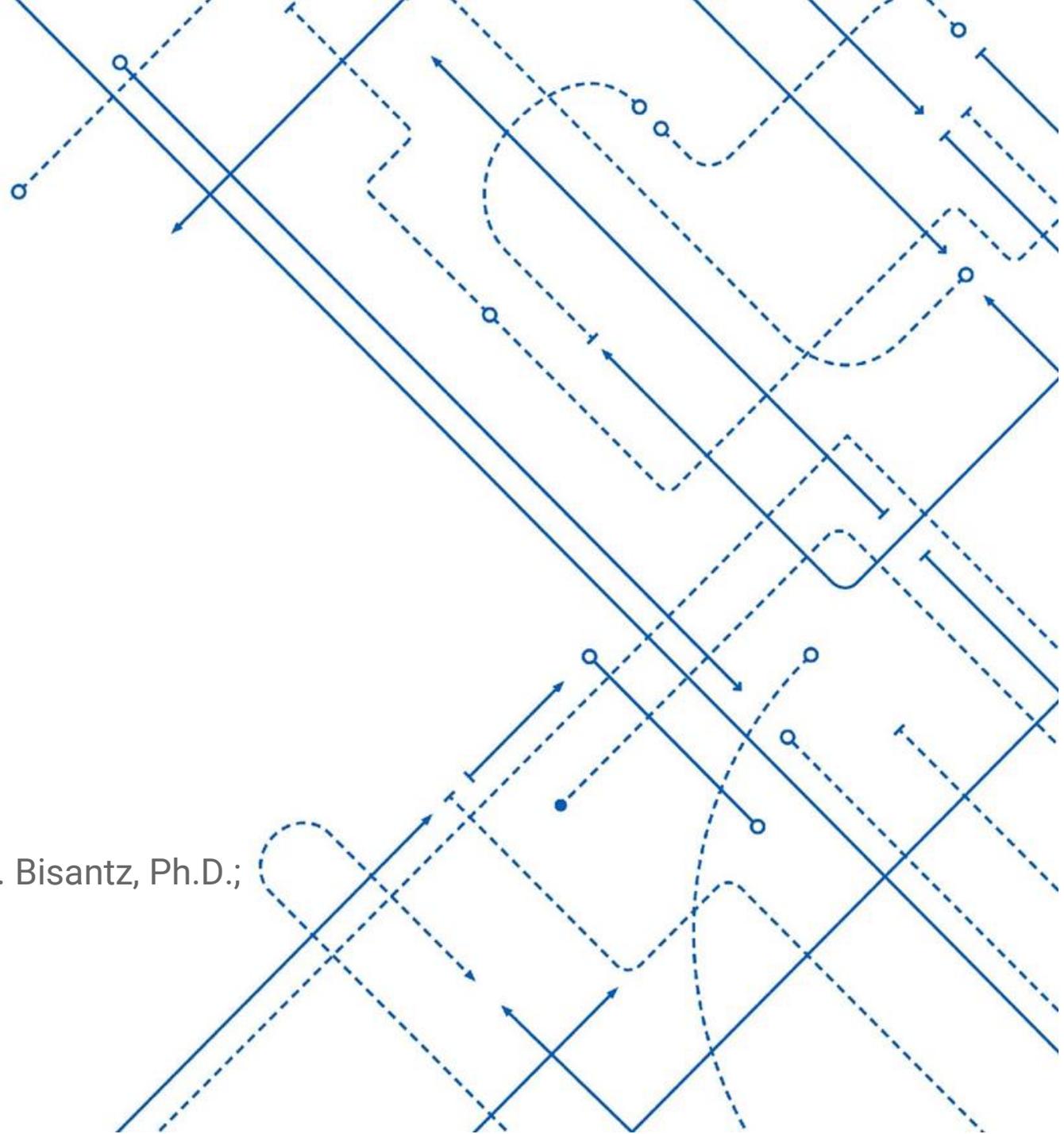


# Mental Models for Cybersecurity

## A Formal Methods Approach

Adam M. Houser  
May 25, 2018

Committee: Matthew L. Bolton, Ph.D. (Chair); Ann M. Bisantz, Ph.D.;  
Jun Zhuang, Ph.D.



# Agenda

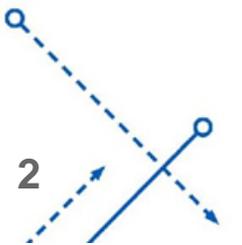
Motivation and brief backgrounders on relevant topics

Overview of the method

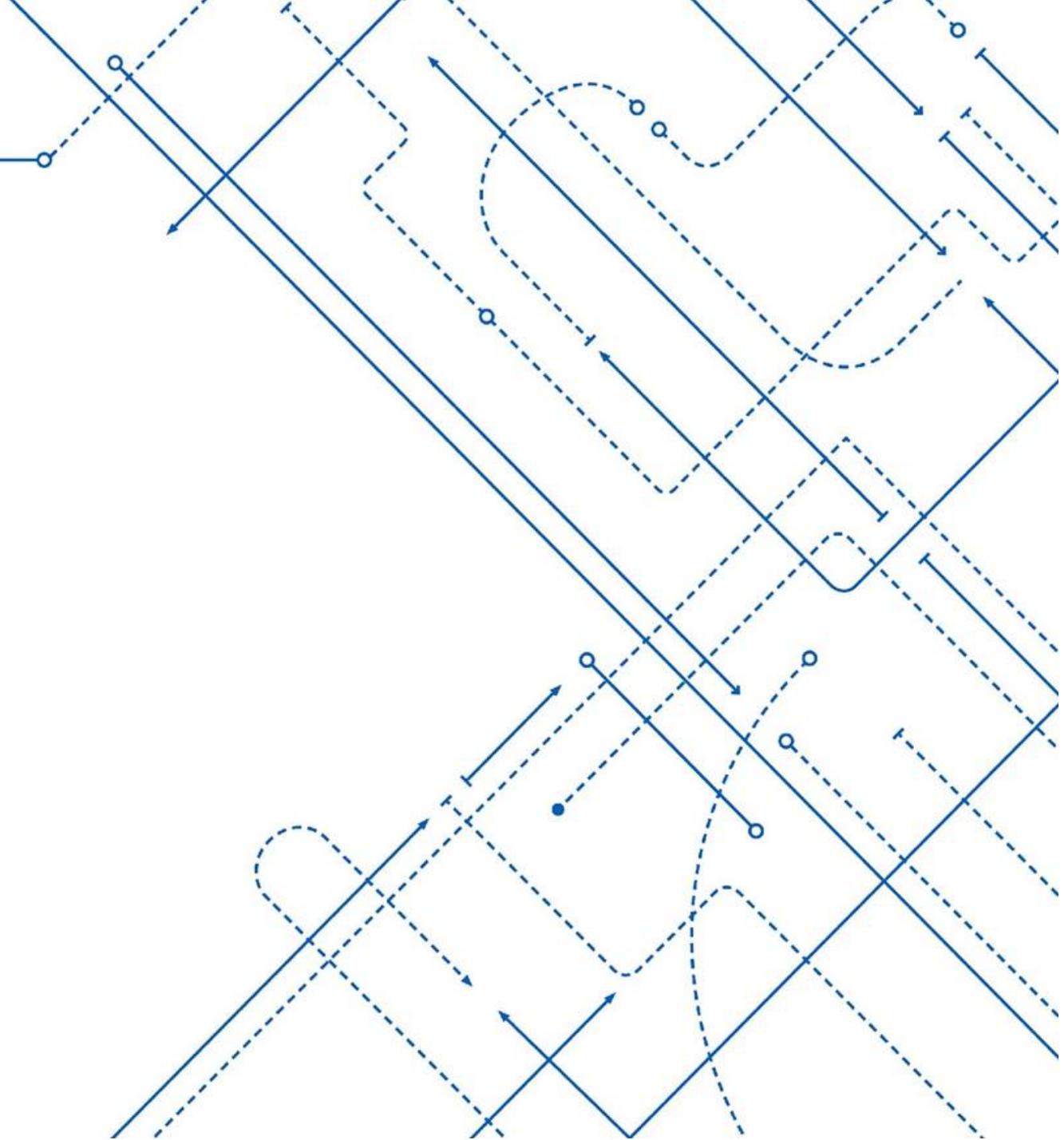
Use case 1: Configuration errors in Amazon cloud storage

