

Team Meeting

How to Measure Anything in Cybersecurity Risk

Ben Goldsworthy, Brand New Consultant

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Introduction

- **Lancaster University** alumnus
 - BSc. (Hons) Computer Science
 - MSc. Cyber Security
- Doing IT 'stuff' for **~9 years**
- **Software development** background
- Previously: researching **IT threat intelligence** analysis and presentation techniques, theoretically underpinned by **quantitative approaches** to risk assessment

Pop Quiz, Hotshot



Pigeon thanks to MostafaElTurkey36 (Pixabay License)
Fish thanks to icon0 (CC0 1.0)

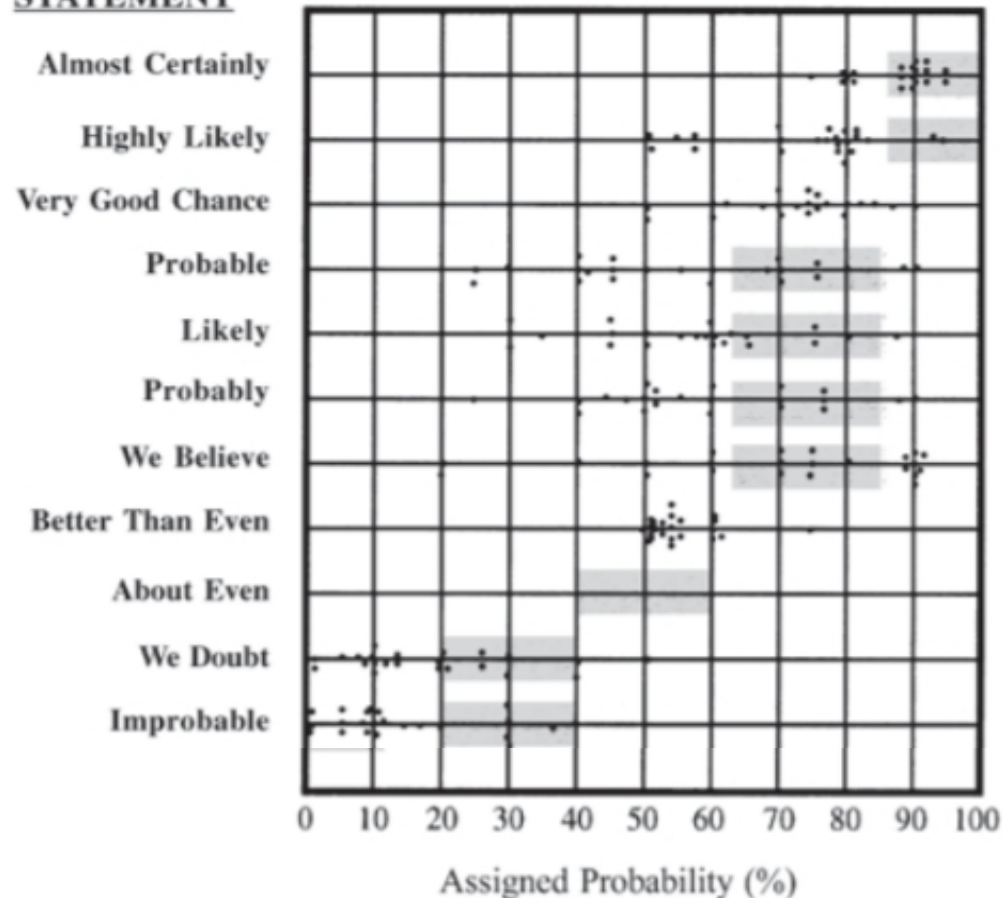
Risk Matrix

		Severity				
		Very low	Low	Medium	High	Very high
Probability	Very high					
	High					
	Medium					
	Low					
	Very Low					

Words of Estimative Probability

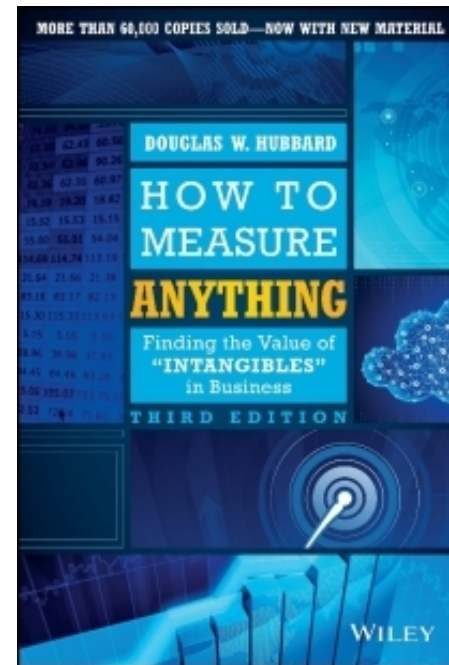
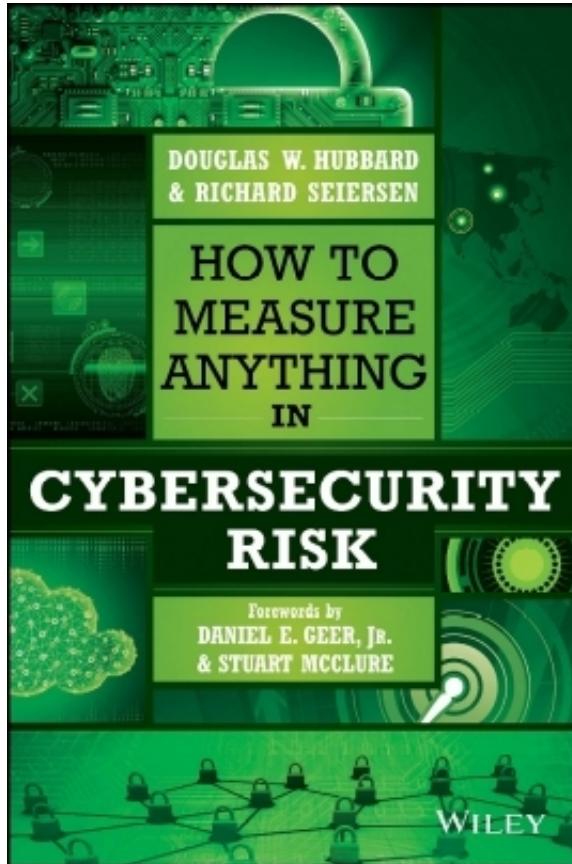
Figure 18: Measuring Perceptions of Uncertainty

