

How to optimize cybersecurity control decisions when supporting data is scarce



Robert D. Brown III
Cybersecurity Risk Management Leader
Resilience Insurance

Introduction

Robert Brown

- 25+ year career as a decision & risk analysis advisor across multiple commercial verticals
- Past RAW contributor
 - 2019 – Value of information on continuous variables
 - 2020 – Bayesian method for judging the likely scenario in a defined set that is unfolding
 - 2021 – Measuring the value of carbon (\$/tonne) and its effect on selecting green initiatives
- Author of *Business Case Analysis with R - Simulation Tutorials to Support Complex Business Decisions* (Springer-Nature/Apress, 2018)
- Joined Resilience Insurance in May 2022, reporting to Richard Seiersen, co-author of *How to Measure Anything in Cybersecurity Risk* (Wiley, 2016) and *The Metrics Manifesto* (Wiley, 2022)

Cybersecurity requires balancing multiple business concerns

**Security and
Operational
Resilience**



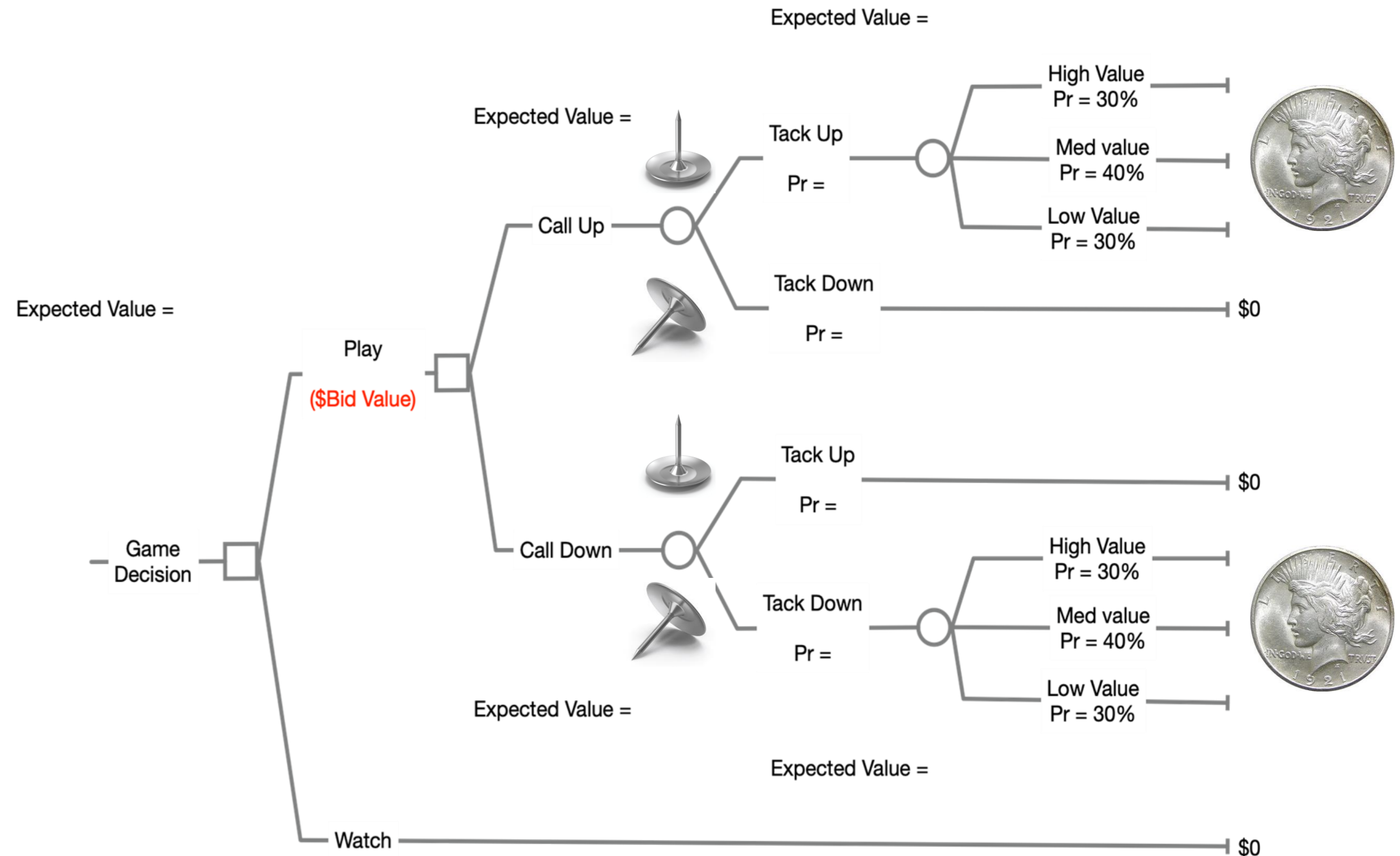
**Alternate
Responsible
Uses of Capital**