Use case 2: User actions when receiving phishing emails

Discussion and targets for future work



# Motivating the Dissertation



# Why formal methods in cybersecurity?

As a domain area, cybersecurity has become a critical global concern

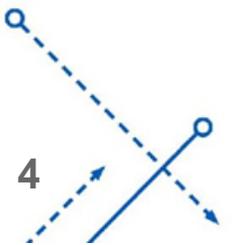
- Nation-state cyberattacks, ransomware, global DDoS, crime ([FBI: Cyber Crime, 2016](#))
- Threat actors turning to human exploits

One promising approach: explore cyber through mental models and HAI

- Address not only “what” humans do, but “why” as well
- Understand how these misunderstandings can lead to vulnerabilities, breaches, system failure

Formal methods offer techniques for discovering these events

- Very good at discovery of rare, unanticipated conditions (exhaustive search, counterexample traces)
- Useful, illuminating synergistic intersection of these topics



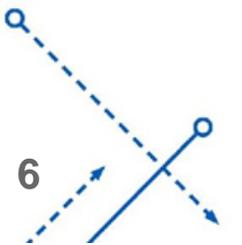
# Background: Cybersecurity

- Security: \$75 billion industry in 2015, projected \$170 billion by 2020 ([Gartner, 2015](#); [Morgan, 2016](#))
- Crime: \$400 billion in theft and loss in 2015, projected \$2 to \$3 trillion by 2020 – 2021 ([Juniper Research, 2015](#))
- Security investments have made “hacking” more difficult ([Collet, 2014](#))
  - Gone are the days of Hollywood-style exploits
  - Mr. Robot: accurate but uncommon
- Humans as critical linchpins in the cyber kill chain
  - Phishing for credential theft
  - Malware for remote access
  - Ransomware for extortion



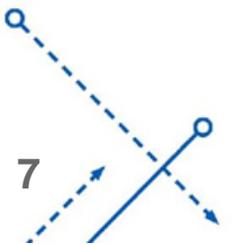
# Background: Mental models

- To bolster end-user cyber defenses: training
  - Mixed empirical data on phishing clickthrough and recidivism (repeat offenders) ([Kumaraguru, et al., 2009](#); [Sheng, et al., 2010](#); [Siadati, et al., 2017](#))
- Mental models may help explore user-based exploits more deeply
  - A “small-scale” mental representation of some aspect of the world ([Craig, 1943](#))
  - Describes functionality of the target system ([Norman, 1983, 2013](#))
  - Often incomplete, unscientific, can harbor “superstitious beliefs” about the system, but not “wrong”
  - Runnable forwards and backwards ([de Kleer and Brown, 1981](#); [Norman, 1983](#))



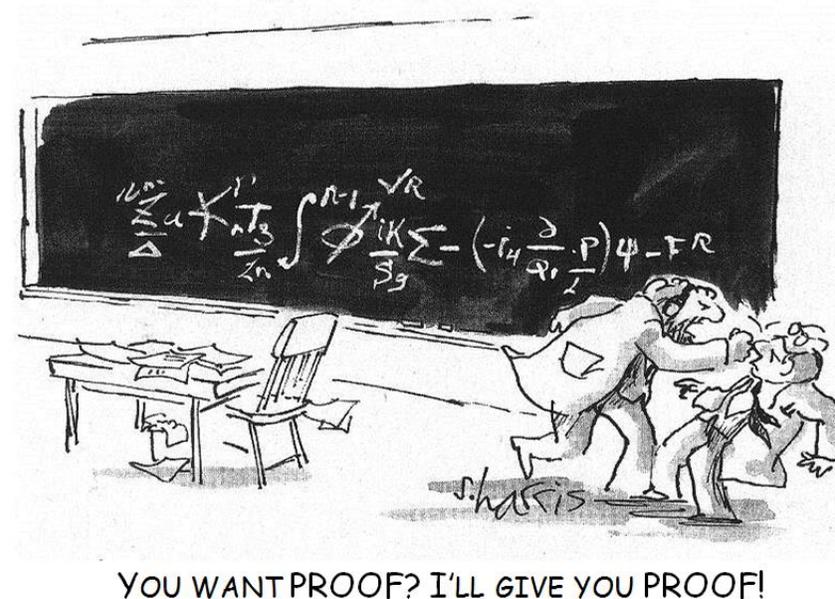
# Background: Folk models

- What are folk models?
  - Phenomenological models shared among similar members of a culture (D'Andre, 1987)
  - Useful, but potentially immune to falsification, posit without measurement (Dekker and Hollnagel, 2004)
- Existing work in folk modeling of user computer threats, user responses, security devices (Wash, 2010; Kauer, 2013)
  - Heavily reliant on metaphor, lack runnability (Camp, 2004, 2009)
  - Some effort to add rigor (Blythe and Camp, 2012)
- Folk models are still useful, warts and all
  - Contain valuable insight on user security responses
  - High face validity of response data