STATEMENT



Richards J. Heuer, *Psychology of Intelligence Analysts* (1999)

How to Measure Anything...



Key Assertions

- ‘There is **no evidence** that the types of scoring and risk matrix methods widely used in cybersecurity improve judgement.’
- ‘On the contrary, there is evidence these methods add noise and error to the judgement process. One researcher...goes as far as to say they can be “**worse than random.**”’
- ‘Any appearance of “working” is probably a type of “**analysis placebo.**”’
- ‘There is overwhelming evidence...that **quantitative, probabilistic methods are effective.**’

What is 'measurement'?

Concept

Object

Methods

What is 'measurement'?

Concept

Measurement: A quantitatively-expressed reduction of uncertainty based on one or more observations

Scales of Measurement

Concept

- **Nominal**
- **Ordinal**
- **Interval**
- **Ratio**

Interval and Ratio Scales

Concept

- **Interval:** degrees Celcius
- **Ratio:** pounds and pence
- Well-defined unit of size
- Can compare values
 - e.g., 6 is 2 more than 4
- Can't multiply or divide intervals
 - e.g., 6 is not '50% more' than 4
 - e.g., 6°C is not 'twice as hot' as 3°C

Nominal Scale

Concept

- No implied order or magnitude
 - e.g., gender, location
- Each state scale is just a *different* state, not a higher or lower state

Ordinal Scale

Concept

- Denote an order, but not by how much
 - e.g., privileges, 1 to 5 (counter-intuitively)

Nominal and Ordinal Scales

Concept

- Most mathematical operations are not applicable
- Still **can be** informative
- Prone to mathematical abuse

Nominal and Ordinal Scales

Concept

- ‘Geologists don’t multiply Mohs hardness scale variables times [a] rock’s color.’

Bayesian Measurement

Concept

- **Probability:** the state of uncertainty of an observer (a.k.a. 'degree of belief')

The Object of Measurement

Object

- Can you unambiguously define the **object** of measurement?
 - e.g., 'Damage to reputation'
- What do you mean, **exactly**?

Clarification Chain

Object

1. If it matters at all, it is detectable/observable
2. If it is detectable, it can be detected as an amount (or range of possible amounts)
3. If it can be detected as a range of possible amounts, it can be measured

Thought Experiment

Object

- Imagine a **clone** of your organisation
- Call one the 'test' org., and one the 'control' org.
- Imagine that the 'test' org. has experienced a little bit more '**damage to reputation**', whilst holding the amount in the 'control' org. constant
- What do you imagine you would actually observe?
 - Long- or short-term drop in sales?
 - Difficulty recruiting top applicants?
 - Cost of PR to offset consequences?

Risk



Object

- **Risk:** A state of uncertainty where some of the possibilities involve a loss, catastrophe or other undesirable outcome
- **Measurement of Risk:** A set of possibilities, each with quantified possibilities and quantified losses

Risk

Methods

- ‘Cybersecurity is **not** some exceptional area **outside the domain of statistics** but rather **exactly the kind of problem** statistics was made for.’

Small Samples

Methods

- Consider a population of **1,000 different-sized widgets**
- You take a random sample of **five widgets**
- What is the chance that the **median** of the entire population (the point at which half the population is below and half above) is **between the largest and smallest** of that sample?
- **93.75%**

Rule of Five

Methods

- Chance of randomly picking a value **above the median**: 50%
- Chance of randomly selecting five values that are **all above** the median:
 -
 - Ditto for **all below** the median
- Chance of **not** getting all above/below:
 -

One-for-one Substitution

- Instead of:
- Rating **likelihood** on a scale of 1 to 5
- Rating **impact** on a scale of 1 to 5
- Plotting likelihood and impact scores on a **risk matrix**
- Further dividing the risk matrix into **risk categories** and guessing what you should do
- We substitute:
- Estimating the **probability of the event happening** in a given period of time
- Estimating a 90% confidence interval for a **monetized loss**
- Using the quantitative likelihood and impact to generate a **loss exceedance curve**
- Comparing the loss exceedance curve to a **risk tolerance curve** and prioritising actions based on return on mitigation

But wait!

- How do we add/subtract/multiply/divide when we have no exact values, **only ranges**?