**Varying
Information
Quality**

**Competing
Values and
Preferences**

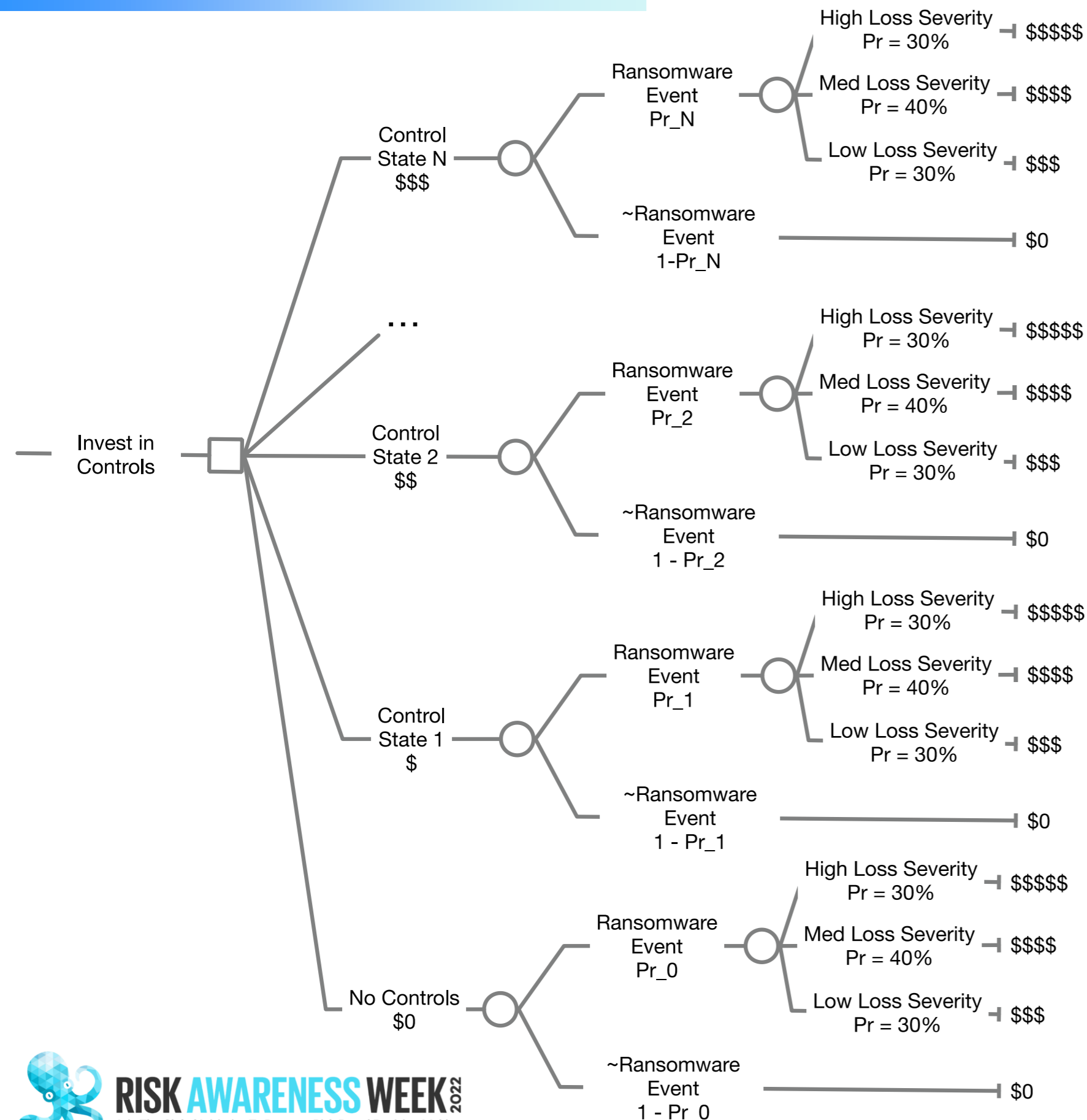
Probabilities don't exist, but they do matter

- Probabilities are analogous to discount rate in discounted cash flow analysis, which allows us to compare alternate choices of cash flows in time.
- Probabilities are the mental tool we use to compare alternate choices of games of chance that yield different payoffs if they materialize.



The thumb tack game represents the essential elements of any allocation decision

How does this apply to cybersecurity (e.g., ransomware)?



- Optimization goal: choose the control state that minimizes the expected value of material ransomware event losses.
- Loss Severity and Cost of Control State (i.e., configuration) might be uncertain, but are reasonably bounded and assessed by SMEs directly.
- Probability that a ransomware event results in a material loss given a Control State is a little more difficult to assess across the multiple levels of control states.
- Probability of the ransomware event is the connective tissue between the investment decision and the desired payoff.