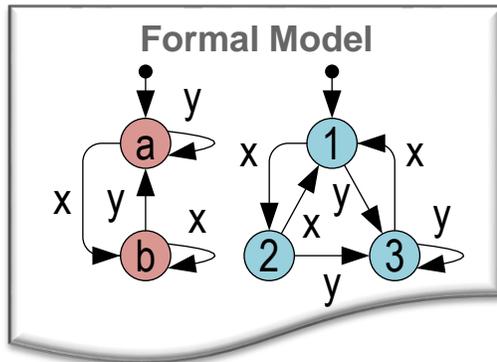


# Background: Formal methods

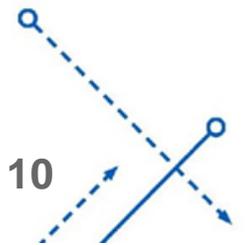
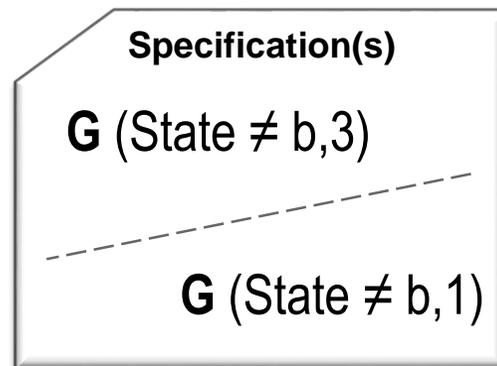
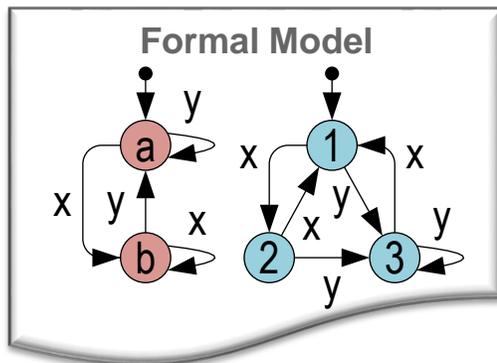
- Formal methods: mathematical languages and techniques for modeling, specifying, and verifying system models and their properties ([Baier and Katoen, 2008](#); [Bolton, 2013](#))
- Model checking: highly-automated approach to formal verification
- Mathematical proof that condition does or does not exist (exhaustive search, counterexamples)