Monte Carlo Simulations

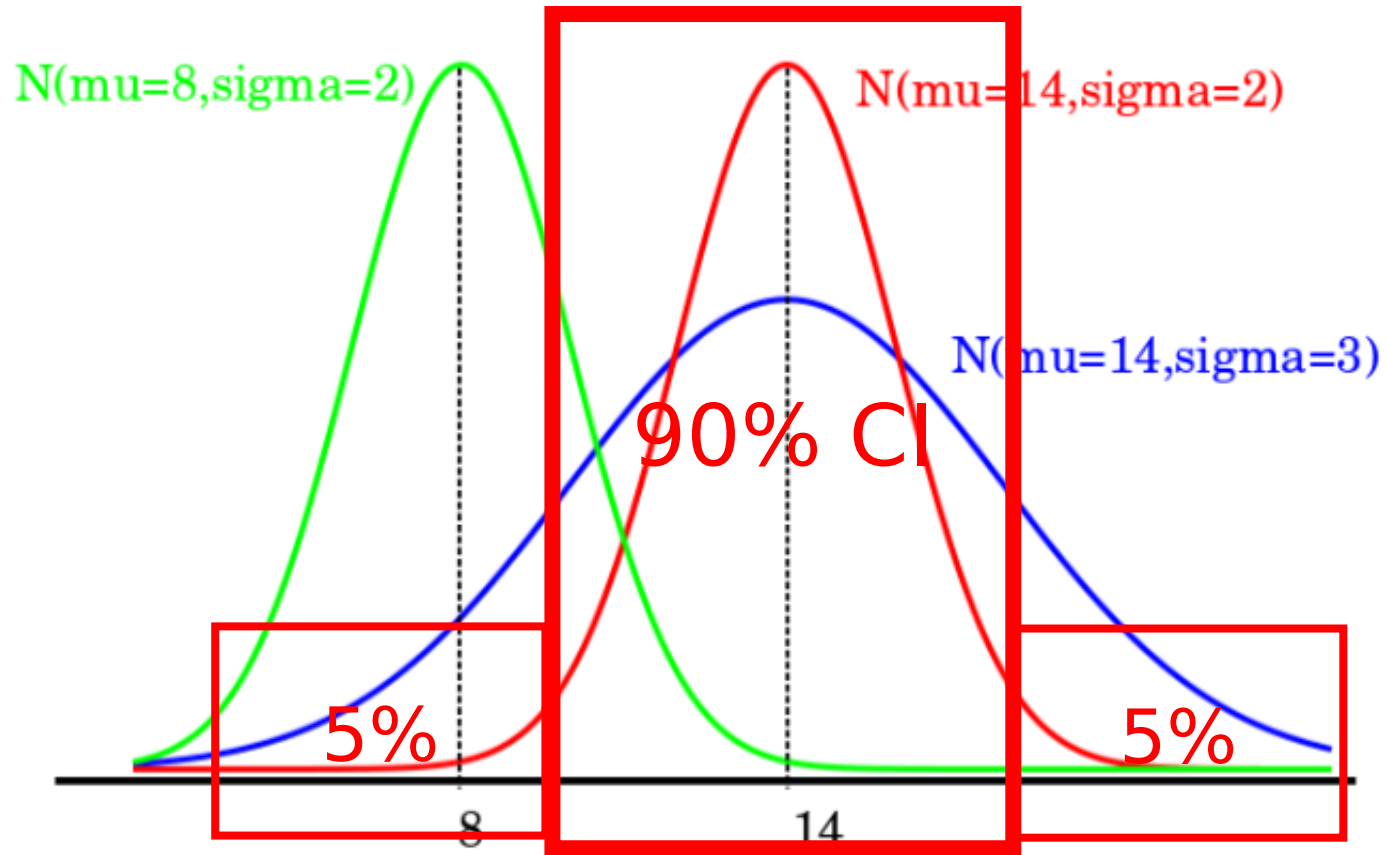


© Antoine Taveneaux (CC BY-SA 3.0)