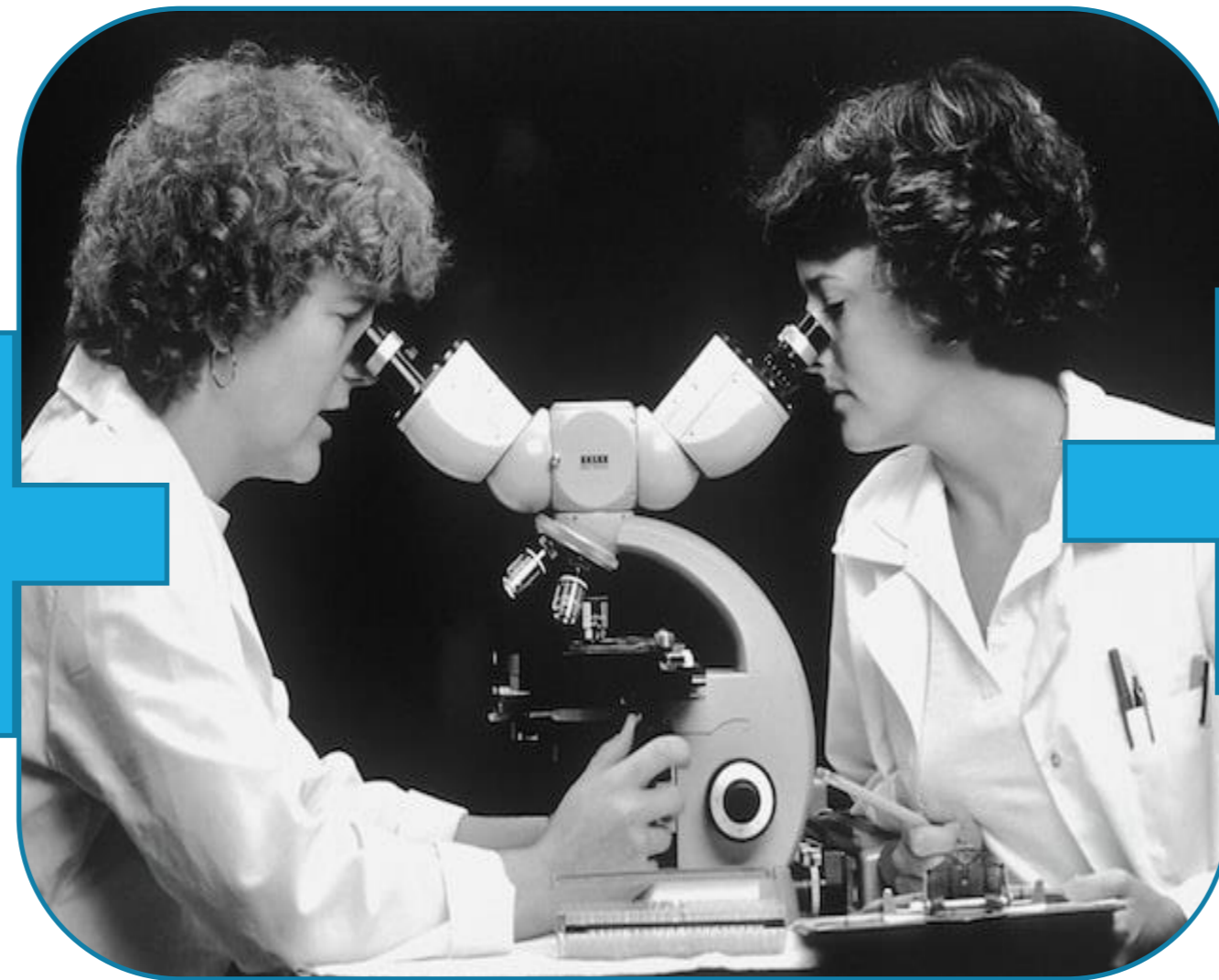
The alchemy of probabilities

Actuarial Tables

The Table of CASUALTIES.

The Year of our Lord	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60	61	62	63	64	65	66	67	68	69	70	71	72	73	74	75	76	77	78	79	80	81	82	83	84	85	86	87	88	89	90	91	92	93	94	95	96	97	98	99	100																																				
Age and Solibens	135	134	133	132	131	130	129	128	127	126	125	124	123	122	121	120	119	118	117	116	115	114	113	112	111	110	109	108	107	106	105	104	103	102	101	100	99	98	97	96	95	94	93	92	91	90	89	88	87	86	85	84	83	82	81	80	79	78	77	76	75	74	73	72	71	70	69	68	67	66	65	64	63	62	61	60	59	58	57	56	55	54	53	52	51	50	49	48	47	46	45	44	43	42	41	40	39	38	37	36	35	34	33	32	31	30	29	28	27	26	25	24	23	22	21	20	19	18	17	16	15	14	13	12	11	10	9	8	7	6	5	4	3	2	1	0
Age and Solibens	135	134	133	132	131	130	129	128	127	126	125	124	123	122	121	120	119	118	117	116	115	114	113	112	111	110	109	108	107	106	105	104	103	102	101	100	99	98	97	96	95	94	93	92	91	90	89	88	87	86	85	84	83	82	81	80	79	78	77	76	75	74	73	72	71	70	69	68	67	66	65	64	63	62	61	60	59	58	57	56	55	54	53	52	51	50	49	48	47	46	45	44	43	42	41	40	39	38	37	36	35	34	33	32	31	30	29	28	27	26	25	24	23	22	21	20	19	18	17	16	15	14	13	12	11	10	9	8	7	6	5	4	3	2	1	0

Subject Matter Experts



Bookies



Formalized and peer reviewed empirical data

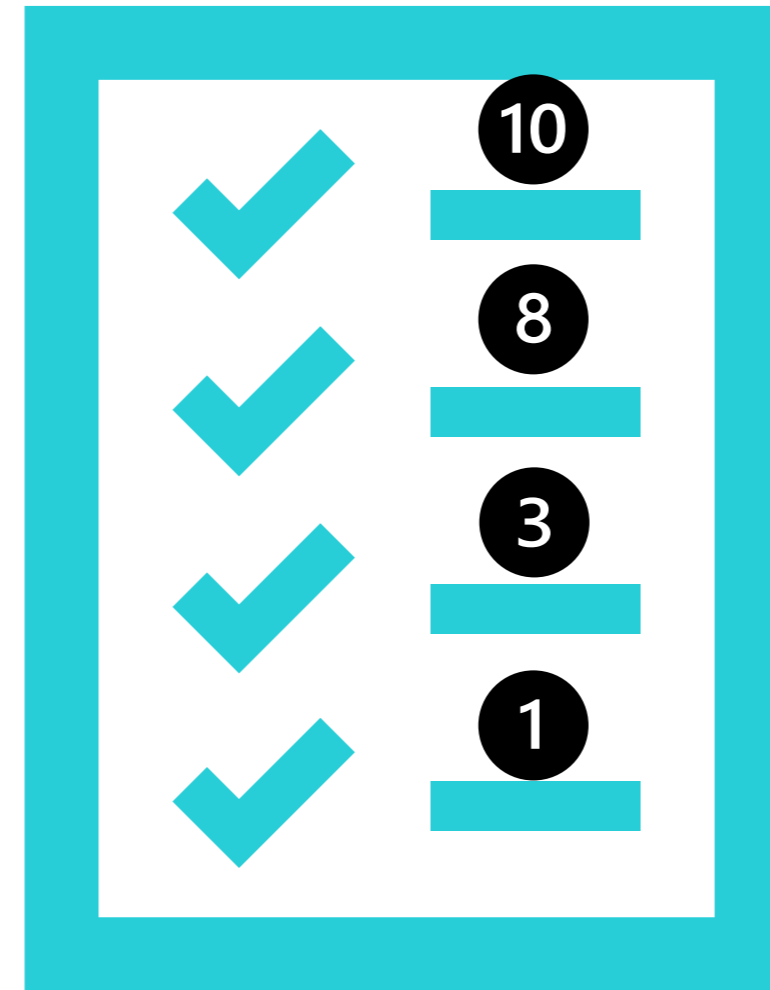
People who possess fine-grained understanding of causal factors

