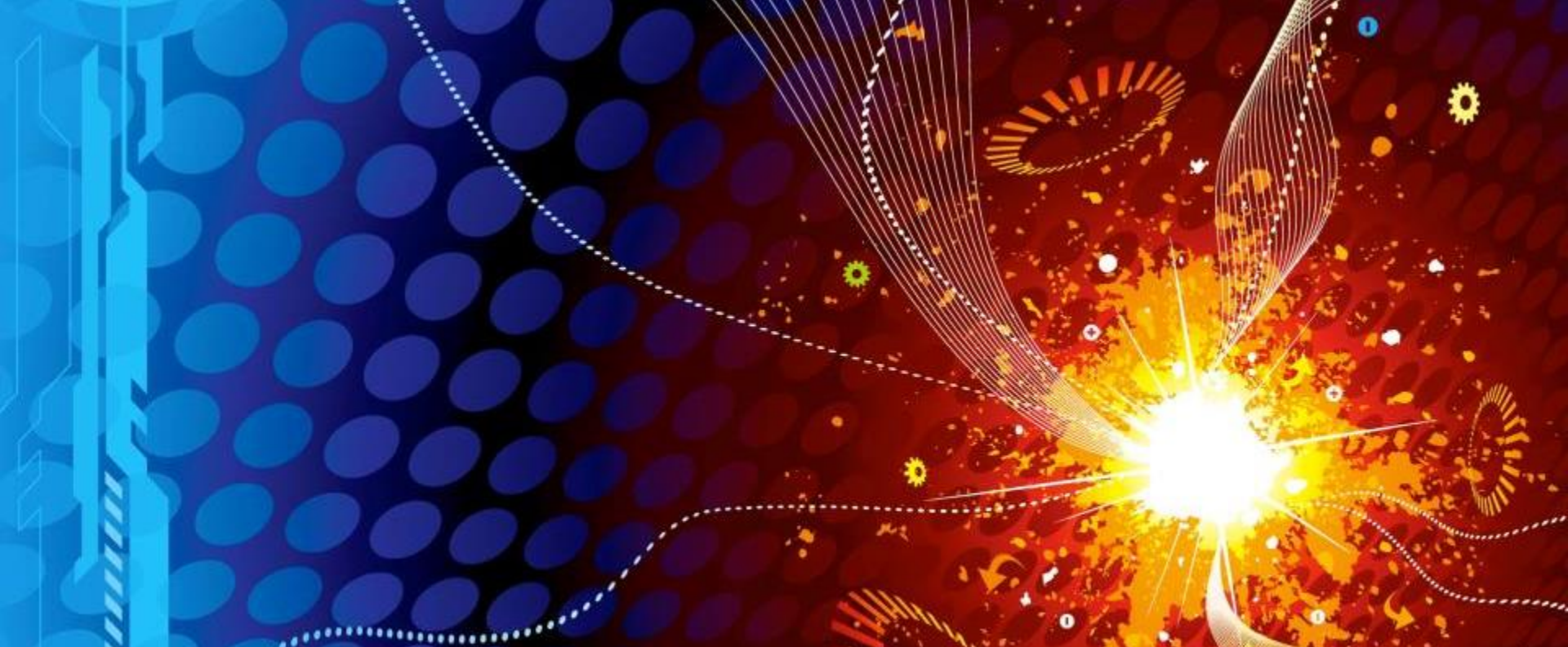
The Cyber-Security Overlap

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Session 3: the Cyber-Security Overlap Agenda

- The triangle of pain: the role of policy, public and private sectors in mitigating the cyber threat
 - Professor Daniel Ralph, Academic Director, Cambridge Centre for Risk Studies & Professor of Operations Research, University of Cambridge Judge Business School
- Modelling the cost of cyber catastrophes to the global economy
 - Simon Ruffle, Director of Research & Innovation, Cambridge Centre for Risk Studies
- Towards cyber insurance: approaches to data and modelling
 - Jennifer Copic, Research Associate, Cambridge Centre for Risk Studies



Cambridge Centre for Risk Studies

Risks and Benefits of Artificial Intelligence and Robotics – 6 February



The triangle of pain: the role of policy, public and private sectors in mitigating the cyber threat

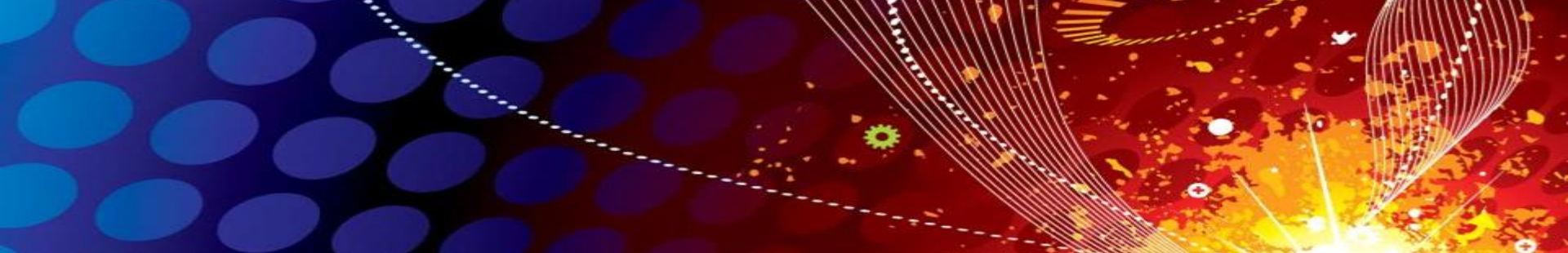
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Professor Daniel Ralph

Academic Director & Professor of Operations Research
Cambridge Centre for Risk Studies
& Cambridge Judge Business School

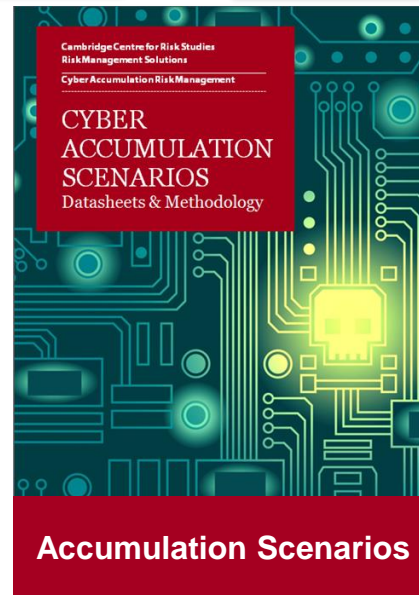
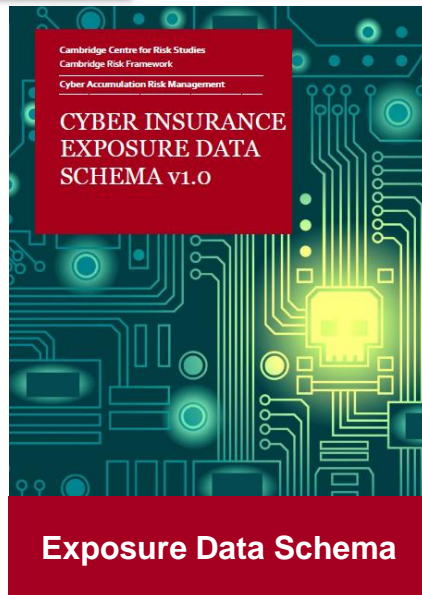
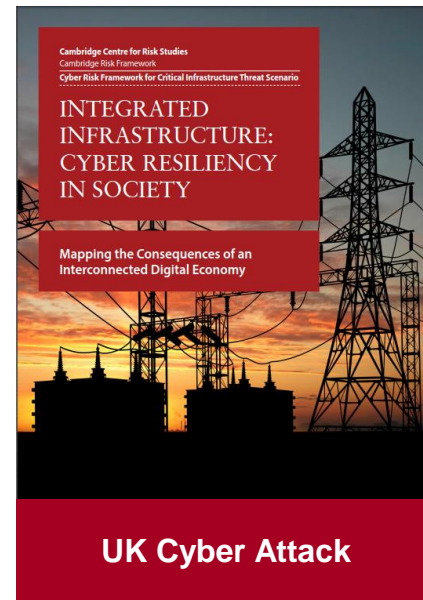
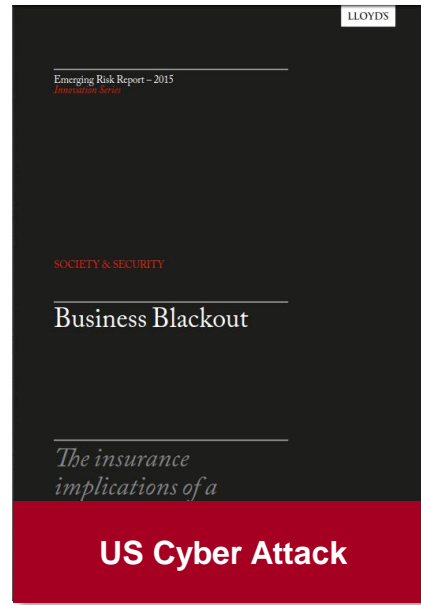
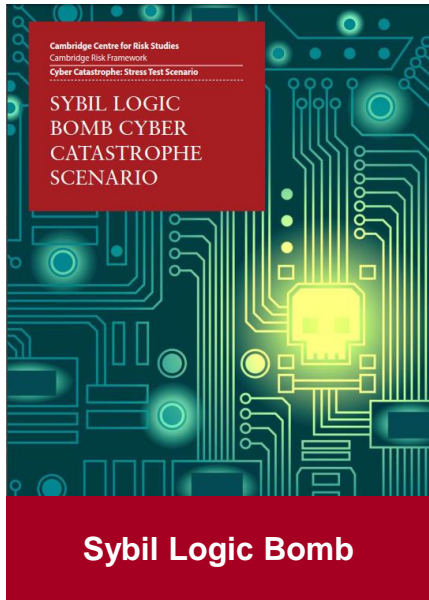


UNIVERSITY OF
CAMBRIDGE
Judge Business School



Centre for Risk Studies Mission Statement
**To be the world's leading academic centre
for research into systemic risk
in business, the economy, and society**

CCRS Cyber Research: Stress Test Scenarios and Insurance Loss Models



The Knowledge Economy

Old

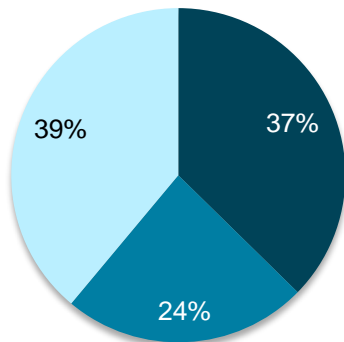


New

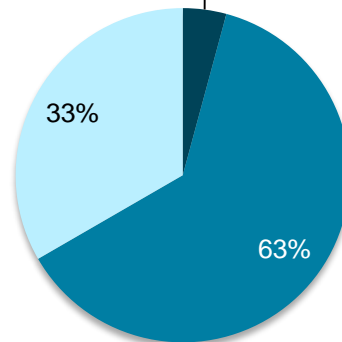


Economies categorised by dependency on critical infrastructure

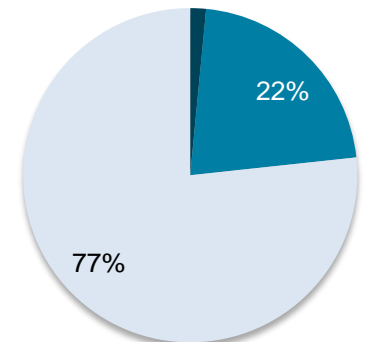
Agriculture with Industry & Service



Industrial-Oriented Economy



Service-Dominated Economy



■ Agriculture
■ Industrial
■ Service

What is Cyber Risk?