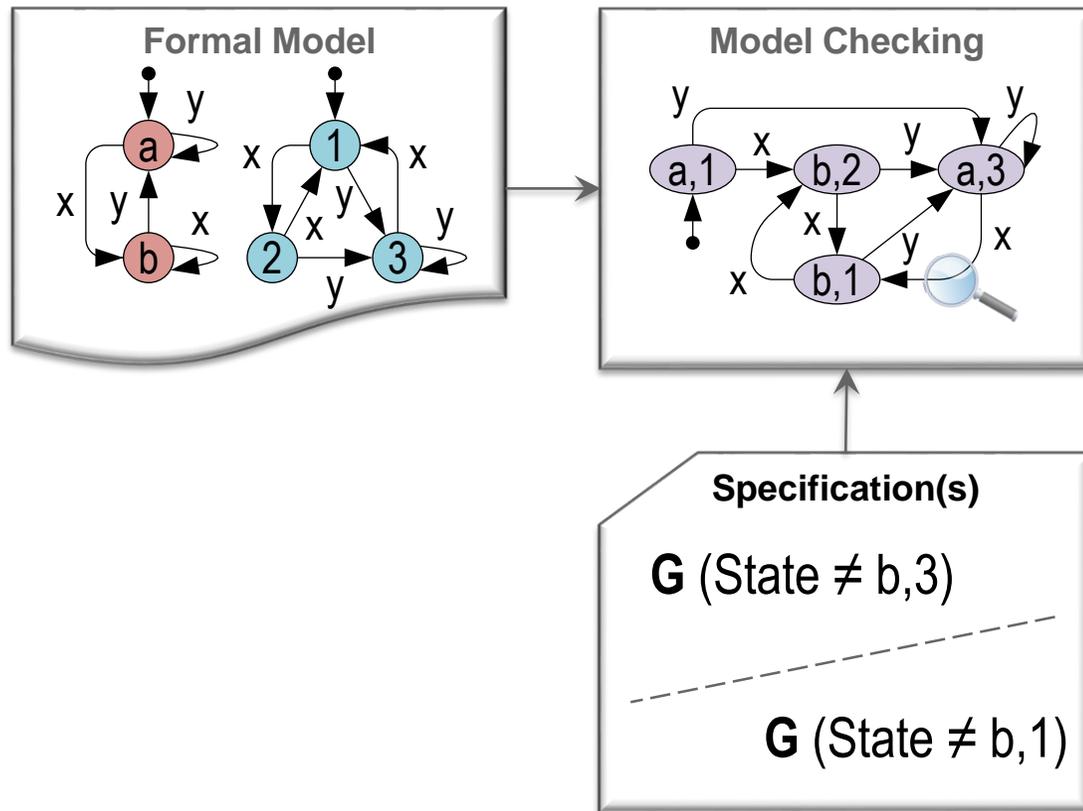
# Background: Model checking



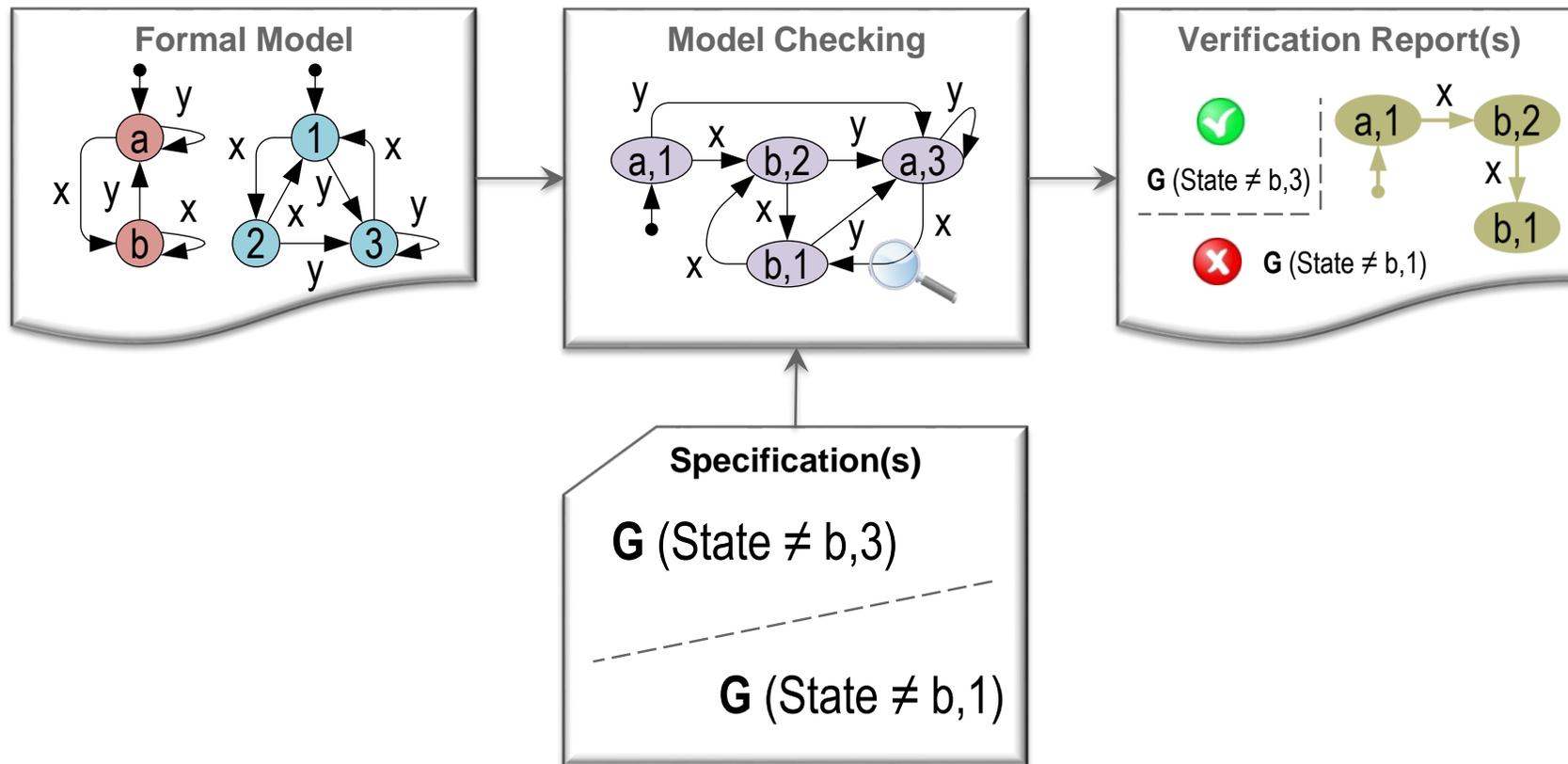
# Background: Model checking



# Background: Model checking



# Background: Model checking

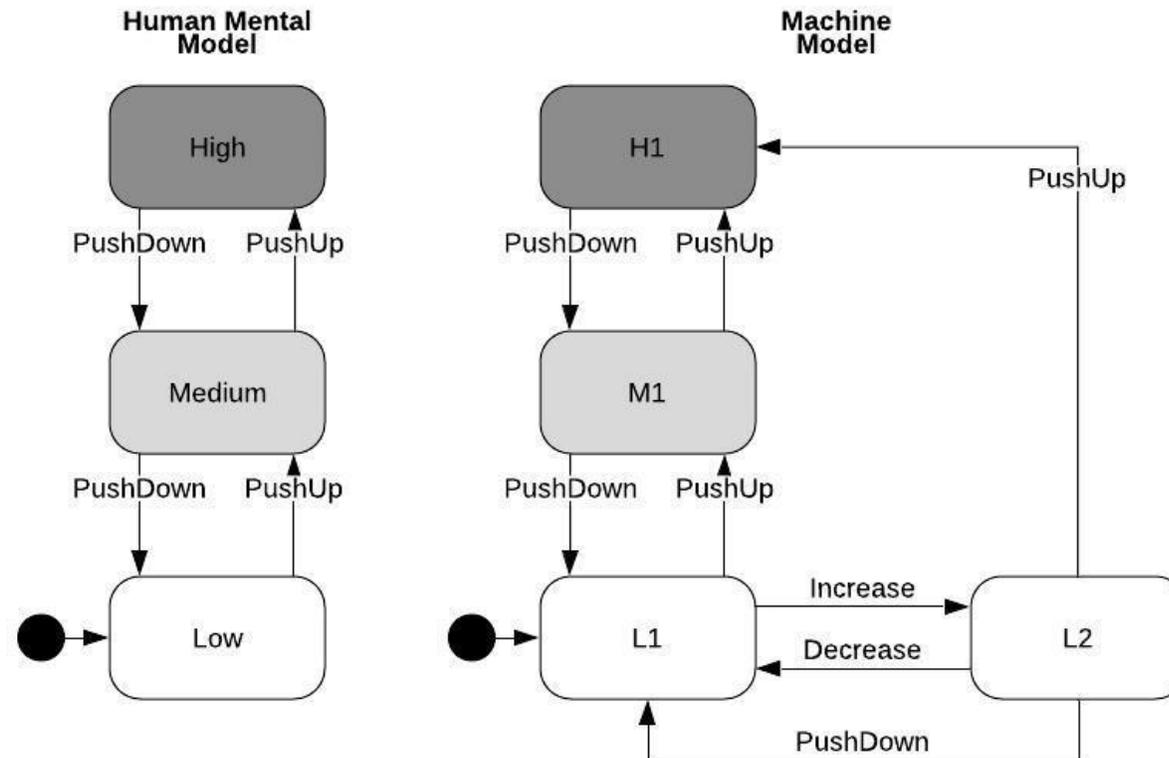


# Background: Formal methods

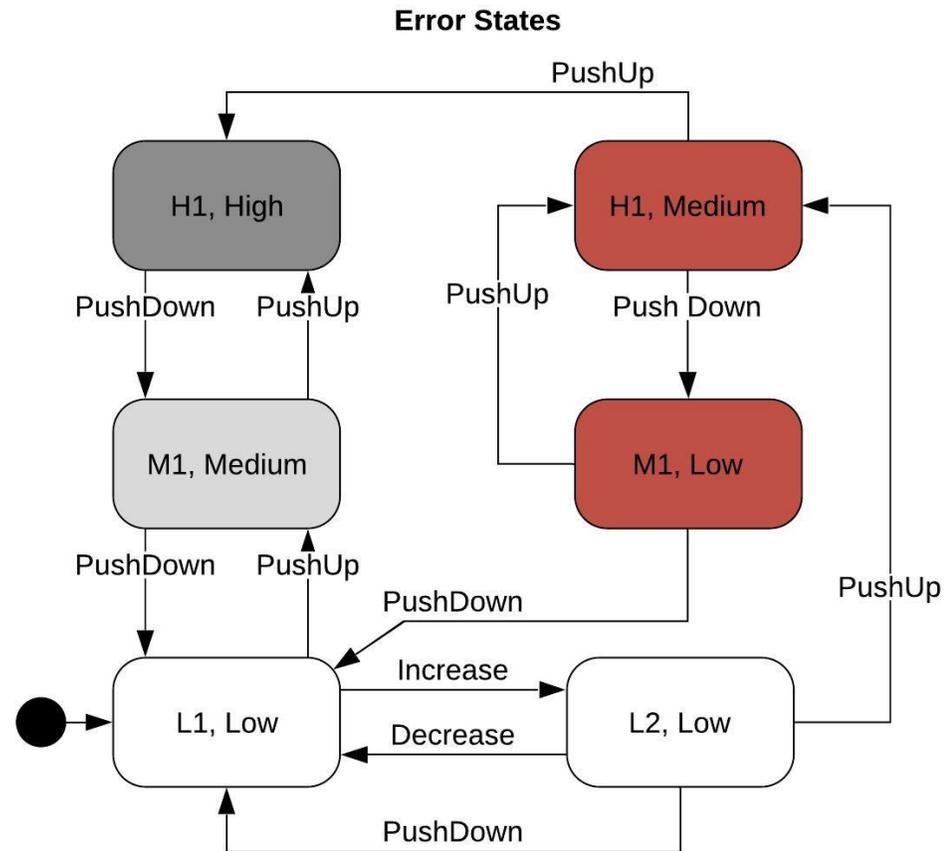
- Mode confusion: mismatch between user mental model of system state and state of actual system
  - Cruise-control systems (Degani, Shafto, and Kirlik, 1999)
  - Aircraft autopilot (Degani and Heymann, 2002)
  - Aircraft auto-land (Oishi et al., 2003)
- Error and blocking states (Degani and Heymann, 2002)
  - States should transition synchronously
  - Error state: user thinks move is legal, machine state is illegal
  - Blocking state: system transition happens or is possible, but user doesn't see it or is unaware of it