People who aggregate and synthesize information to set odds

On the care and feeding of your SMEs



Iteratively Calibrate

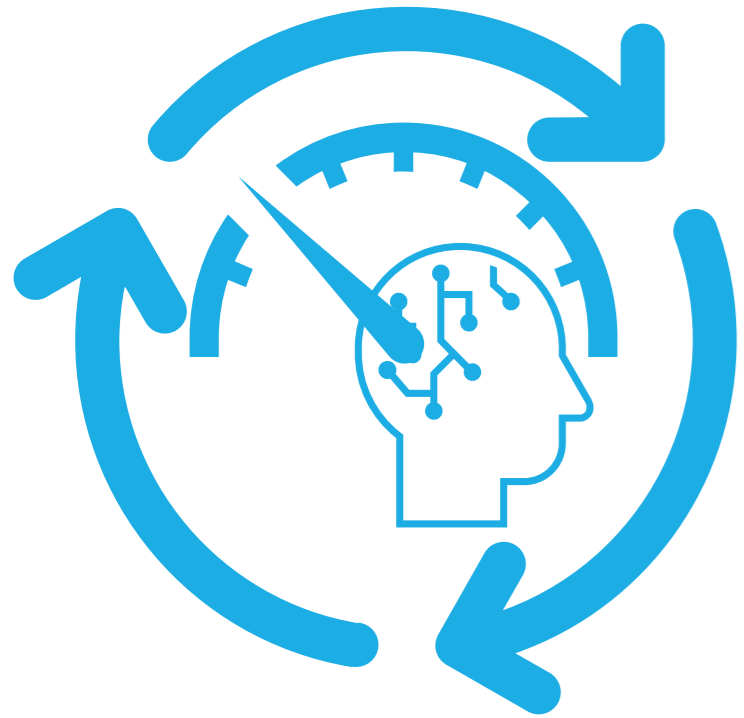


Keep a Running Score



Employ Best for Real Assessments

Calibrate and Score

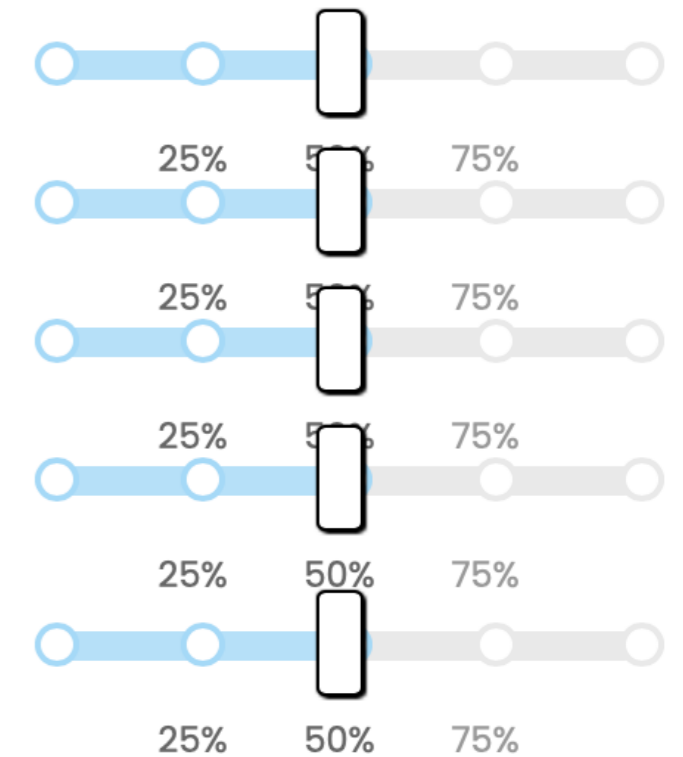


Iteratively Calibrate

Question

1. The melting point of tin is higher than the melting point of aluminum.
2. In English, the word "quality" is more frequently used than the word "speed".
3. Any male pig is referred to as a hog.
4. California's giant sequoia trees are named for an early 19th century leader of the Cherokee Indians.
5. The Model T was the first car produced by Henry Ford.

Probability Statement is True

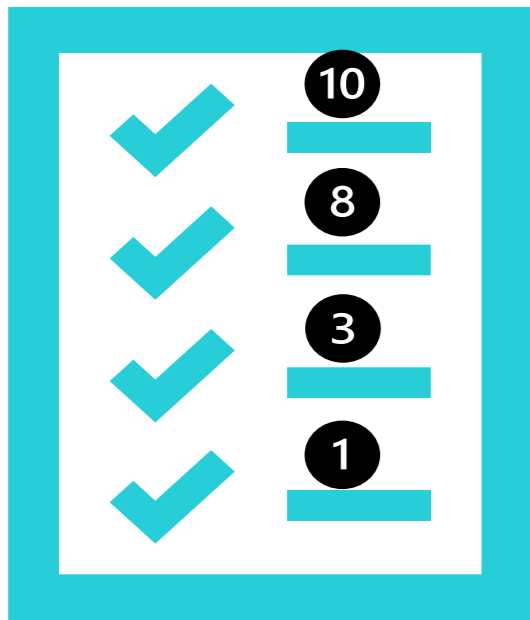


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Submit Quiz

The Brier Score



Keep a Running Score

Database of Assessments and Scores

	forecast	outcome	sqr_error
1	0.75	1	0.0625
2	0.61	0	0.3721
3	0.56	1	0.1936
4	0.60	1	0.1600
5	0.68	1	0.1024
6	0.38	1	0.3844
7	0.68	1	0.1024
8	0.27	1	0.5329
9	0.68	1	0.1024
10	0.43	1	0.3249
11	0.85	0	0.7225
12	0.71	0	0.5041
13	0.69	1	0.0961
14	0.56	0	0.3136
15	0.71	1	0.0841