■ Cyber Risk

- *“Any risk of financial loss, disruption or damage to the reputation of an organisation from some sort of failure of its information technology [or operational technology] systems”*

The Institute for Risk Management. [“Cyber Risk”](#). 2014

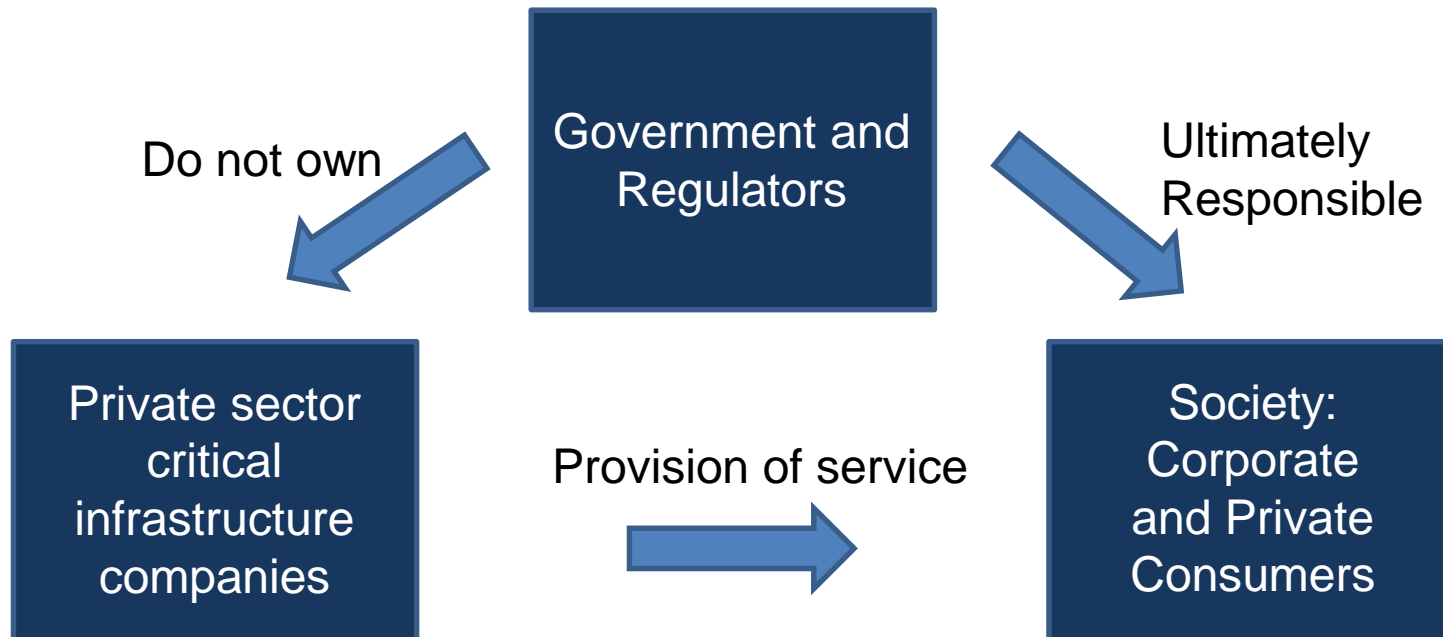
■ IT (information technology)

- Attacks on non-physical assets could target enterprise systems, such as websites or databases

■ OT (operational technology)

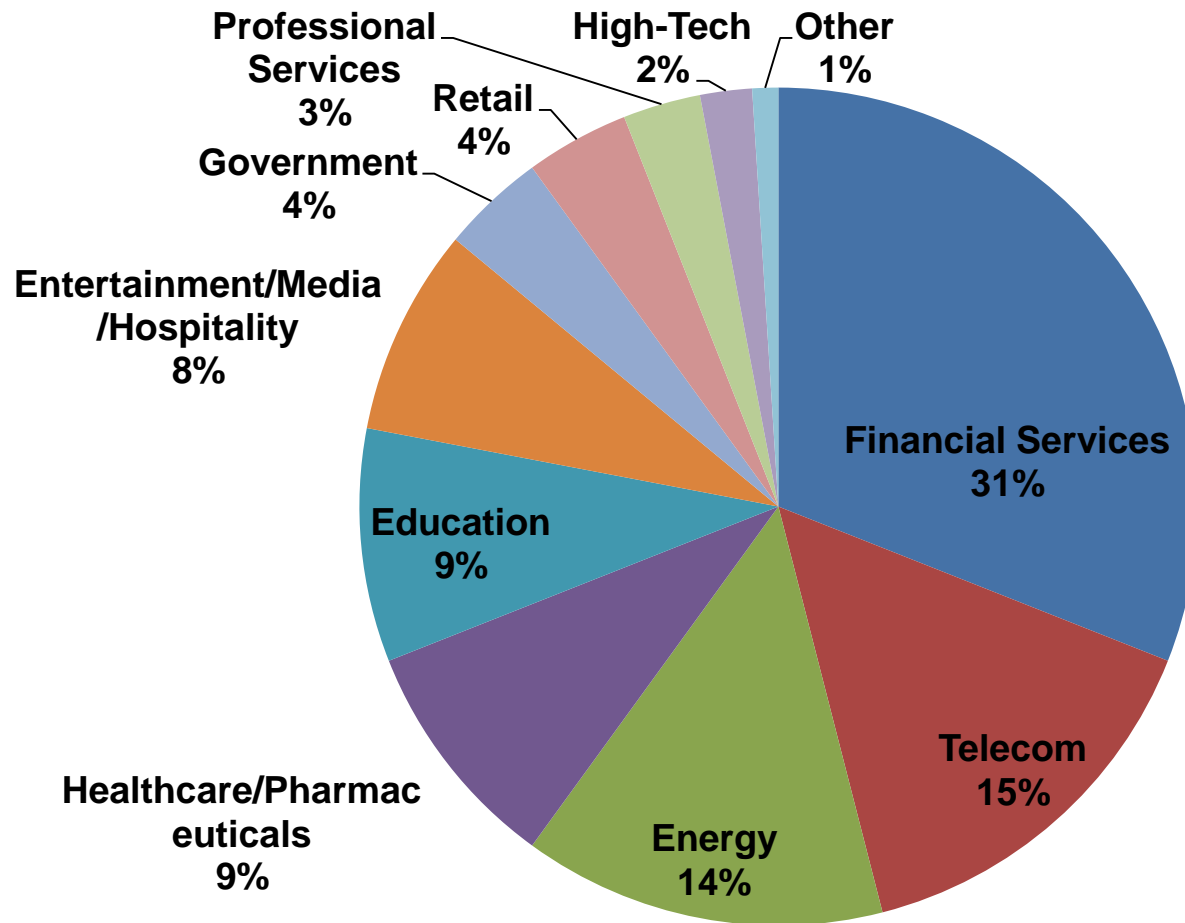
- Attacks on physical assets could target industrial control systems like SCADA and have the potential to cause physical damage

Triangle of Pain: Failure of Critical Infrastructure



Optimizing the risk equation: who bears the risk?

Cyber Attacks by UK Sector



Chandiramani, Yogi. "The FireEye Advanced Threat Report 2012: UK and Ireland Edition. 29 April, 2014. <https://www.fireeye.com/blog/executive-perspective/2014/04/the-fireeye-advanced-threat-report-2013-uk-ireland-edition.html> [Accessed: July 2015]

Historical UK Power Outages

■ 1987

Wind storm breaks the link between UK and France. SE East England w/out power for approximately 6 hours

■ 2003

Back to back transmission system faults caused a 34 minute power outage in parts of London. (London Assembly, 2004)

■ 2009

A power cut due to arson at a cable installation left 94,000 customers without power for four days (BBC, 2009)

■ 2010

A blackout in Portsmouth was caused by a substation fire, 47,000 people without power (BBC, 2010)

■ 2013

Severe winter storms in Dec damaged distribution network affecting almost 1 million customers over 48 hours (Cabinet Office, 2015)