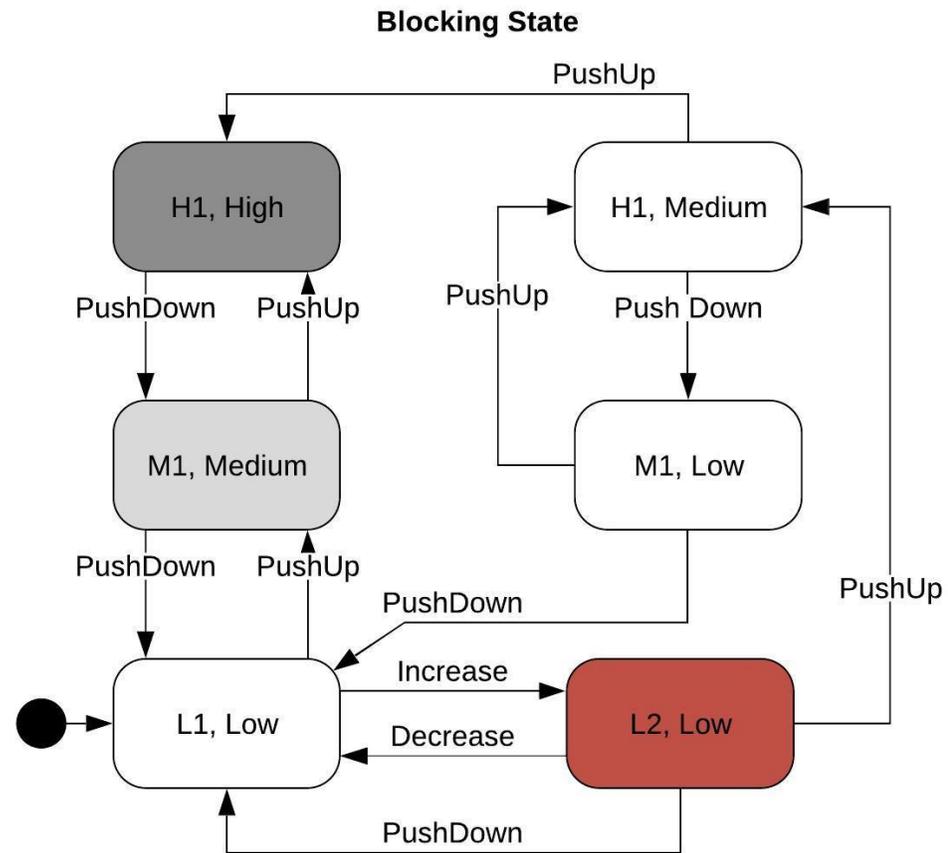
# Degani: human and machine models



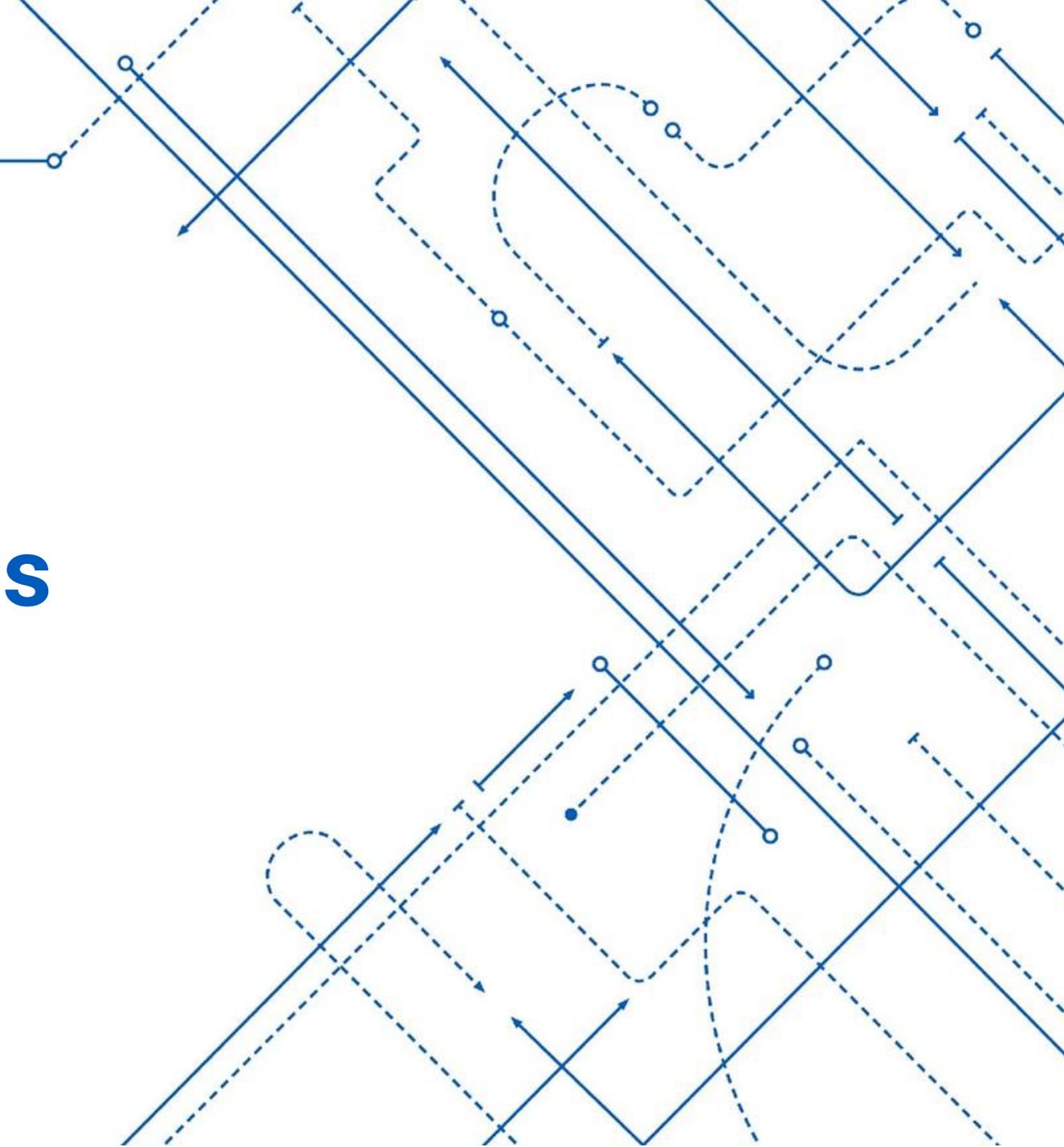
# Degani's error states



# Degani's blocking state



# Research Questions



## Research Question 1

How can rigorous characterization of **computer user mental models** and their treatment of **cyber threats** help network defenders become more resilient to cyberattacks that exploit human users?