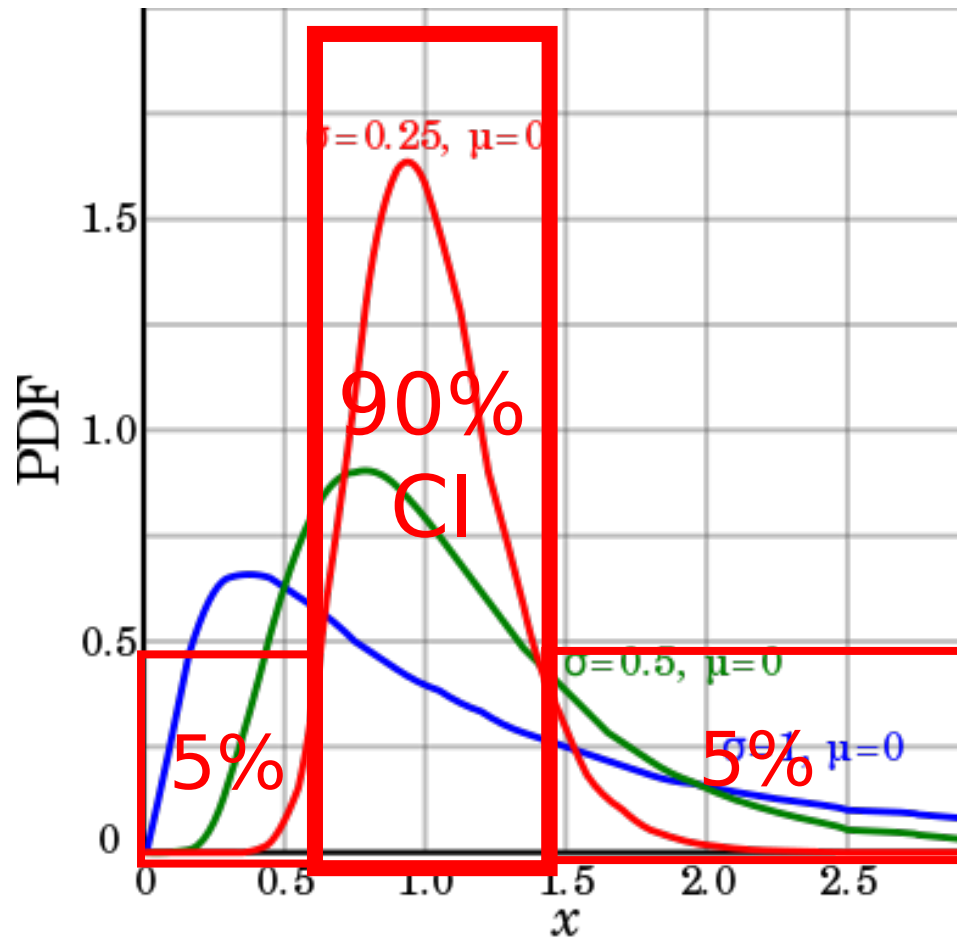
Intro. to Monte Carlo Simulations

1. Run a **large number of simulations** of your org. over a period of time (e.g., 1 year)
2. For each simulation, test whether an **event occurred** or not
3. For each simulation in which an event occurred, determine the **cost of the event**
4. Repeat steps 2 & 3 for each simulation, to taste
5. At the end of the full run of simulations, perform **what-if analyses** on the results

Normal Distribution



Log-normal Distribution

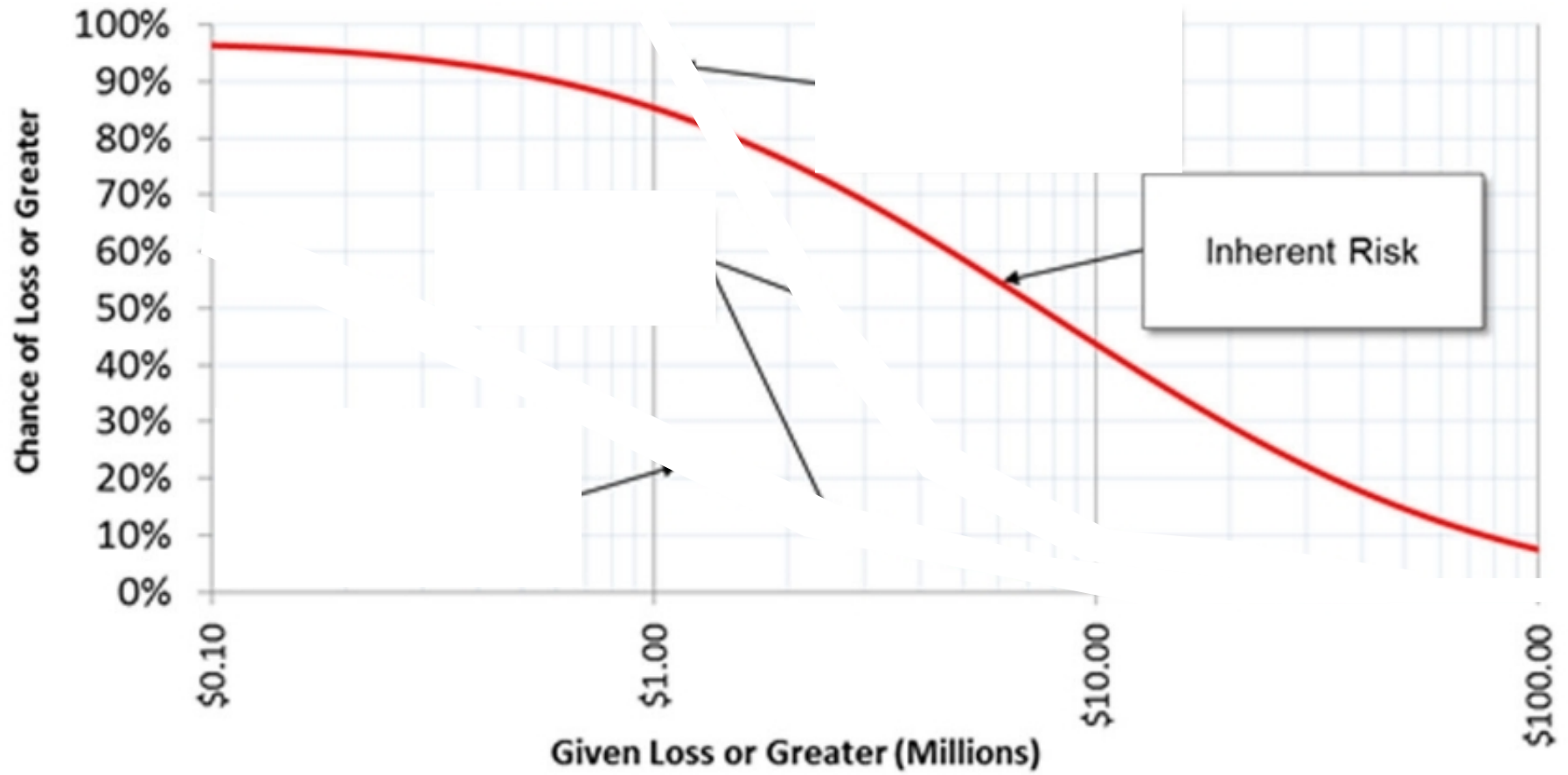


Thanks to Krishnavedala (CC0 1.0)