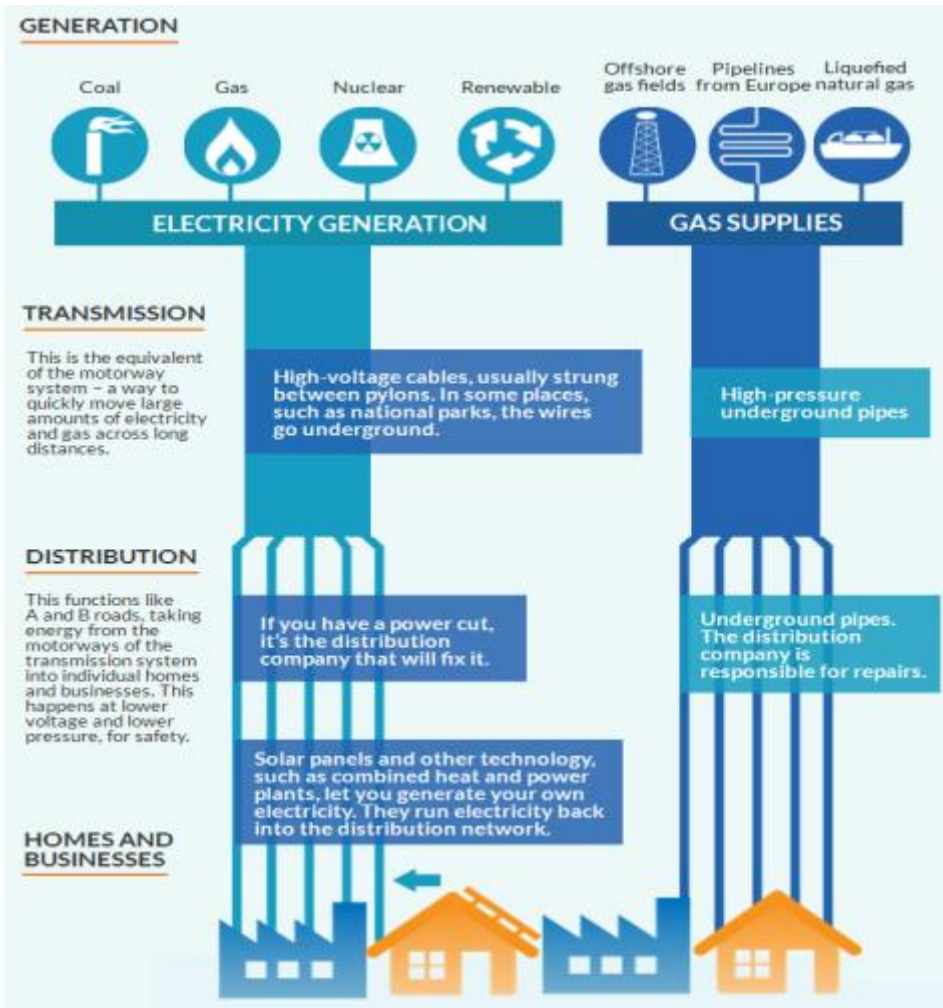
■ 2015

An underground fire in Holborn cable tunnels caused a power outage. It took 36 hours to put out the blaze (BBC, 2015)



London Wednesday 1 April 2015 [Picture: Twitter/@mdw1989]

CRS Cyber Attack Scenarios on Power System

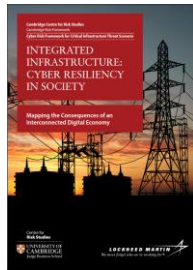
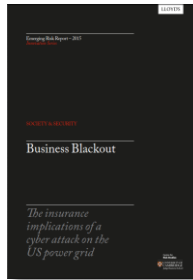


US Generation

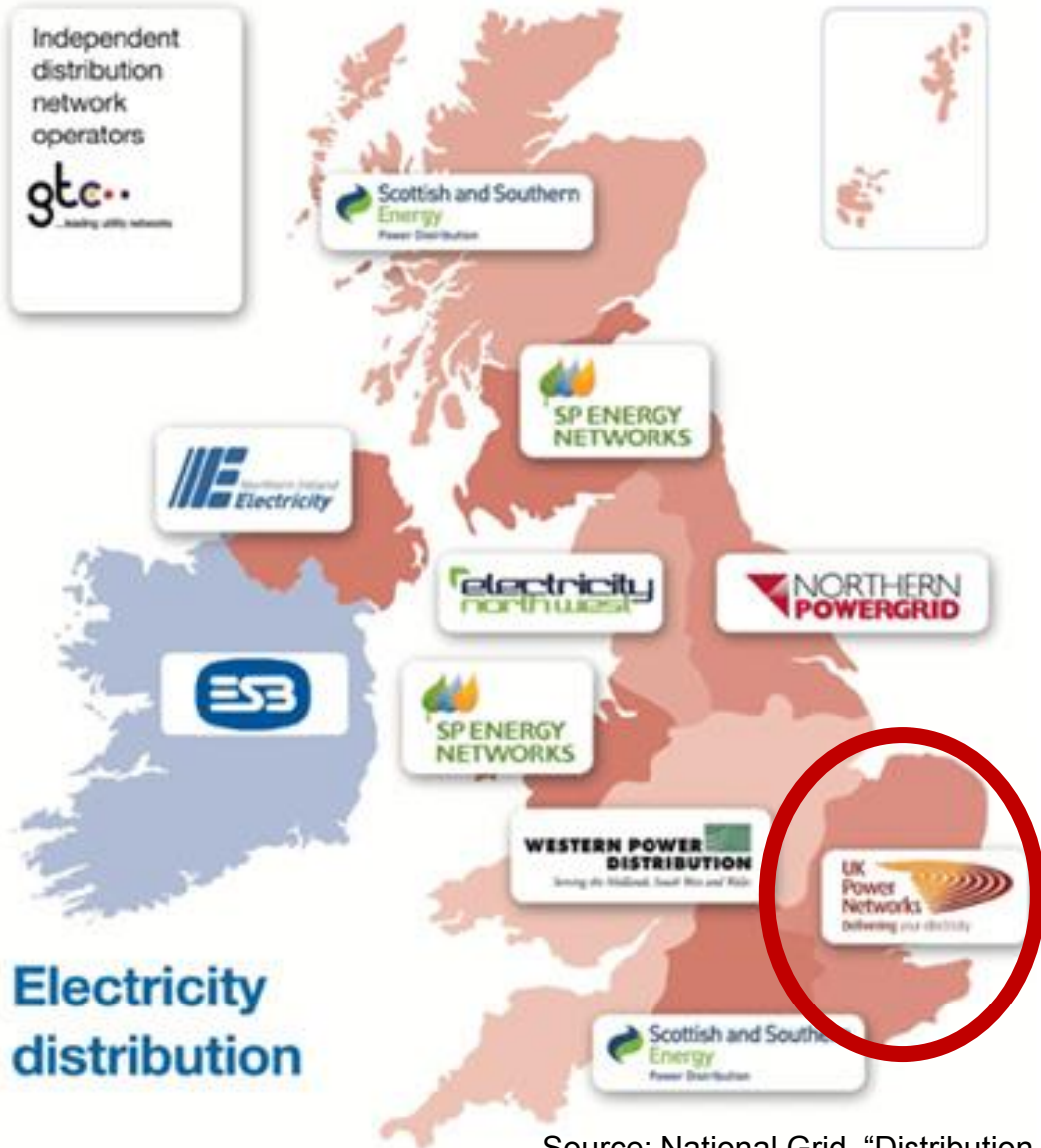
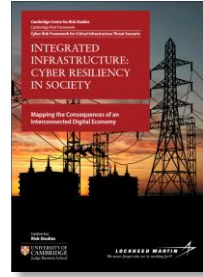
EU Transmission
Future Project TBD

UK Distribution

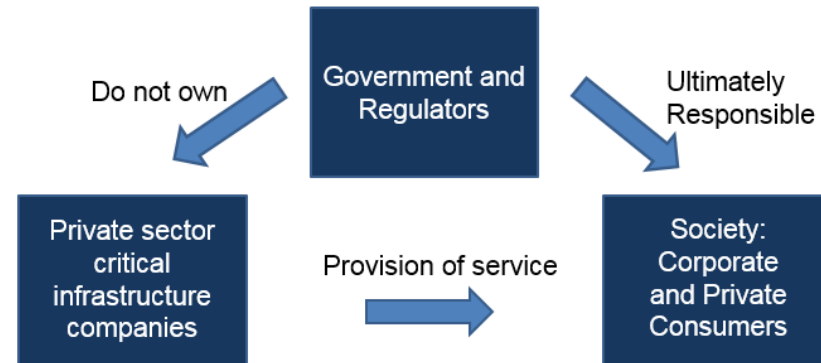
SmartGrid/Smart Cities
Future Project TBD



Electricity Distribution Under Threat From Cyber Attack

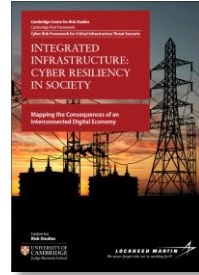


Triangle of Pain



Source: National Grid. "Distribution Network Operator (DNO) Companies"

2015 Ukraine Cyber Attack on Electricity Distribution Substations



- Power outage 23 December 2015
- Electricity outage affected region with over 200,000 people for several hours
- Malware (BlackEnergy) in 3 distribution substations
- Still investigating if switching came from hackers
 - The Ukrainian energy ministry probing a “suspected” cyber attack on the power grid
- Ukraine CERT confirms there was spear phishing at affected companies prior to outage

them.

FINANCIAL TIMES

UK COMPANIES MARKETS OPINION WORK & CAREERS LIFE & ARTS

Cyber Security [+ Add to myFT](#)