## Research Question 2

How can **formal methods techniques** be extended to give analysts the ability to **discover and describe real-world security vulnerabilities** that arise from the interaction between user mental models of computer security tools and the tools themselves?



# Research Objectives

**Establish** a rigorous framework for exploring user mental models of computer security risks with formal methods techniques.

**Demonstrate** that these risks correspond to vulnerabilities that attackers could potentially exploit in modern computer systems.

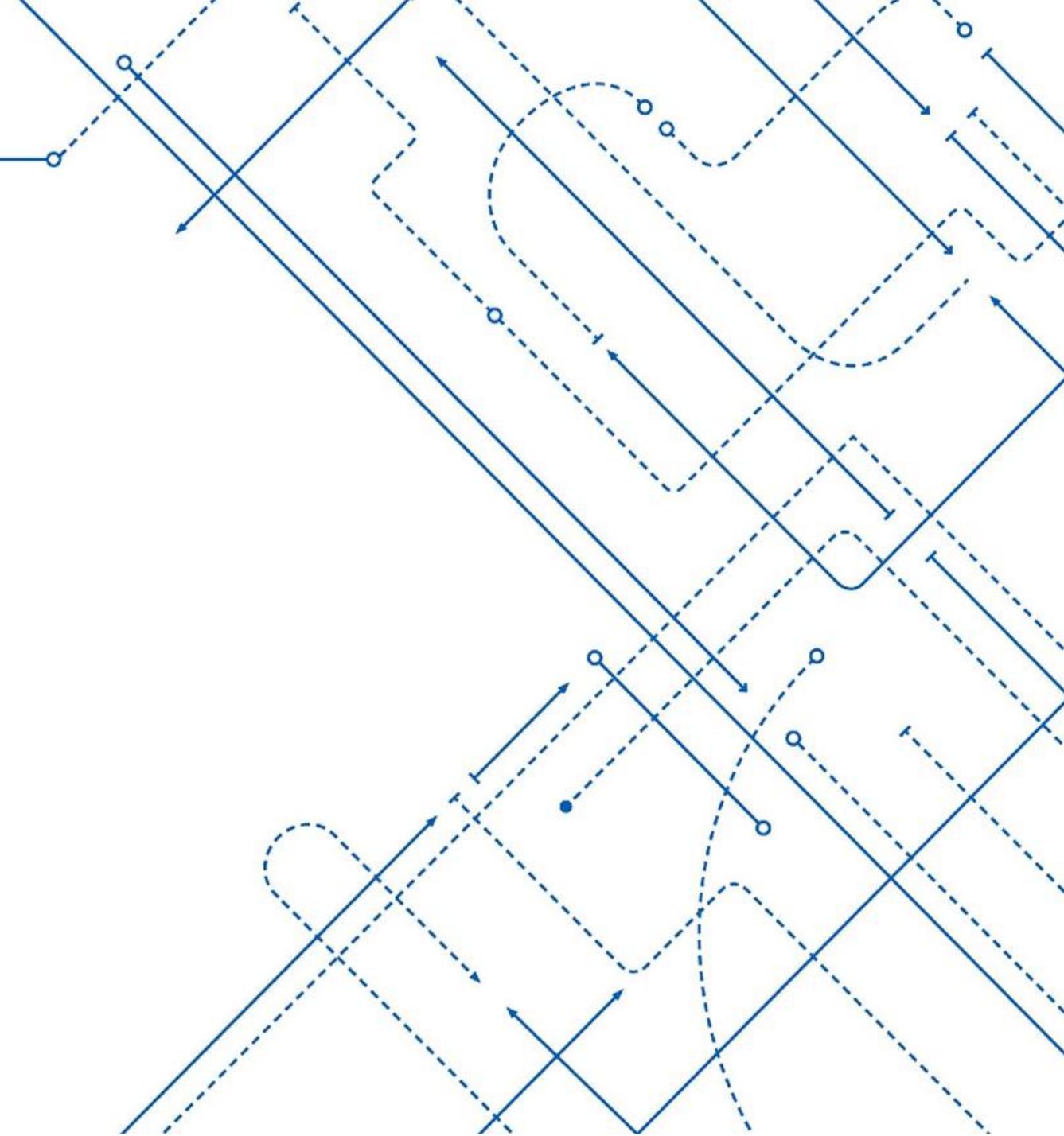
**Extend** our framework to incorporate folk models of cybersecurity risks.

**Analyze** data collected from multiple sources to validate our modeling approach by discovering potential configuration errors anticipated with our method



## Part I:

# Generic Method Formulation



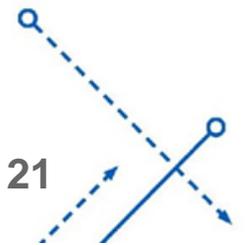
# Problem overview

Motivation: user-enabled attacks are a major cybersecurity problem, expected continual growth