Example Monte Carlo Simulation

- Event has a probability of 0.15 (i.e., it happens 15% of the time)
- For each simulation run, test
- If 1, sample from a cost distribution
- Repeat as desired
- Sum the total losses for the simulation run
- Repeat for n simulation runs

Loss Exceedance Curve



Real Example: CSBS 2020



 Department for
Digital, Culture,
Media & Sport

 Ipsos MORI

Cyber Security Breaches Survey 2020

The Cyber Security Breaches Survey is a quantitative and qualitative study of UK businesses and charities. It helps these organisations to understand the nature and significance of the cyber security threats they face, and what others are doing to stay secure. It also supports the government to shape future policy in this area.

For this latest release, the quantitative survey was carried out in winter 2019 and the qualitative element in early 2020.

Responsible analyst:
Emma Johns
07990602870

Statistical enquiries:
cyber.survey@culture.gov.uk
@DCMSinsight

General enquiries:
enquiries@culture.gov.uk

Media enquiries:
020 7211 2210

Correction note:
This publication was updated on 18 June 2020 to include the percentage of charities that reported their most disruptive breach to senior management (59%) on page 48.

Real Example

Likelihood

Figure 5.1: Percentage of organisations that have identified breaches or attacks in the last 12 months

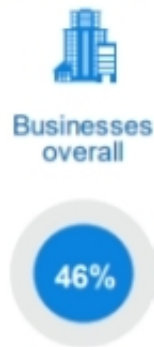


Figure 5.4: How often organisations have experienced breaches or attacks experienced in the last 12 months

■ % only once ■ % less than once a month ■ % once a month ■ % once a week
■ % once a day ■ % several times a day ■ % don't know



Real Example Likelihood

§

§

§

§

§ Estimated category frequency boundaries =

§

§ Insert values from *CSBS*:

§

Real Example Likelihood

§ Pareto cumulative distribution function:

§

§

§ Therefore, for :

§

§

Real Example

Likelihood

§ Run simulations using formula (where u is a uniform random number:

§

§

§ Results from 10,000 iterations:

§

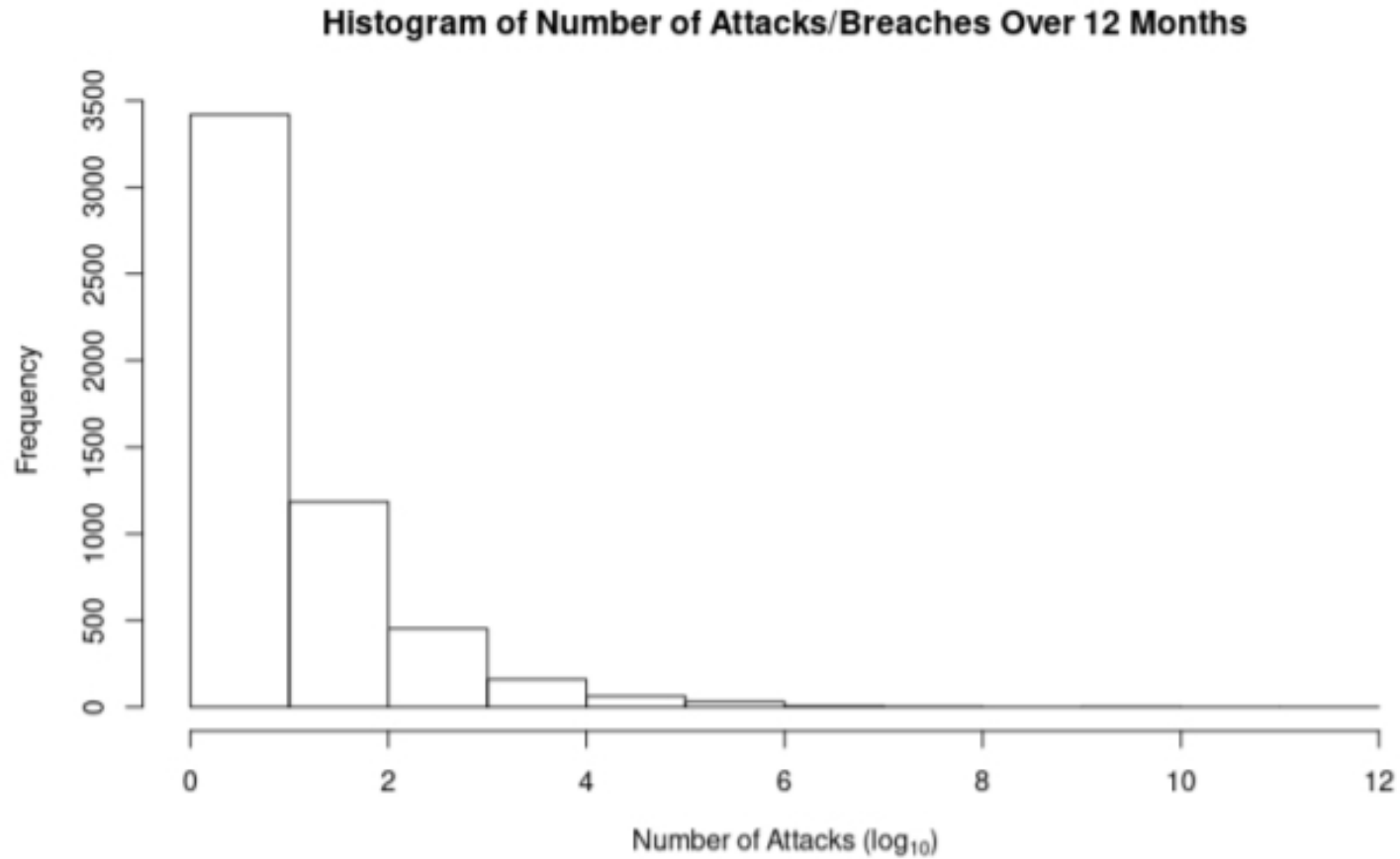
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Real Example Likelihood