Hackers shut down Ukraine power grid



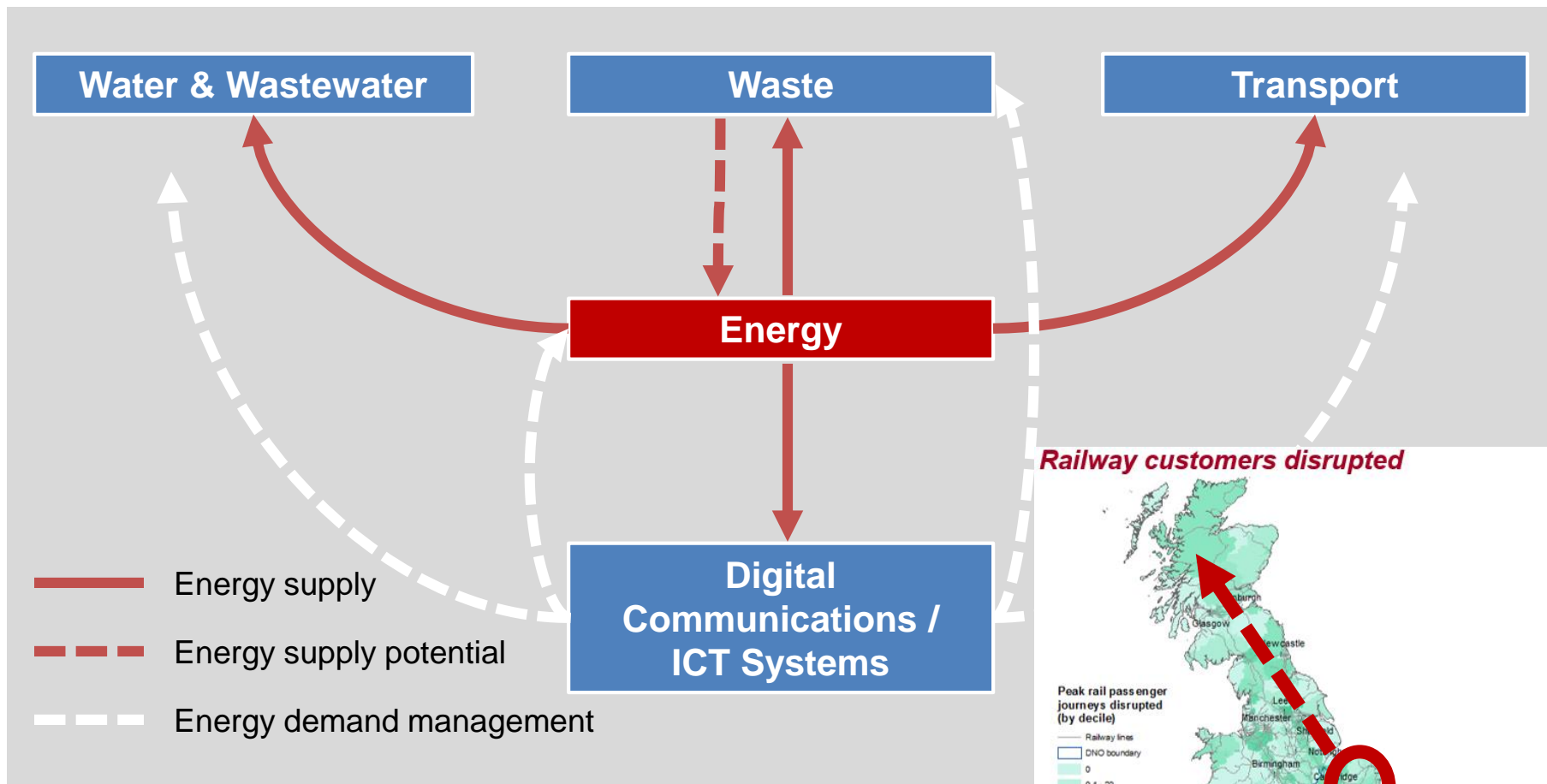
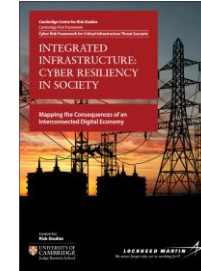
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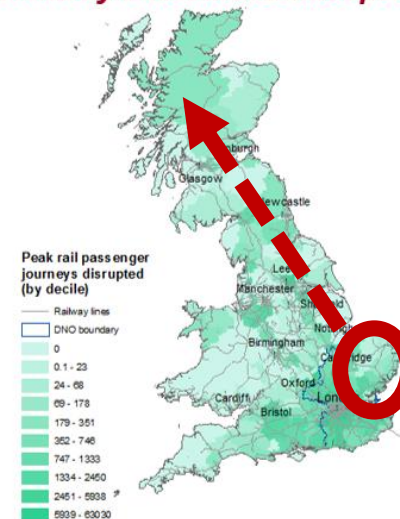
JANUARY 5, 2016 by [Hannah Kuchler](#) in San Francisco and [Neil Buckley](#) in London

Hackers brought down the power supply to hundreds of thousands of homes in Ukraine last week, in a cyber attack believed to be the first ever to result in a power outage.

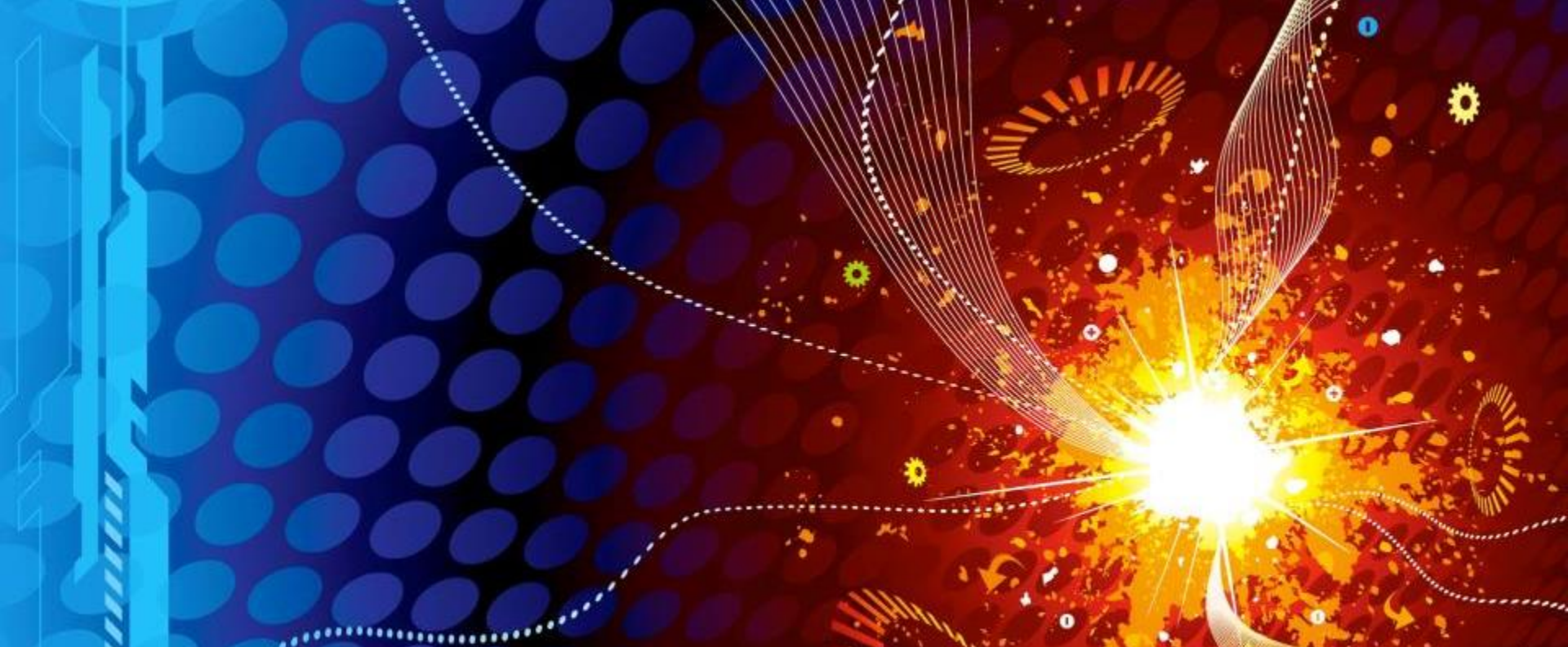
Growing Interdependency Amplifies the Triangle of Pain



Railway customers disrupted



Customer disruptions by scenario: S1 = 0.85m | S2 = 1m | X1 = 1m



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Modelling the cost of cyber catastrophes to the global economy

Centre for
Risk Studies

Simon Ruffle

Director of Research & Innovation
Cambridge Centre for Risk Studies

Catastrophe Modelling in Complex Systems

- The Centre for Risk Studies arises from shared interests by the participants in exploring areas of intersection between
 - Catastrophe modelling and extreme risk analytics
 - Complex systems and network failures
- Advance the scientific understanding of how systems can be made more resilient to the threat of catastrophic failures

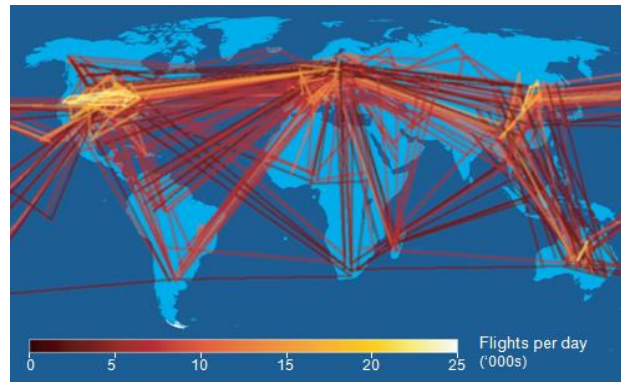
To answer questions such as:

'What would be the impact of a [War in China] on [Trade Networks] and how would this impact the [Global Economy]?'