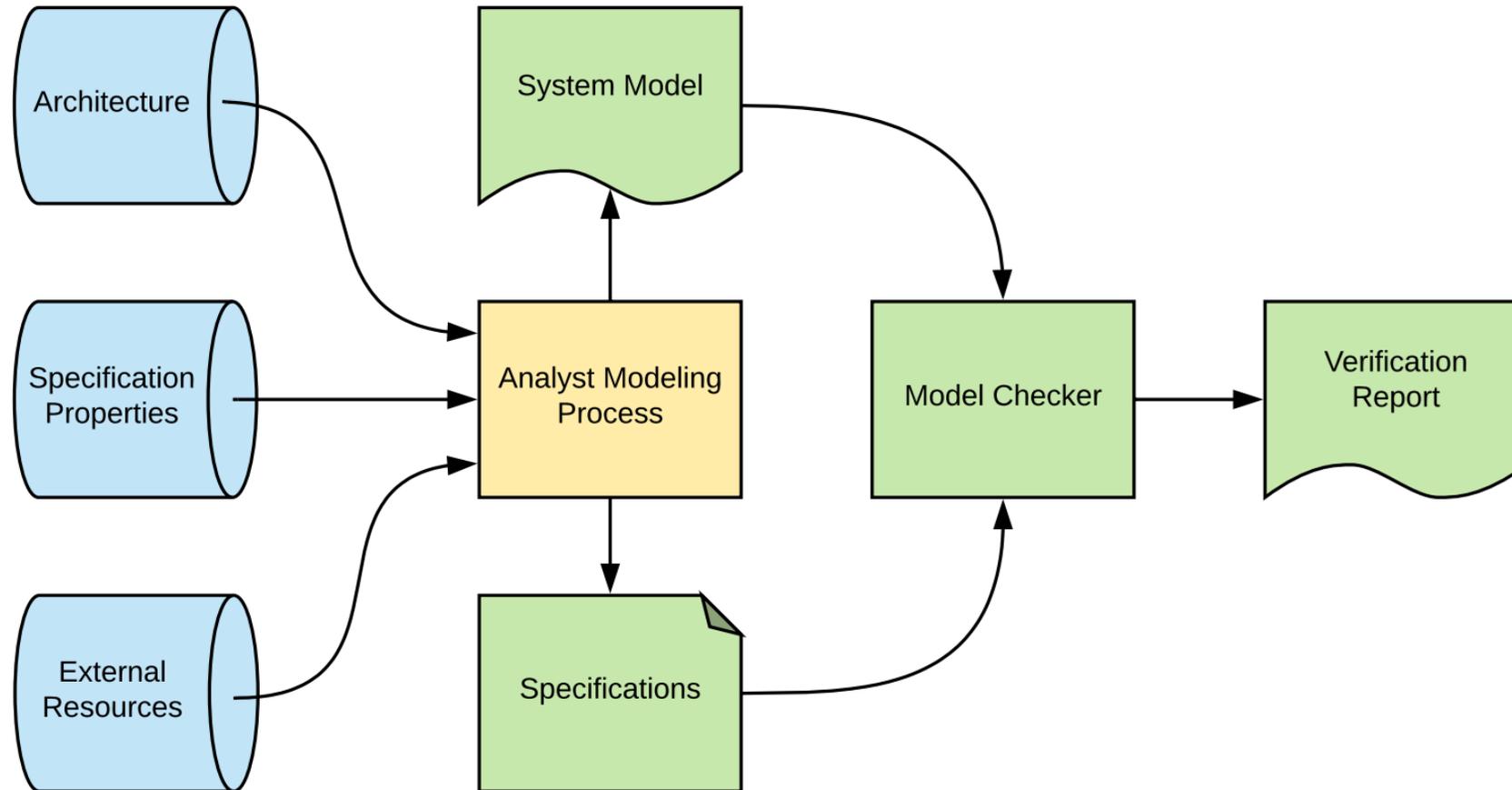
Formulate a framework that:

- extends Degani and Heymann (2002)'s architecture to a new domain
- can discover unanticipated cybersecurity “vulnerabilities”
- captures developments in a theoretically-grounded, application-agnostic approach