- Developed by Glenn Brier, a meteorologist, to provide feedback to improve quality of weather forecasts.
- A strictly proper scoring rule that measures the accuracy of probabilistic predictions.
- Equivalent to the mean squared error as applied to predicted probabilities.

$$BS = \frac{1}{N} \sum_{k=1}^N (f_k - o_k)^2$$

<https://docs.lib.noaa.gov/rescue/mwr/078/mwr-078-01-0001.pdf>

Perform virtual experiments with the calibrated SMEs



Employ Best for
Real Assessments

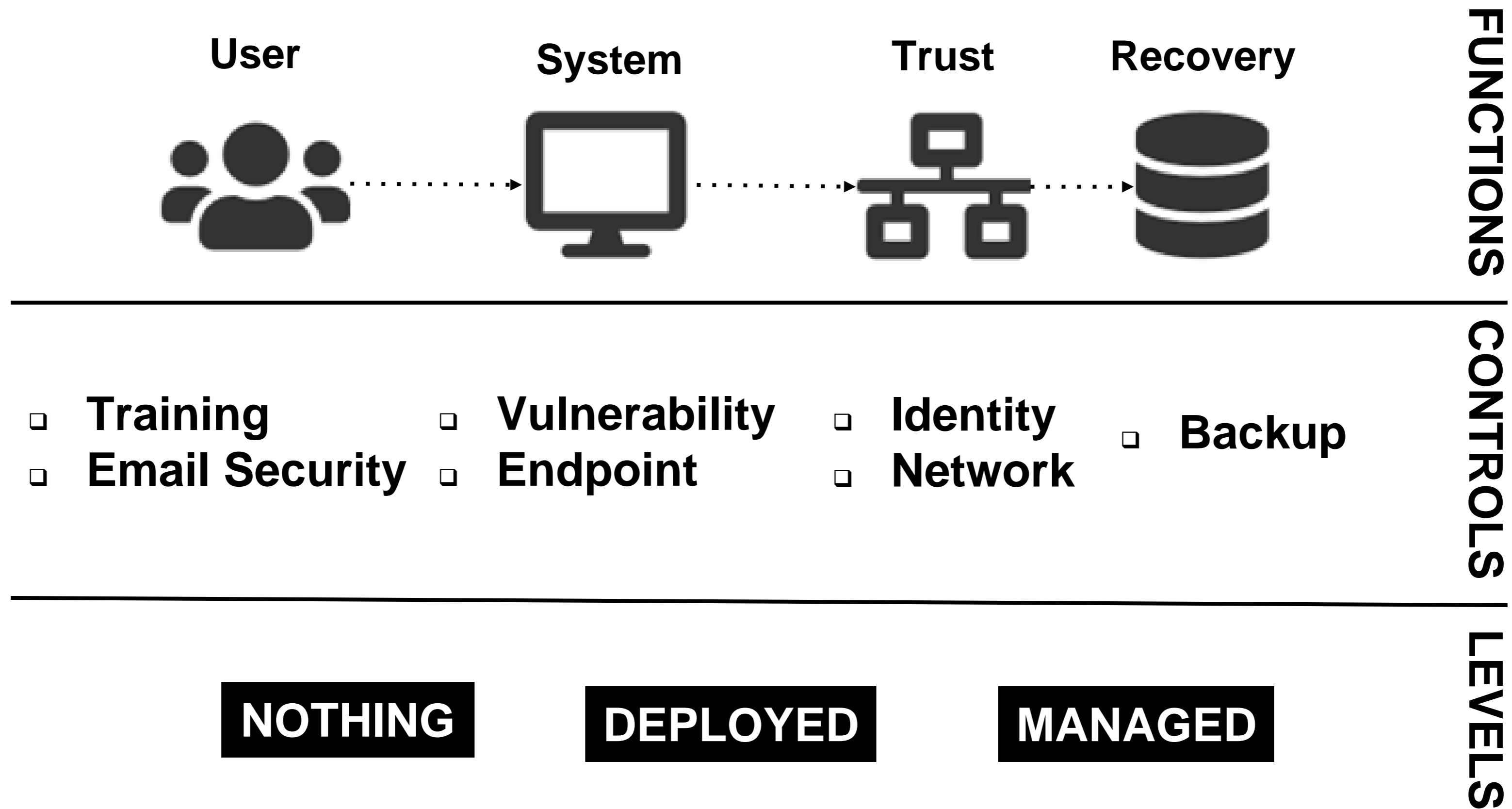
- We calibrate on verifiable but difficult questions, then apply the thinking process to very difficult to verify judgments.
- Egon Brunswick lens model – means to reverse engineer how SMEs perceive their environment on the basis of observed cues correlated to outcomes they judge.
- Combine all SMEs’ “data”
- Regress response \sim control levels

Reverse engineering the SME brain – a ransomware model example

- **Our Goal: Discover the value of security controls**
- We review about 10-50 control states
- Each state is composed of different control levels across seven control type
- SMEs assess the probability of a material event for each state
- We score the SMEs for noise: consistency and discrimination
- We combine the SMEs' assessments into a database
- **The Result:** A probability model for ~650+ control combinations