Regional Conflict



Air Travel Network



Global Economy



Cambridge Taxonomy of Threats

Financial Shock



FinCat



Asset Bubble



Financial Irregularity



Market Crash



Sovereign Default



Bank Run

Trade Dispute



TradeCat



Labour Dispute



Trade Sanctions



Cartel Pressure



Nationalization



Tariff War

Geopolitical Conflict



WarCat



Conventional War



Asymmetric War



External Force



Civil War



Nuclear War

Political Violence



HateCat



Terrorism



Separatism



Organized Crime



Assassination



Social Unrest

Natural Catastrophe



NatCat



Earthquake



Windstorm



Volcanic Eruption



Flood



Tsunami

Climatic Catastrophe



WeatherCat



Drought



Freeze



Tornado & Hail

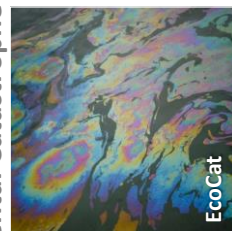


Electric Storm



Heatwave

Environmental Catastrophe



EcoCat



Sea Level Rise



Ocean System Change



Wildfire

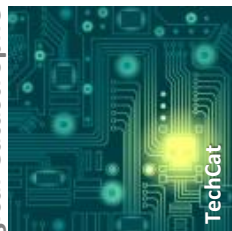


Pollution Event



Atmospheric System Change

Technological Catastrophe



TechCat



Nuclear Meltdown



Industrial Accident



Cyber Catastrophe

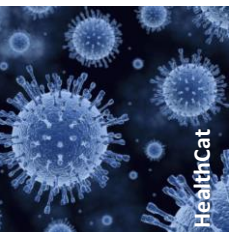


Technological Accident



Infrastructure Failure

Disease Outbreak



HealthCat



Human Epidemic



Animal Epidemic



Waterborne Epidemic



Zoonosis



Plant Epidemic

Humanitarian Crisis



AidCat



Famine



Water Supply Failure



Child Poverty



Welfare System Failure



Refugee Crisis

Externality



SpaceCat



Meteorite



Solar Storm



Space Threat



Ozone Layer Collapse



Satellite System Failure

Other



NextCat



CCRS Research Outputs: Explorations of individual threats



Taxonomy of Threats



Geopolitical Conflict
Emerging Risk Scenario



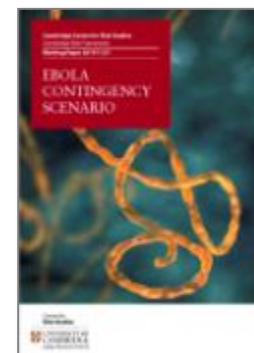
Pandemic
Emerging Risk Scenario



Cyber Catastrophe
Emerging Risk Scenario



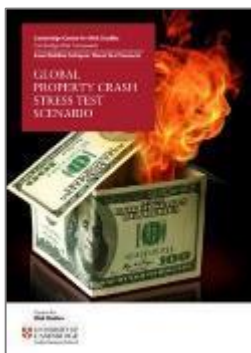
Social Unrest
Emerging Risk Scenario



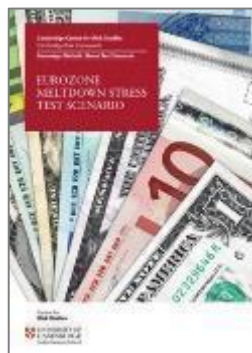
Ebola
Emerging Risk Scenario



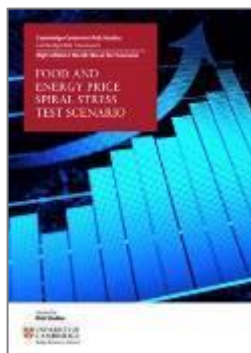
Financial Catastrophes



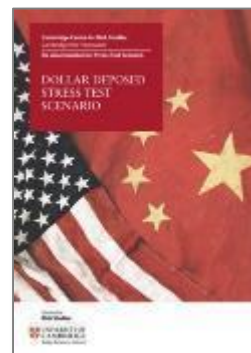
Global Property Crash
Financial Risk Scenario



Eurozone Meltdown
Financial Risk Scenario



High Inflation
Financial Risk Scenario



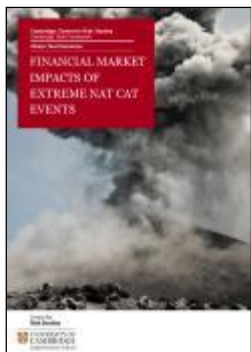
Dollar Dethroned
Financial Risk Scenario



Historical Crises
Financial Risk



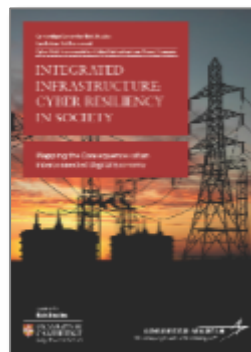
Cyber Accumulation
Insurance Risk Report



NatCat FinCats
Clash Report



Business Blackout
Lloyds Emerging Risk Report



Infrastructure
Cyber Attack UK



World City Risk 2025
Lloyds Co-Branded Report

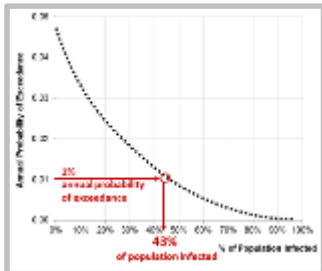


Solar Storm
Emerging Risk Scenario 18

Scenario Development Process

Historical Context

A justification and context for a 1% annual probability of occurrence worldwide



Timeline & Footprint

Sequencing of events in time and space in hypothetical scenario



Narrative

Detailed description of events
3-4 variants of key assumptions for sensitivity testing



Loss Assessment

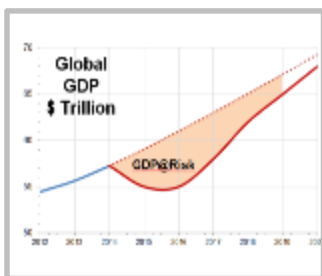
Metrics of underwriting loss across many different lines of insurance business

Specialty	Value
Accident & Health	5
Aquaculture Insurance	1
Contingency - film & event	1
Equine Insurance	1
Excess & Surplus	0
Life Insurance	4
Livestock	3

Impact on Insurance Claims	
Decrease	Increase
-5	5
-4	4
-3	3
-2	2
-1	1
0	0
1	1
2	2
3	3
4	4
5	5

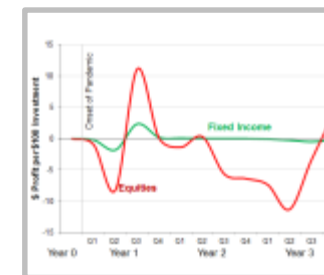
Macroeconomic Consequences

Quantification of effects on many variables in the global economy

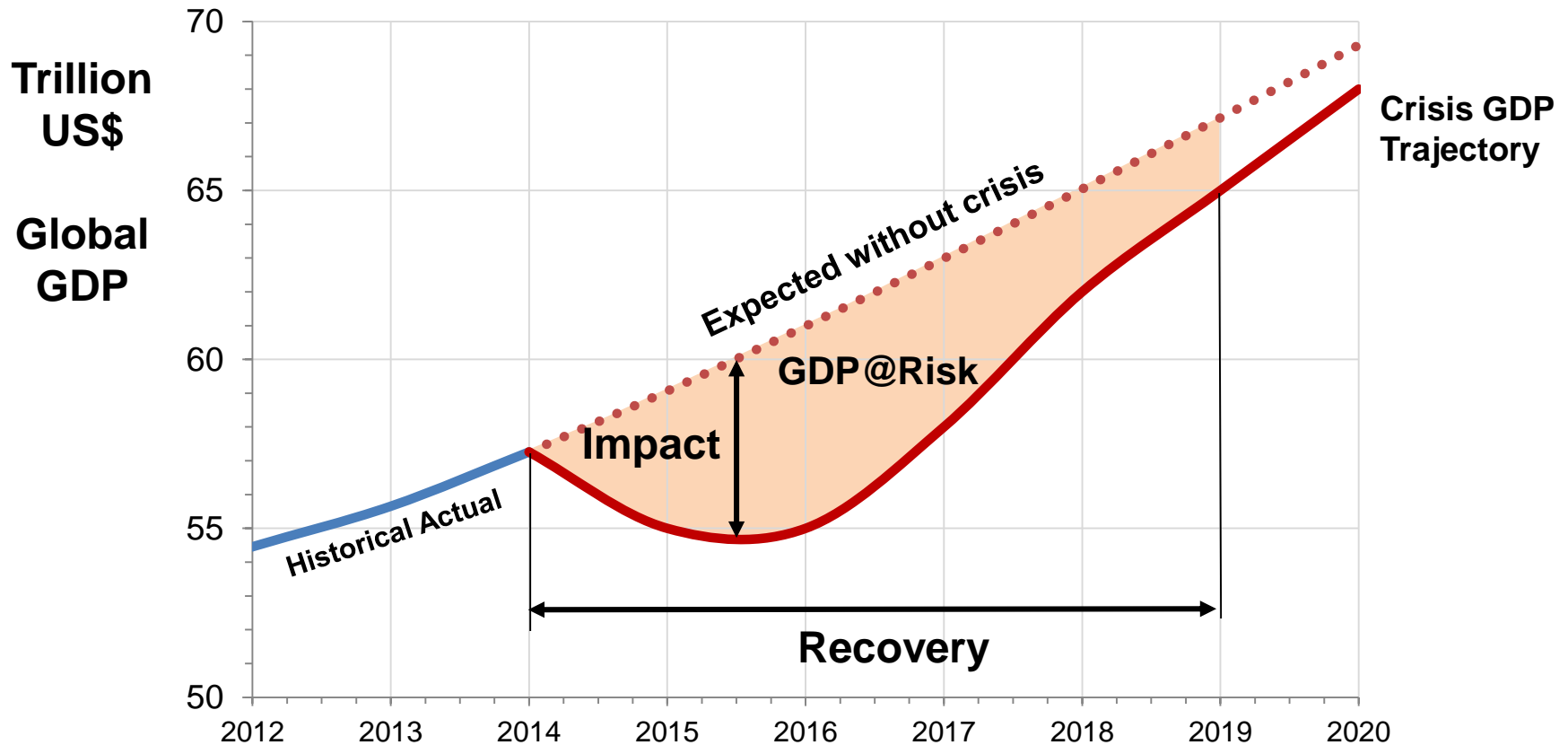


Investment Portfolio Impact

Returns and performance over time of a range of investment assets



Catastrophomics: GDP@Risk



GDP@Risk: Cumulative first five year loss of global GDP, relative to expected, resulting from a catastrophe or crisis

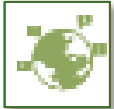
Cyber Risk Research at CCRS

IT Scenarios

Information Technology



Data Exfiltration
(‘Leakomania’)



Denial of Service Attack
(‘Mass DDoS’)



Cloud Service Provider Failure
(‘Cloud Compromise’)



Financial Theft
(‘Cyber Heist’)



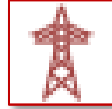
Ransomware
(‘Extortion Spree’)



Malware
(‘Sybil Logic Bomb’)

OT Scenarios

Operations Technology



Cyber Attack on **US Power Generation**
(‘Business Blackout’)



Cyber Attack on **UK Power Distribution**
(‘Integrated Infrastructure’)



Cyber attack on **Commercial Office Buildings**
(Laptop batteries fire induction’)



Cyber attack on **Marine Cargo Port**
(‘Port Management System’)



Cyber Attack on **Industrial Chemical Plant**
(‘ICS Attack’)



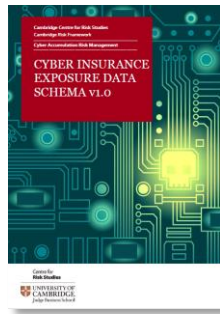
Cyber Attack on **Oil Rigs**
(‘Phishing-Triggered Explosions’)