Real Example

Cost

Table 5.1: Average cost of all breaches or attacks identified in the last 12 months¹³

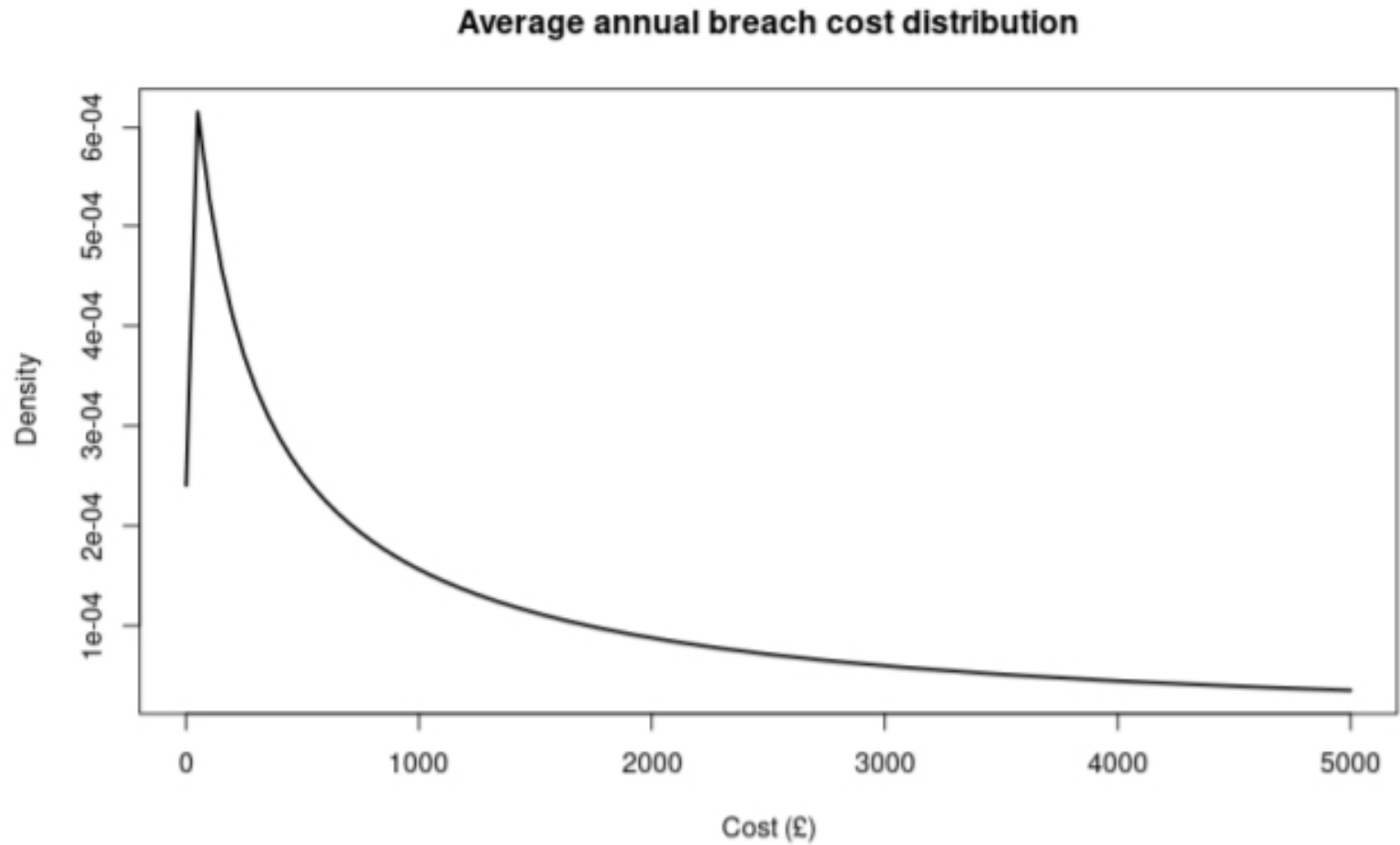
All businesses	
	Only across organisations identifying breaches with an outcome
Mean cost	£3,230
Median cost	£274
Base	160