The conceptual ransomware system model sets the context



Security Controls – Probability of Material Event Assessment

	User Controls		System Controls		Trust Controls		Backup Controls	Likelihoods		
	Security Training	Email Security	Vulnerability Patch Sla	Endpoint Protection	Identity Verification	Network Segmentation	Backup Security	P(Ransomware), 1 yr	Year 3	Year 5
1	UNMANAGED: No Training	UNMANAGED: No Controls	UNMANAGED: Adhoc Patch	UNMANAGED: No Controls	UNMANAGED: No Controls	UNMANAGED: Ext Firewall	UNMANAGED: No Backups	+4.00%	+11.50%	+18.50%
2	MANAGED: Attack Simulations	DEPLOYED: Email Security Gateway & Email Auth	UNMANAGED: Adhoc Patch	DEPLOYED: EPP	DEPLOYED: MFA	DEPLOYED: Users Segmented	DEPLOYED: Backups			
3	UNMANAGED: No Training	UNMANAGED: No Controls	MANAGED: 30 Days Patch Critical	UNMANAGED: No Controls	UNMANAGED: No Controls	MANAGED: Micro-Segmentation	MANAGED: Tested Backups			
4	UNMANAGED: No Training	UNMANAGED: No Controls	MANAGED: 30 Days Patch Critical	MANAGED: EPP & EDR	UNMANAGED: No Controls	MANAGED: Micro-Segmentation	UNMANAGED: No Backups			
5	UNMANAGED: No Training	DEPLOYED: Email Security Gateway & Email Auth	UNMANAGED: Adhoc Patch	DEPLOYED: EPP	UNMANAGED: No Controls	DEPLOYED: Users Segmented	UNMANAGED: No Backups			

- We set a baseline annual probability based on claims data and other firmographic data ~ 2.5%.
- Well calibrated SMEs assess how the baseline updates based on control combinations.
- We present 10-50 control states at a time chosen to span the full set of combinations after several SMEs provide input over several sets.

Combine all SME judgements to “recreate Giambi”

USER CONTROLS		COMPUTE CONTROLS		TRUST CONTROLS		RECOVERY CONTROLS	
Security Training	Email Security	Vulnerability Patch SLA	Endpoint Protection	Identity Verification	Network Segmentation	Backup Security	Annual Prob
UNMANAGED:No Training	DEPLOYED:Email Security Gateway & Email Auth	MANAGED:30 Days Patch CRITICAL	MANAGED:EPP & EDR	MANAGED:MFA & PAM	DEPLOYED:Users Segmented	DEPLOYED:Backups	1.90%
MANAGED:Attack Simulations	DEPLOYED:Email Security Gateway & Email Auth	UNMANAGED:Adhoc Patch	UNMANAGED:No Controls	UNMANAGED:No Controls	MANAGED:Micro-Segmentation	UNMANAGED:No Backups	3.90%
UNMANAGED:No Training	DEPLOYED:Email Security Gateway & Email Auth	UNMANAGED:Adhoc Patch	DEPLOYED:EPP	DEPLOYED:MFA	DEPLOYED:Users Segmented	UNMANAGED:No Backups	2.40%
UNMANAGED:No Training	UNMANAGED:No Controls	MANAGED:30 Days Patch CRITICAL	DEPLOYED:EPP	UNMANAGED:No Controls	UNMANAGED:Ext Firewall	MANAGED:Tested Backups	2.80%
UNMANAGED:No Training	DEPLOYED:Email Security Gateway & Email Auth	MANAGED:30 Days Patch CRITICAL	UNMANAGED:No Controls	UNMANAGED:No Controls	DEPLOYED:Users Segmented	MANAGED:Tested Backups	2.65%
MANAGED:Attack Simulations	UNMANAGED:No Controls	UNMANAGED:Adhoc Patch	MANAGED:EPP & EDR	UNMANAGED:No Controls	UNMANAGED:Ext Firewall	MANAGED:Tested Backups	2.70%
UNMANAGED:No Training	UNMANAGED:No Controls	UNMANAGED:Adhoc Patch	MANAGED:EPP & EDR	DEPLOYED:MFA	MANAGED:Micro-Segmentation	UNMANAGED:No Backups	2.40%
UNMANAGED:No Training	DEPLOYED:Email Security Gateway & Email Auth	UNMANAGED:Adhoc Patch	MANAGED:EPP & EDR	DEPLOYED:MFA	MANAGED:Micro-Segmentation	MANAGED:Tested Backups	2.10%
MANAGED:Attack Simulations	UNMANAGED:No Controls	UNMANAGED:Adhoc Patch	DEPLOYED:EPP	UNMANAGED:No Controls	DEPLOYED:Users Segmented	UNMANAGED:No Backups	2.95%
UNMANAGED:No Training	DEPLOYED:Email Security Gateway & Email Auth	UNMANAGED:Adhoc Patch	MANAGED:EPP & EDR	DEPLOYED:MFA	MANAGED:Micro-Segmentation	UNMANAGED:No Backups	2.80%
MANAGED:Attack Simulations	UNMANAGED:No Controls	UNMANAGED:Adhoc Patch	MANAGED:EPP & EDR	DEPLOYED:MFA	UNMANAGED:Ext Firewall	UNMANAGED:No Backups	2.90%
MANAGED:Attack Simulations	DEPLOYED:Email Security Gateway & Email Auth	UNMANAGED:Adhoc Patch	MANAGED:EPP & EDR	DEPLOYED:MFA	MANAGED:Micro-Segmentation	UNMANAGED:No Backups	2.35%



Guys, you’re still trying to replace Giambi. I told you we can’t do it...Now what we might be able to do is recreate him. We create him in the adding field.