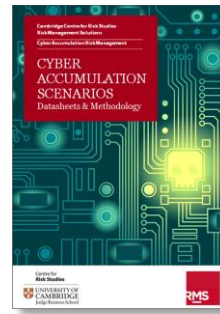
Sybil
Logic Bomb



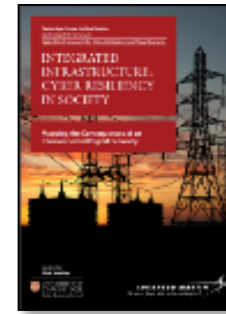
US Cyber
Blackout



Exposure Data
Schema



Accumulation
Scenarios



UK Cyber
Blackout



Cyber
Terrorism

Malware: the 'Erebos' Trojan

- Erebos is the Greek God of Darkness
- Understand the scale of loss
 - We have not yet had 'the Big One' for cyber
 - This fictional event explores what a cyber catastrophe might look like
- Insurance industry needs to quantify the size of the loss
- Malware trojans
 - A team of software hackers creates the 'Erebos' Remote Access Trojan
 - The Erebos Trojan is a fictional piece of malware that can infect generator control rooms that goes undetected
 - When activated it finds generators with specific characteristics and forces them to burn out

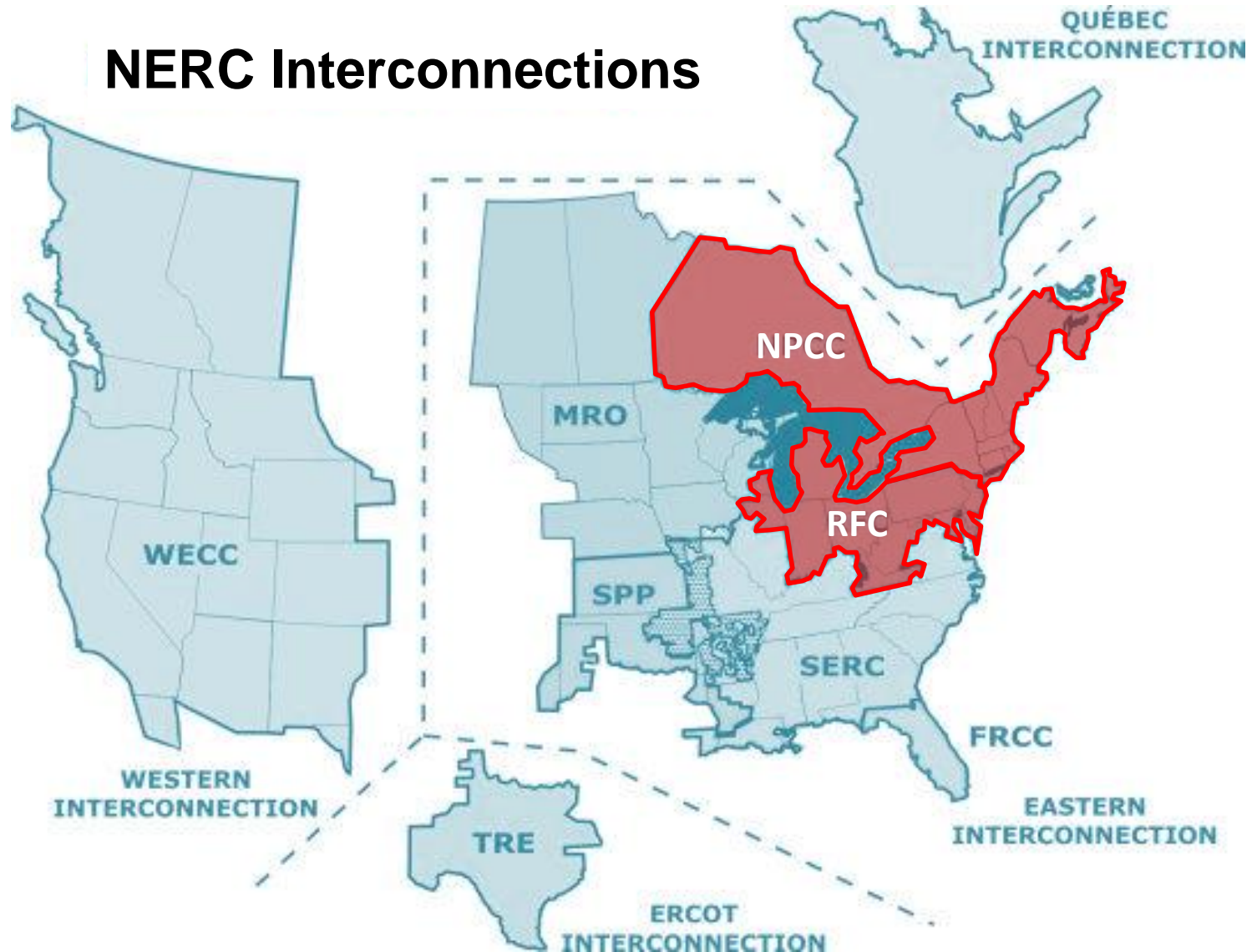


The Aurora Vulnerability: Phase Angle De-Synchronisation of a Generator



US Electricity Grid Interconnections

NERC Interconnections

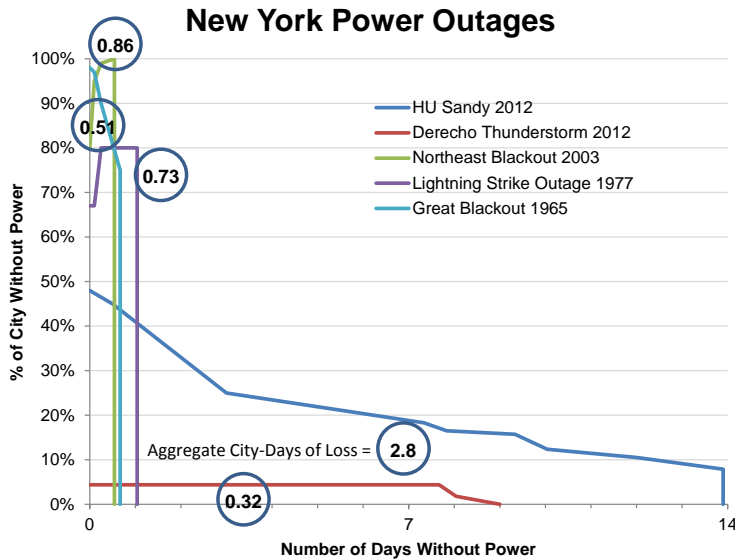


Erebos Business Blackout Scenario

- During peak summer demand for electricity – there is a coordinated simultaneous attack targeted at two regions of United States power grid (NPCC and RFC)
- Malware finds 50 generators that it can control and forces them to overload and burn out
 - in some cases causing additional fires and explosions
- Electricity blackout that plunges 15 US states and Washington DC into darkness
- 93 million people without power
- More than 17 TW-Hours of generation is lost – around 12% of supply