Real Example

Cost

- § To plot log-normal distribution, need mean () and standard deviation ()
- § CSBS provides the mean (£3,230), which we can use along with the median (, £274) to calculate the , and then the :
 - §
 - §
 - §
 - §
 - §

Real Example Cost



Real Example

Monte Carlo Simulation

§ Let = 'number of attacks' distribution

§ Let = 'cost of attack' distribution

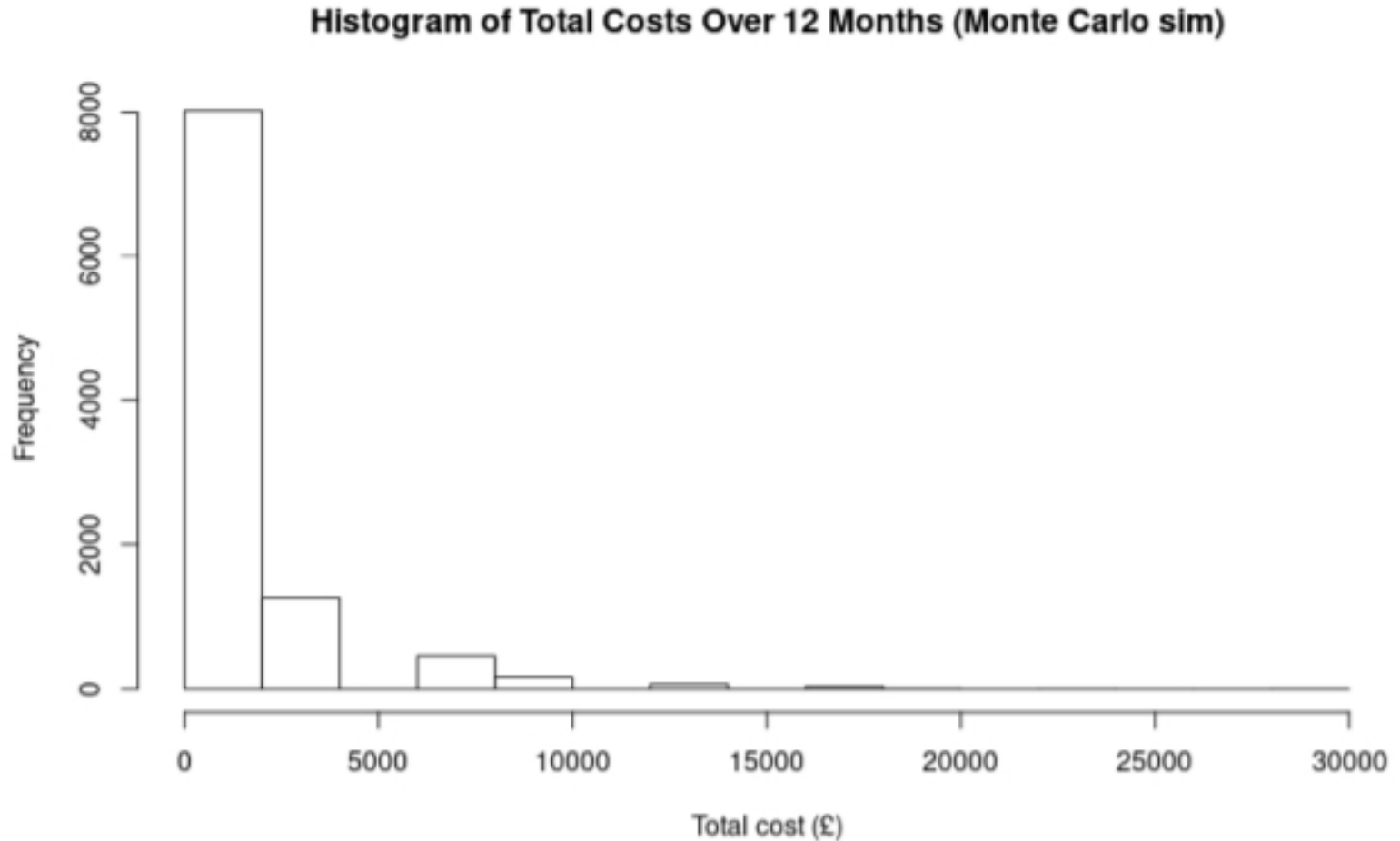
§

§

§ Annual cost =

Real Example

Monte Carlo Simulation



Real Example

Monte Carlo Simulation

§
§
§
§
§

Table 5.1: Average cost of all breaches or attacks identified in the last 12 months¹³