Billy Beane, former general manager of the Oakland Athletics, as featured in the movie *Moneyball* (2011).

Transform the event probability assessments into numerical levels and regress to linear coefficients

Security_Training	Email_Security	Vulnerability_Patch_SLA	Endpoint_Protection	Identity_Verification	Network_Segmentation	Backup_Security	
UNMANAGED:No Training	UNMANAGED:No Controls	UNMANAGED:Adhoc Patch	UNMANAGED:No Controls	UNMANAGED:No Controls	UNMANAGED:Ext Firewall	UNMANAGED:No Backups	1
MANAGED:Attack Simulations	DEPLOYED:Email Security Gateway & Email Auth	MANAGED:30 Days Patch CRITICAL	DEPLOYED:EPP	DEPLOYED:MFA	DEPLOYED:Users Segmented	DEPLOYED:Backups	2
			MANAGED:EPP & EDR	MANAGED:MFA & PAM	MANAGED:Micro-Segmentation	MANAGED:Tested Backups	3

Security_Training	Email_Security	Vulnerability_Patch_SLA	Endpoint_Protection	Identity_Verification	Network_Segmentation	Backup_Security	Annual_Prob
1	2	2	3	3	2	2	1.90%
2	2	1	1	1	3	1	3.90%
1	2	1	2	2	2	1	2.40%
1	1	2	2	1	1	3	2.80%
1	2	2	1	1	2	3	2.65%
2	1	1	3	1	1	3	2.70%
1	1	1	3	2	3	1	2.40%
1	2	1	3	2	3	3	2.10%
2	1	1	2	1	2	1	2.95%
1	2	1	3	2	3	1	2.80%
2	1	1	3	2	1	1	2.90%
2	2	1	3	2	3	1	2.35%
1	2	1	1	1	2	2	3.65%

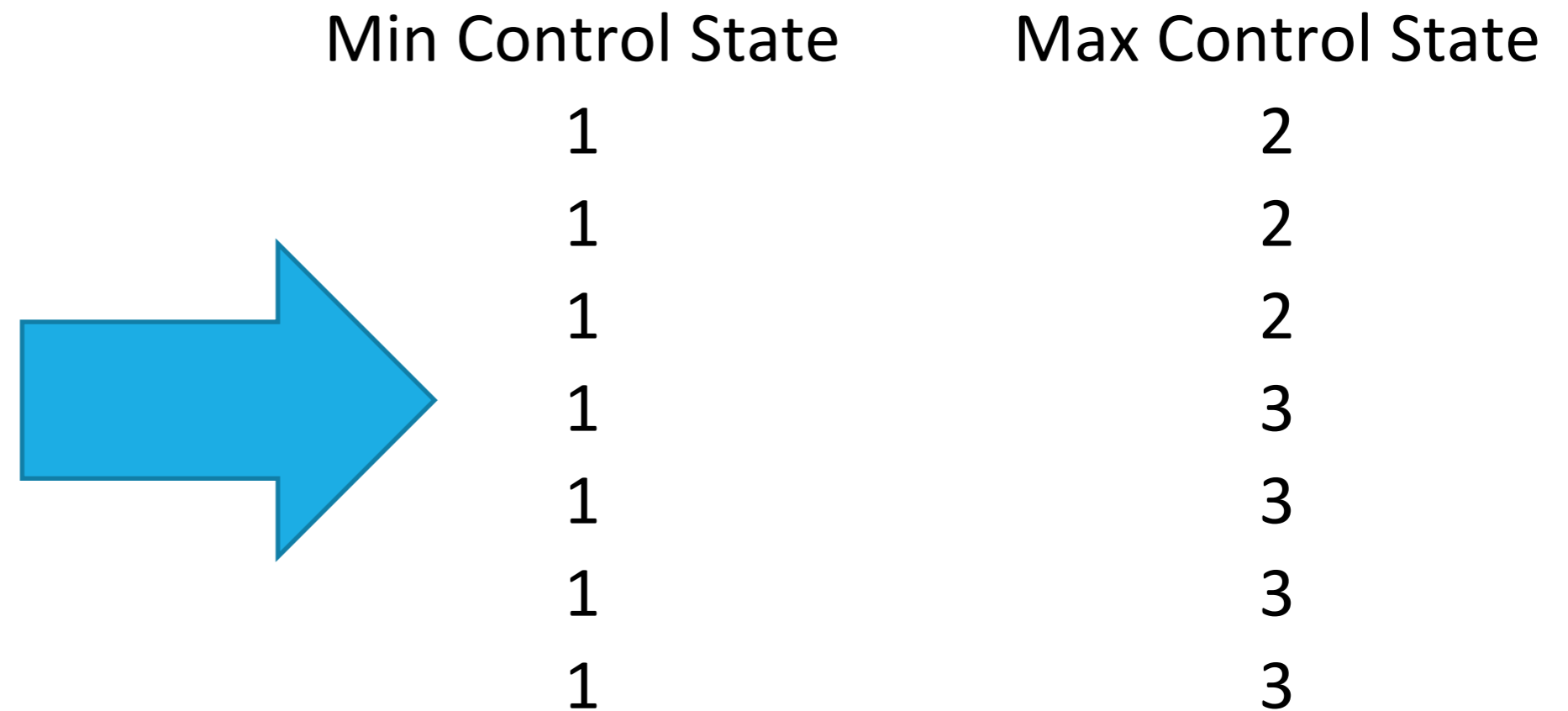
Multi-linear regression on control levels yields coefficients