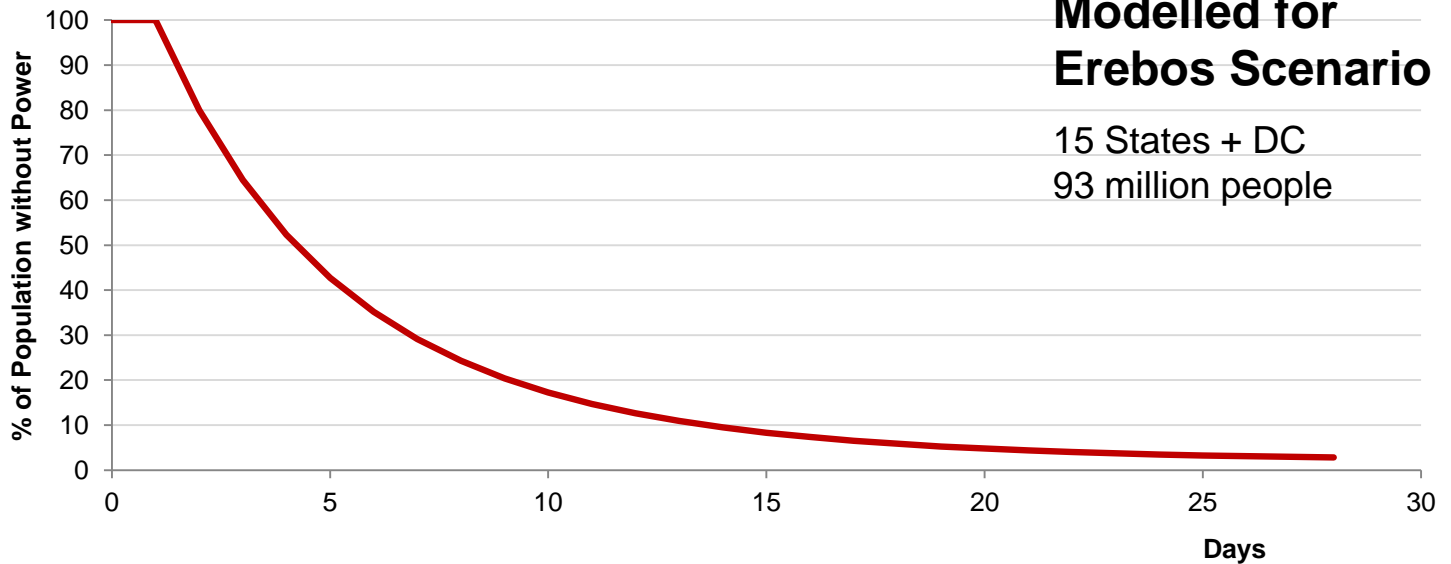


Outage & Restoration of Power



Historical Examples

New York
8 million people

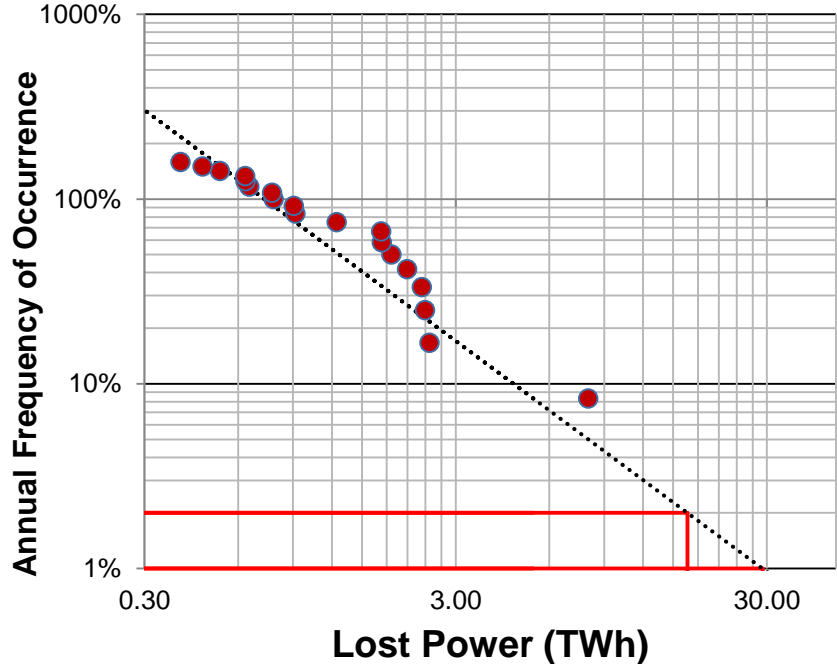


Modelled for Erebus Scenario

15 States + DC
93 million people

Scenario Outage Levels Comparable with Extreme Weather

- Generation supply loss in our scenario is equivalent to extreme outage levels expected from US weather events
- Historical data suggests a weather-related outage of around 17 TWh-hours can be expected with an annual probability of 2%
- We are not assigning a probability to a cyber attack
 - The return period of our scenario is unknown
 - We are providing historical weather disruption for context



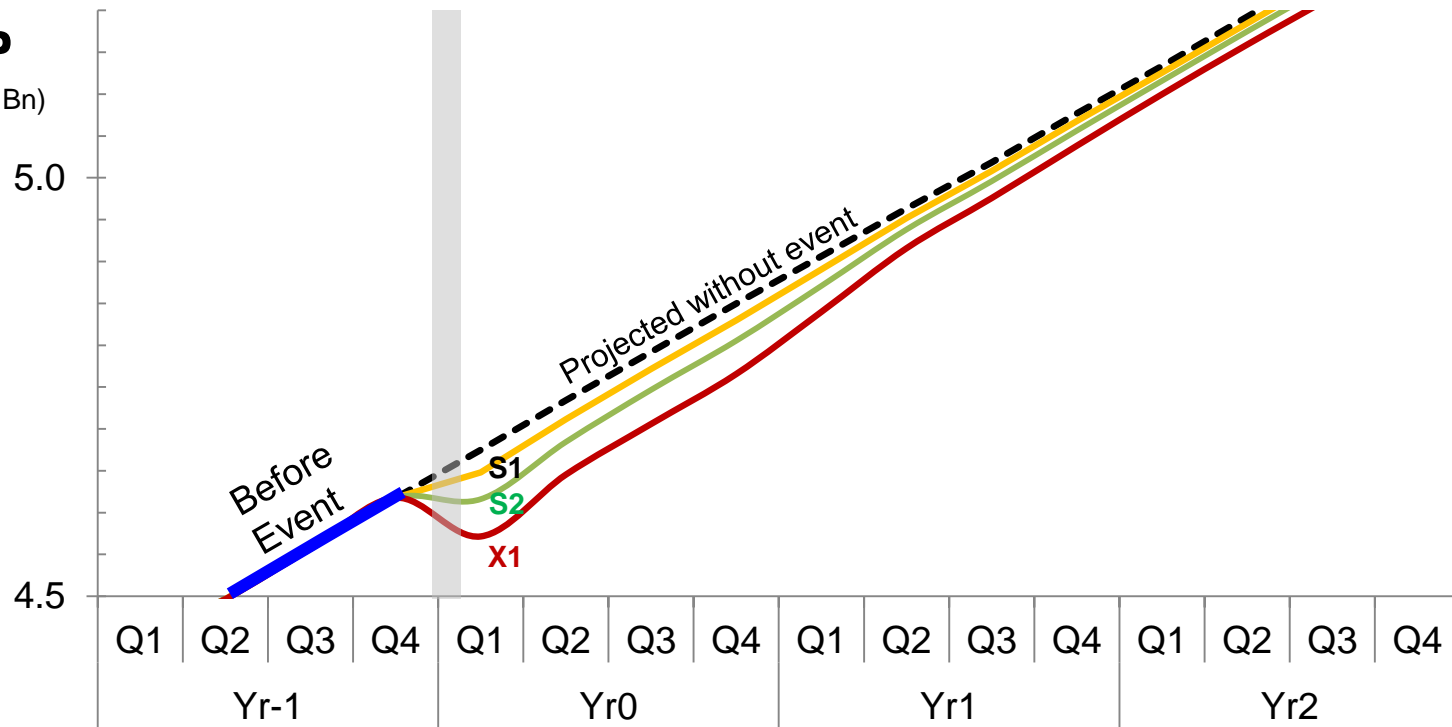
Scenario variants

Peak Demand	190 GW		
Demand Over 30 days	136.8 TWh		
	S1	S2	X1
	13%	27%	46%
	17 TWh	37 TWh	63 TWh

Economic Impact: GDP@Risk

US GDP

(Quarterly US\$ Bn)



Scenario Variant	Outage Duration (to 90% reconnected)	Consumption	Labour	Exports	Confidence	GDP@Risk (5 Yr)
S1	2 Weeks	0.6%	0.6%	1.3%	5%	\$243 Bn
S2	3 Weeks	1.3%	1.3%	2.8%	10%	\$544 Bn
X1	4 Weeks	2.2%	2.2%	4.9%	20%	\$1,024 Bn

Shocks are a proportion of total US output over 1Q

Summary of Erebos Business Blackout Scenario

Scenario Variant	Outage Duration (to 90% reconnected)	Number of Generators Damaged	Economic Output Lost GDP@Risk	Insurance Industry Loss Estimate
S1	2 Weeks	50	\$243 Bn	\$21.4 Bn
S2	3 Weeks	50	\$544 Bn	\$39.9 Bn
X1	4 Weeks	100	\$1,024 Bn	\$71.1 Bn

For context:

- Total insurance catastrophe losses 2014: \$45 Bn
- Hurricane Katrina 2005: \$80 Bn
- Tohoku Earthquake Japan 2011: \$38 Bn
- Superstorm Sandy 2012: \$37 Bn
- Hurricane Andrew 1992: \$28 Bn
- 9/11 WTC 2001: \$26 Bn

[2015 \$ value]

Full details of insurance loss estimation methodology :

<http://www.lloyds.com/news-and-insight/risk-insight/library/society-and-security/business-blackout>



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Risks and Benefits of Artificial Intelligence and Robotics – 6 February



Towards cyber insurance: approaches to data and modelling

Centre for
Risk Studies



Jennifer Copic
Research Associate
Cambridge Centre for Risk Studies

Insurance and Cyber Risk

- Insurance is a risk transfer tool for corporates trying to manage this emerging risk
- Cyber offers potential for market growth and new product development
- Insurers are concerned with accumulation risk due to the potentially systemic impact of an event
 - Regulators are also concerned of accumulation risk in the market
- Insurers themselves have operational exposure to cyber risk

Four Different Types of Cyber Insurance Exposure

- 1. Affirmative Standalone Cyber Cover:** Specific standalone policies for data breach, liabilities, property damage and other losses resulting from information technology failures, either accidental or malicious
 - This is generally known as cyber liability insurance cover (CLIC)
 - Technology errors and omissions (E&O) liability insurance, available as a specific insurance product for the providers of technology services or products to cover both liability and other loss exposures.
- 2. Affirmative Cyber Endorsements:** Cyber endorsements that extend the coverage of a traditional insurance product, such as commercial general liability
- 3. Silent Cyber Exposure – Gaps in Explicit Cyber Exclusions:** There are a range of traditional policies, such as commercial property insurance, that have exclusion clauses for malicious cyber attacks
 - Except certain nominated perils such as: Fire; Lightning; Explosion and Aircraft Impact (FLEXA)
- 4. Silent Cyber Exposure – Policies without Cyber Exclusions:** Many insurance lines of business incorporate 'All Risks' policies without explicit exclusions or endorsements for losses that might occur via cyber attacks

Cyber Loss Coverage Categories

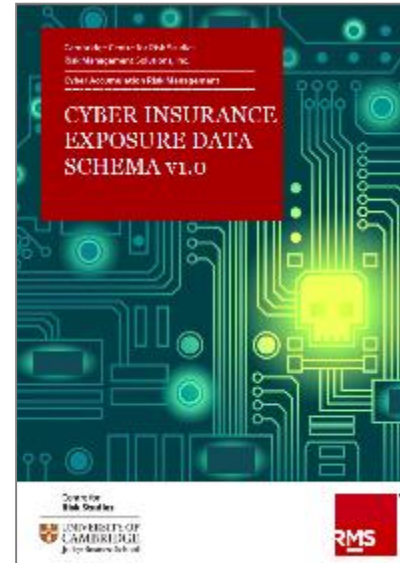
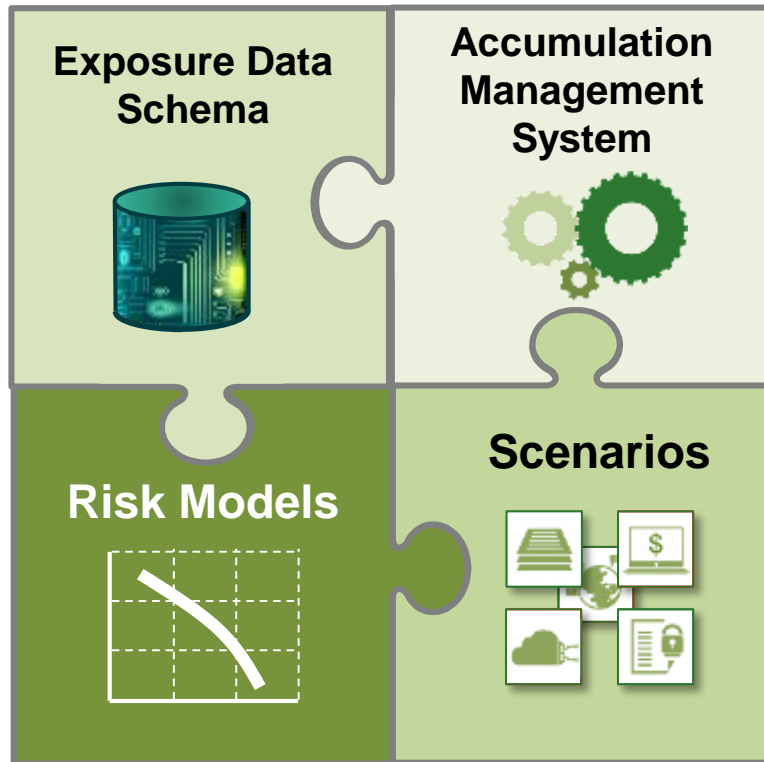
- Wide variation in coverage language
 - No two cyber products are the same
- Additionally, insurers need to capture cyber attribute data, such as
 - Number of records of PII
 - Named cloud providers
 - Named payment system providers