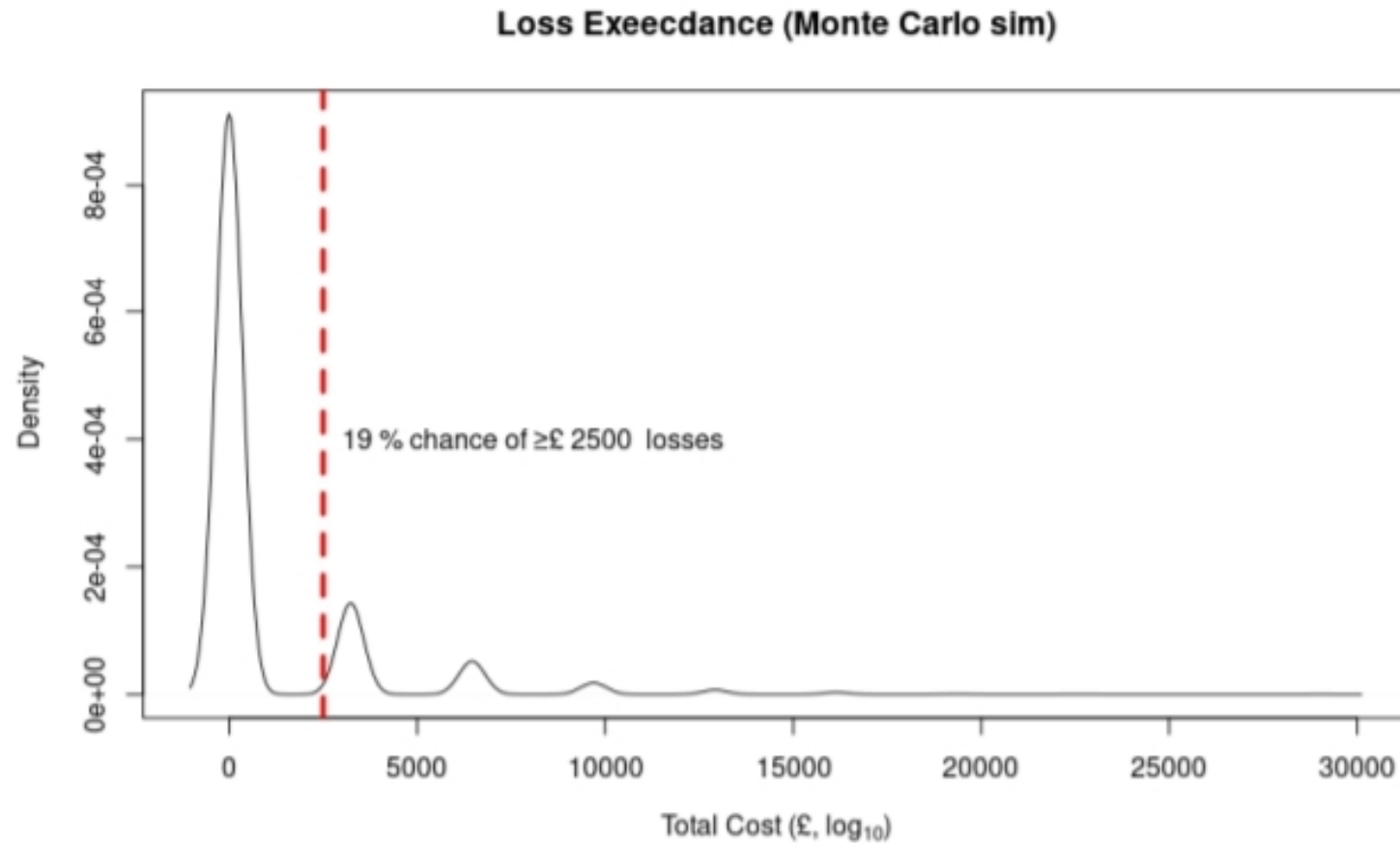
All businesses

Across organisations identifying any breaches or attacks

Mean cost	£1,010
Median cost	£0
Base	710

Real Example

Loss Exceedance Curve



Real Example

Other Data in the CSBS 2020

Figure 5.1: Percentage of organisations or attacks in the last 12 months



Figure 5.2: Percentage that have identified the following types of breaches or attacks in the last 12 months, among the organisations that have identified any breaches or attacks¹²

Businesses Charities



Figure 5.7: How long it took to get back to normal after a breach or attack

% no time at all
% one month or more

Businesses



Charities



Table 5.2: Average direct cost of the most disruptive breach or attack from the last 12 months

	All businesses	Micro/small businesses	Medium/large businesses	All charities
Across organisations identifying any breaches or attacks				
Mean cost	£602	£580	£1,090	£661
Median cost	£0	£0	£0	£0
Base	688	421	267	126
Only across organisations identifying breaches with an outcome				
Mean cost	£2,350	£2,340	£2,470	Too few charities to analyse
Median cost	£0	£0	£253	Too few charities to analyse
Base	150	83	67	Too few charities to analyse

Wrapping Up

- § Non-quantitative methods are **at best** not particularly useful
- § Numbers **do not** a quantitative scale make
- § If you can't figure out how to measure something, you're **trying to measure the wrong thing**
- § You can gain valuable information by analysing **small samples**
- § Measurement is not an action leading to a single definitive value, it is a continuous process of progressive **uncertainty reduction**
- § Distributions and **Monte Carlo simulations** are your friends

Further Reading

§ *How to Measure Anything in Cybersecurity Risk*

- § Effects of the **analysis placebo**

- § Using Bayesian methods

- § Exercises to **calibrate estimation ability**

- § **Decomposition techniques**

- § And a bunch of other neat things!

§ My research project

- § Quantifying the impacts and costs of different **control measures**

- § Feeding these into the simulation model

- § **Complex what-if analyses**

- § Provide suggestions on most **cost-effective controls** to implement

- § Message me on Mattermost/email [REDACTED] for more details

**Questions, Quibbles,
Quomments?**