Coefficients	
Intercept	0.0708
Security_Training	-0.0032
Email_Security	-0.0043
Vulnerability_Patch_SLA	-0.0047
Endpoint_Protection	-0.0037
Identity_Verification	-0.0038
Network_Segmentation	-0.0023
Backup_Security	-0.0020

Setting control levels by their ordinal designation lets us predict the probability of material events in further risk analysis

	<i>Coefficients</i>
Intercept	0.0708
Security_Training	-0.0032
Email_Security	-0.0043
Vulnerability_Patch_SLA	-0.0047
Endpoint_Protection	-0.0037
Identity_Verification	-0.0038
Network_Segmentation	-0.0023
Backup_Security	-0.0020



Annual Probability of Ransomware Event

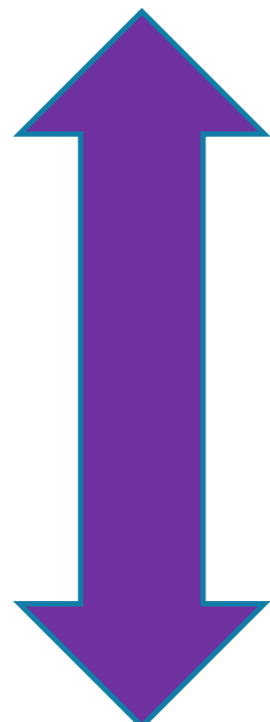
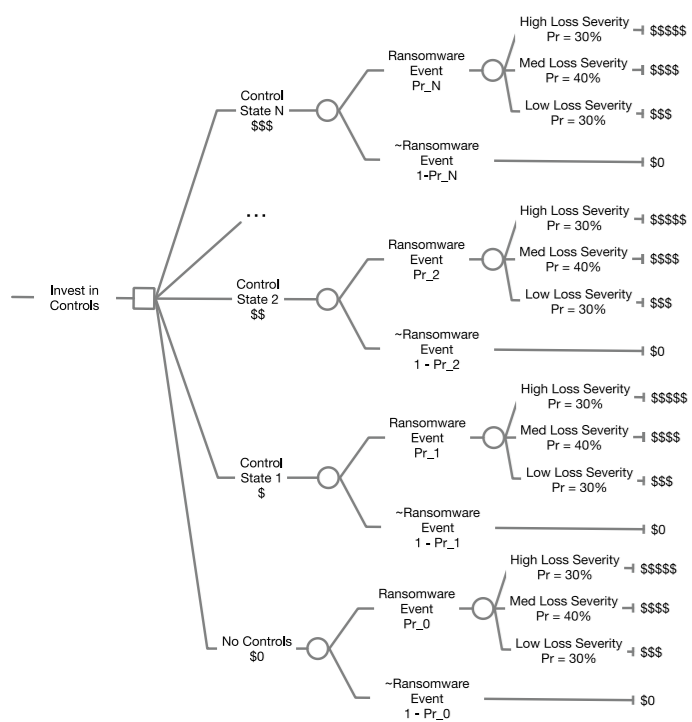
4.67%

1.09%

Cybersecurity requires balancing multiple business concerns

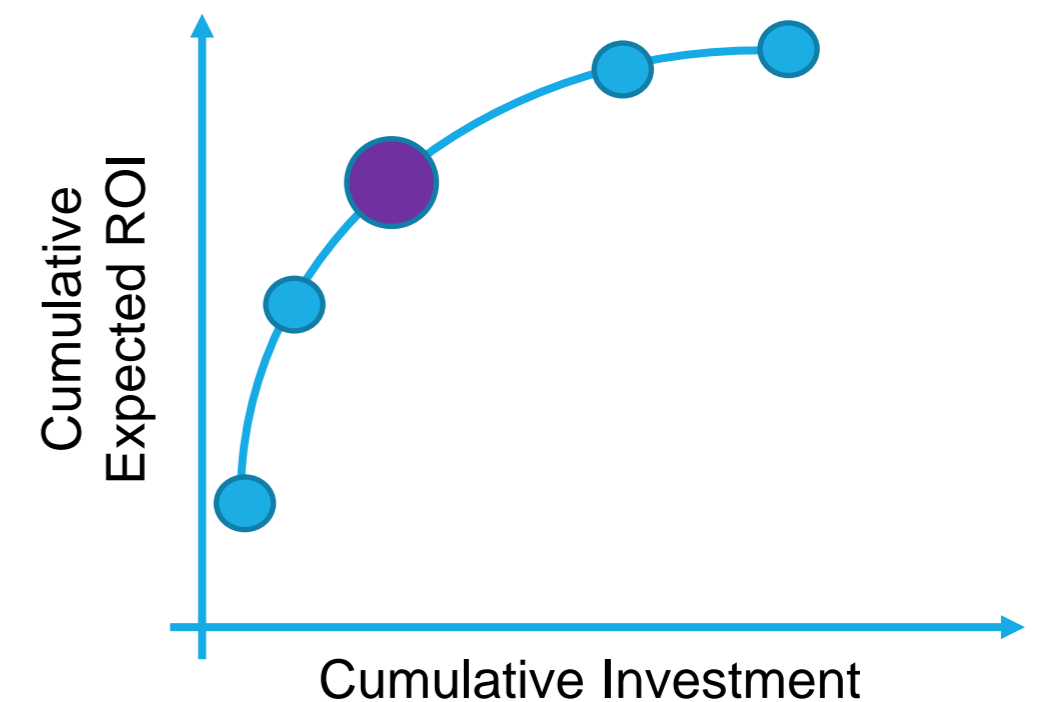
Security and Operational Resilience

Optimize across control alternatives



Alternate Responsible Uses of Capital

Include in portfolio discussion of all capital allocations



Thank you!

- Be sure to download the Excel Ransomware model.
- Reach out for questions or open office hours to go over the Excel model.