v1.0 Code	Cyber Loss Coverage Category	% of Products Offering this Cover (Sample of 26)
1	Breach of privacy event	92%
2	Data and software loss	81%
6	Incident response costs	81%
15	Cyber extortion	73%
4	Business interruption	69%
12	Multi-media liabilities (defamation and disparagement)	65%
7	Regulatory and defence coverage	62%
14	Reputational damage	46%
3	Network service failure liabilities	42%
5	Contingent Business Interruption	33%
9	Liability – Technology Errors & Omissions	27%
10	Liability – Professional Services Errors & Omissions	23%
13	Financial theft & fraud	23%
16	Intellectual property (IP) theft	23%
18	Physical asset damage	19%
19	Death and bodily injury	15%
11	Liability – Directors & Officers	13%
8	Liability – Product and Operations	8%
17	Environmental damage	4%

Coverage categories adapted from [UK Government and Marsh](#), UK Cyber Security: The Role of Insurance in Managing and Mitigating the Risk, March 2015

Cyber Catastrophe Scenarios for Insurance Accumulation Management

Industry Organizations Supporting the Schema



Jan 2016
v1.0
First complete schema

RAA

Reinsurance
Association
of America

LLOYD'S

Lloyd's

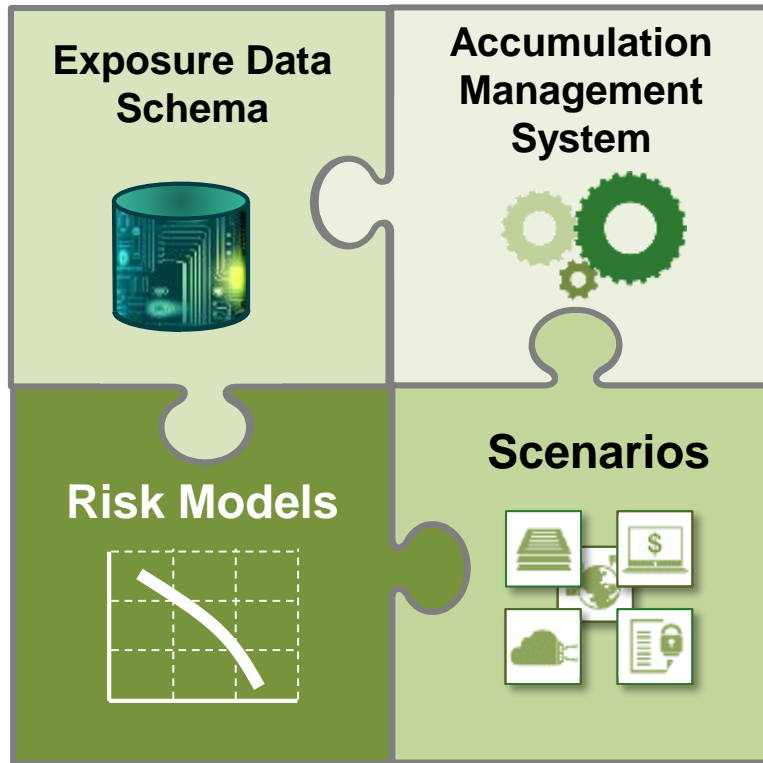


Lloyd's
Market
Association



Chief Risk
Officer Forum

Cyber Catastrophe Scenarios for Insurance Accumulation Management



Affirmative cyber attack scenarios developed by
Centre for Risk Studies
Deployed in CAMS v1.0



Data Exfiltration
(‘Leakomania’)



Denial of Service Attack
(‘Mass DDoS’)



Cloud Service Provider Failure
(‘Cloud Compromise’)



Cyber Heist
(‘Financial Theft’)

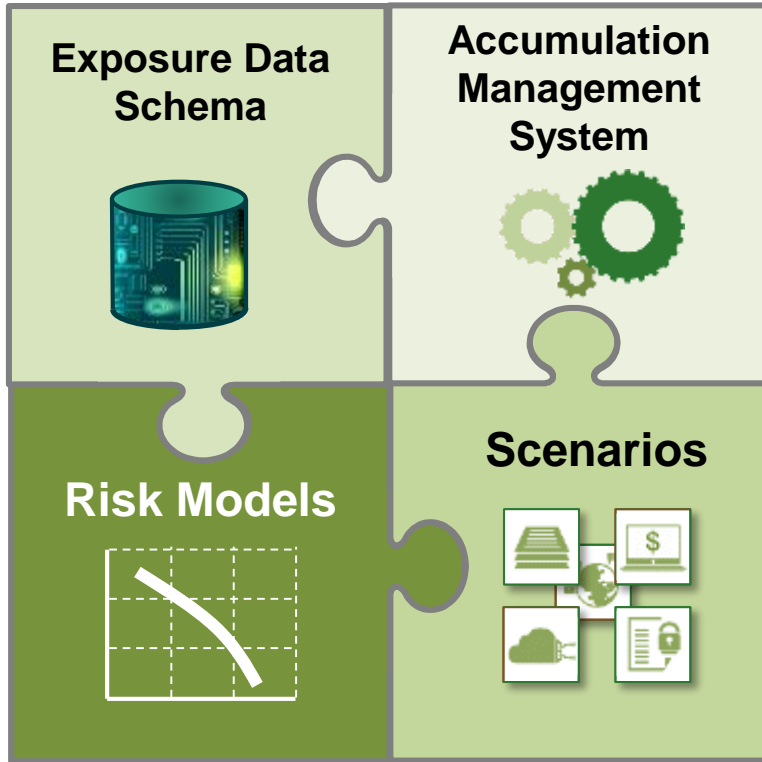


Ransomware
(‘Extortion Spree’)



ShadowBrokers
(‘ExtraBacon Exploited’)

Cyber Catastrophe Scenarios for Insurance Accumulation Management



Silent cyber attack scenarios developed by Centre for Risk Studies
Deployed in CAMS v2.0



Cyber-Induced Fires in Commercial Office Buildings
(Laptop batteries fire induction')



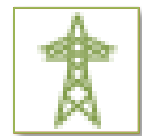
Cyber-Enabled Marine Cargo Theft from Port
(‘Port Management System’)



ICS-Triggered Fires in Industrial Processing Plants
(‘ICS Attack’)



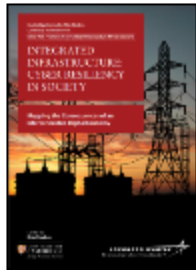
PCS-Triggered Explosions on Oil Rigs
(‘Phishing-Triggered Explosions’)



Regional Power Outage from Cyber Attack on US Power Generation (‘Business Blackout’) S1, X1



Regional Power Outage from Cyber Attack on UK Power Distribution (‘Integrated Infrastructure’)



Lloyd's Cyber Realistic Disaster Scenarios (RDS)

CRS Cyber Scenarios

1. Data Theft from an Aggregator



Data Exfiltration
(Variant of 'Leakomania')

2. Cloud Computing Service Provider



Cloud Service Provider Failure
(‘Cloud Compromise’ Reference View)

3. Northeast Blackout Scenario S1



Attack on **US Power Generation**
(‘Business Blackout Scenario S1’)

4. Northeast Blackout Scenario X1



Attack on **US Power Generation**
(‘Business Blackout Scenario X1’)

5. UK Blackout Scenario



Attack on **UK Power Distribution**
(‘Integrated Infrastructure’)

6. Offshore Energy – MODU DP attack



Version in development
Different attack vector

7. Aviation – navigation control attack

8. Marine – ballast control system attack



Version in development
Different attack vector

Lloyd's have opted to only require the Northeast Blackout (Erebos) Scenario for future reporting



Insurance Loss Estimate

Power Generation Companies		\$ millions
	Property Damage (Generators)	633
	Business Interruption (Generator Damage)	3,817
	Incident Response Costs	3
	Fines - FERC/NERC	4
	Other liabilities	-
Defendant Companies		
	Liability	2,253
Companies that Lose Power		
	Perishable Contents	595
	Contingent Business Interruption - Suppliers Extension	6,769
	Liability	3,120
Companies Indirectly Affected		
	Contingent Business Interruption - Critical Vendor	2,928
	Liability	749
Homeowners		
	Household Contents	465
Specialty		
	Event Cancellation	63
Total		\$ 21,398



Panel Discussion 1: Triangle of Pain

- Accountability and responsibility of cyber
- When there is a disassociation of asset owners to customers and markets, who has culpability?
- Are there sector views?
 - Health
 - Energy
 - Media

Panel Discussion 2: Economic Consequences of Cyber

Total GDP loss is on scale of some large natural catastrophe events

- Would the public find GDP loss compelling within the cyber security discussion?
- What other metrics might the public find more informational than GDP loss?
- What are some other consequences of a large scale cyber threat?

Panel Discussion 3: Regulation of Cyber

Regulation exists to address health, safety, standards, public good, etc.

- Currently, lack of governmental incentives in regulation on cyber security standards for preparedness.
- What might a regulator of cyber look like for different sectors; major considerations?
 - Health
 - Energy
 - Media

Panel Discussion 4: Final Thoughts on Cyber

- Is there a step change in the way cyber security threats should be considered in the future?
- How can cyber security threats be managed as AI & autonomous systems become more pervasive
 - Health
 - Energy
 - Media

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<http://www.jbs.cam.ac.uk/faculty-research/centres/risk/>