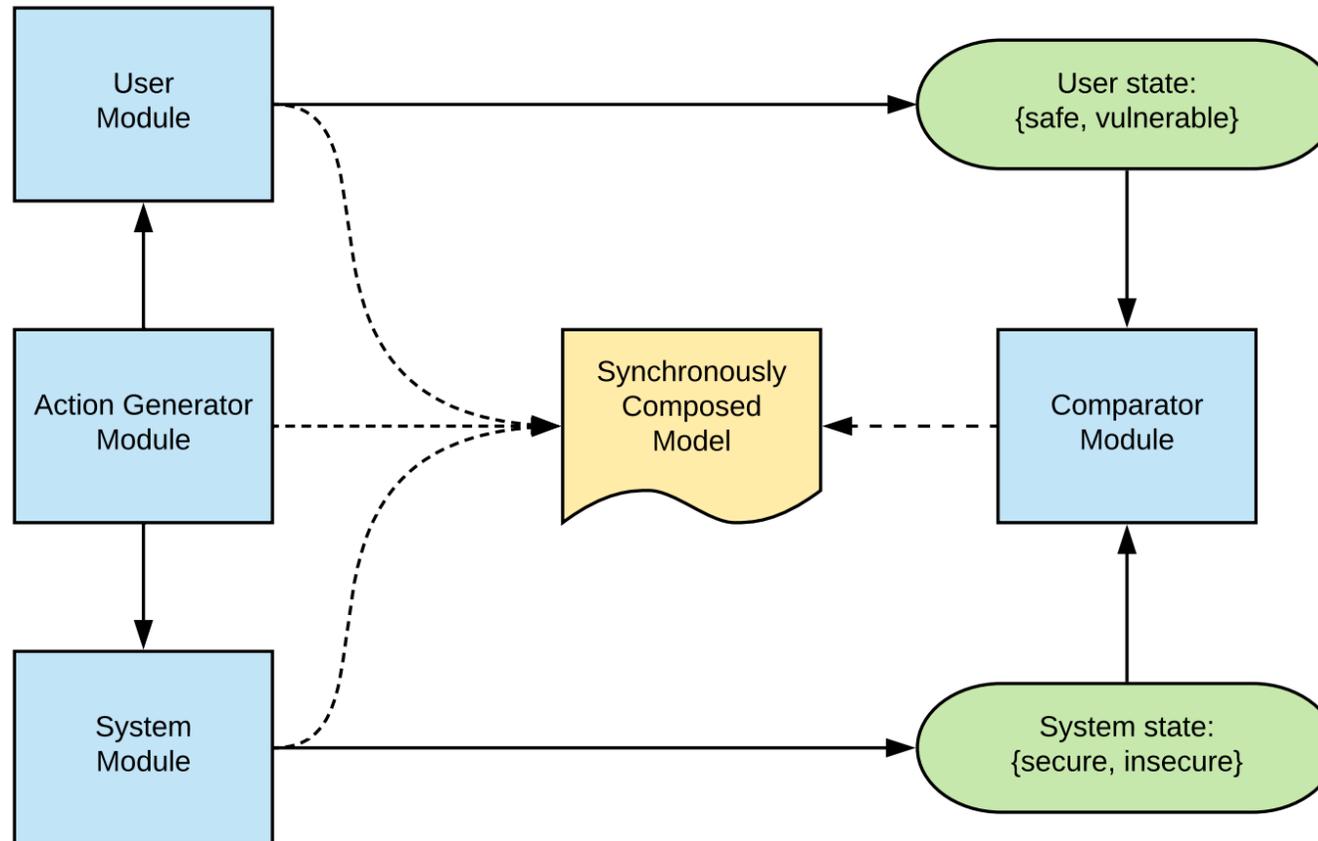
Solution: our Generic Method



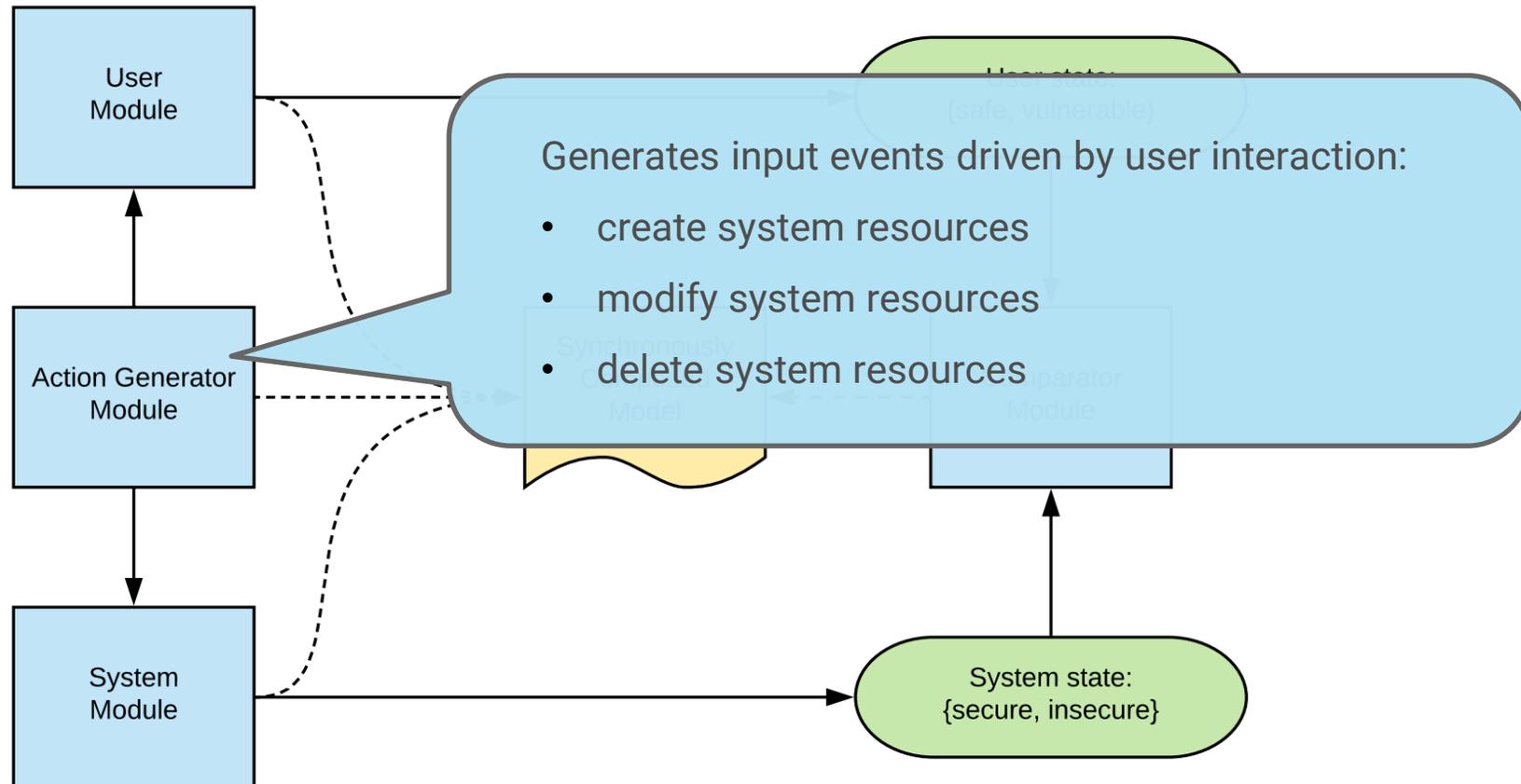
# Generic formulation of the method



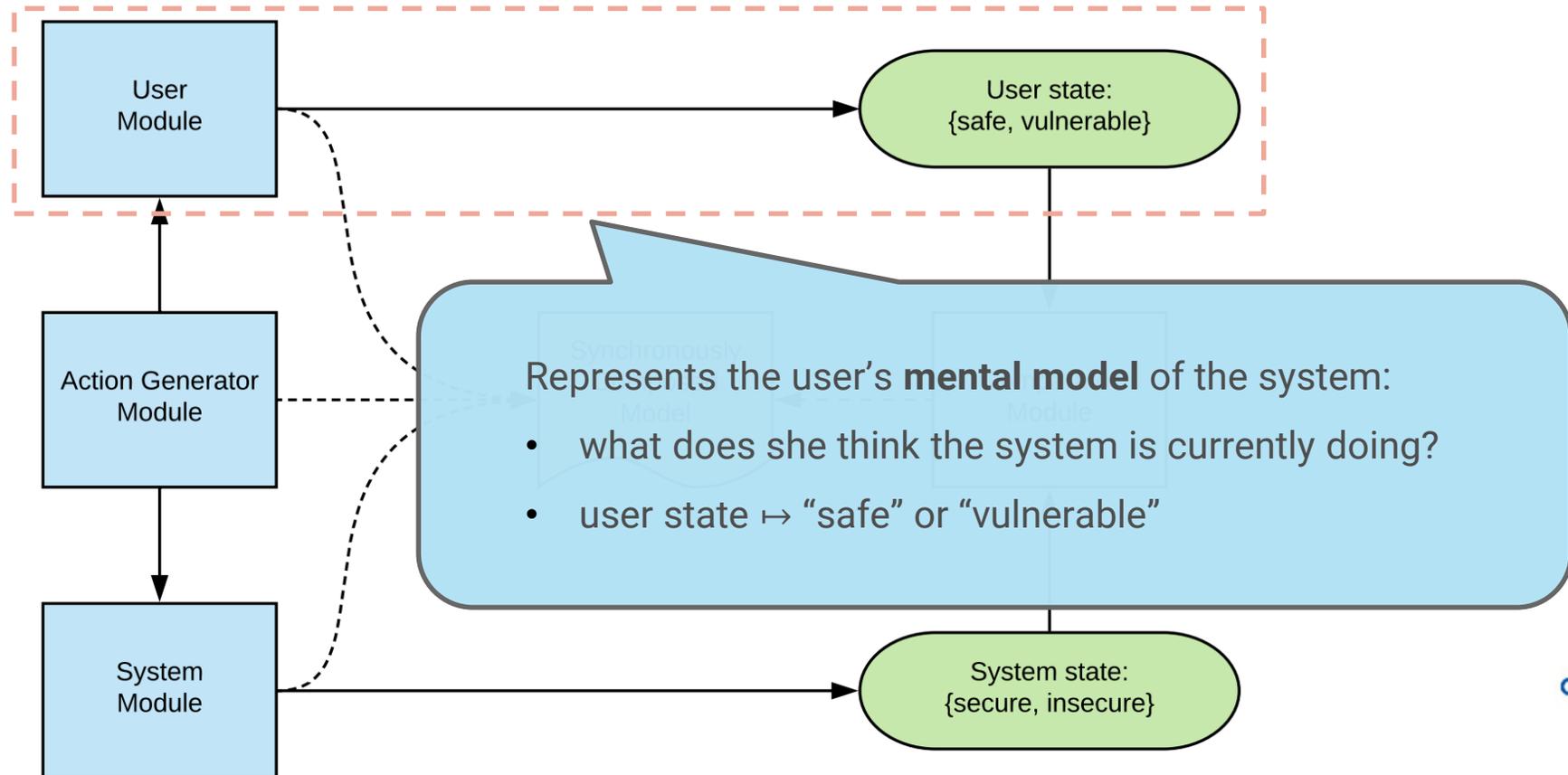
# Generic system model architecture



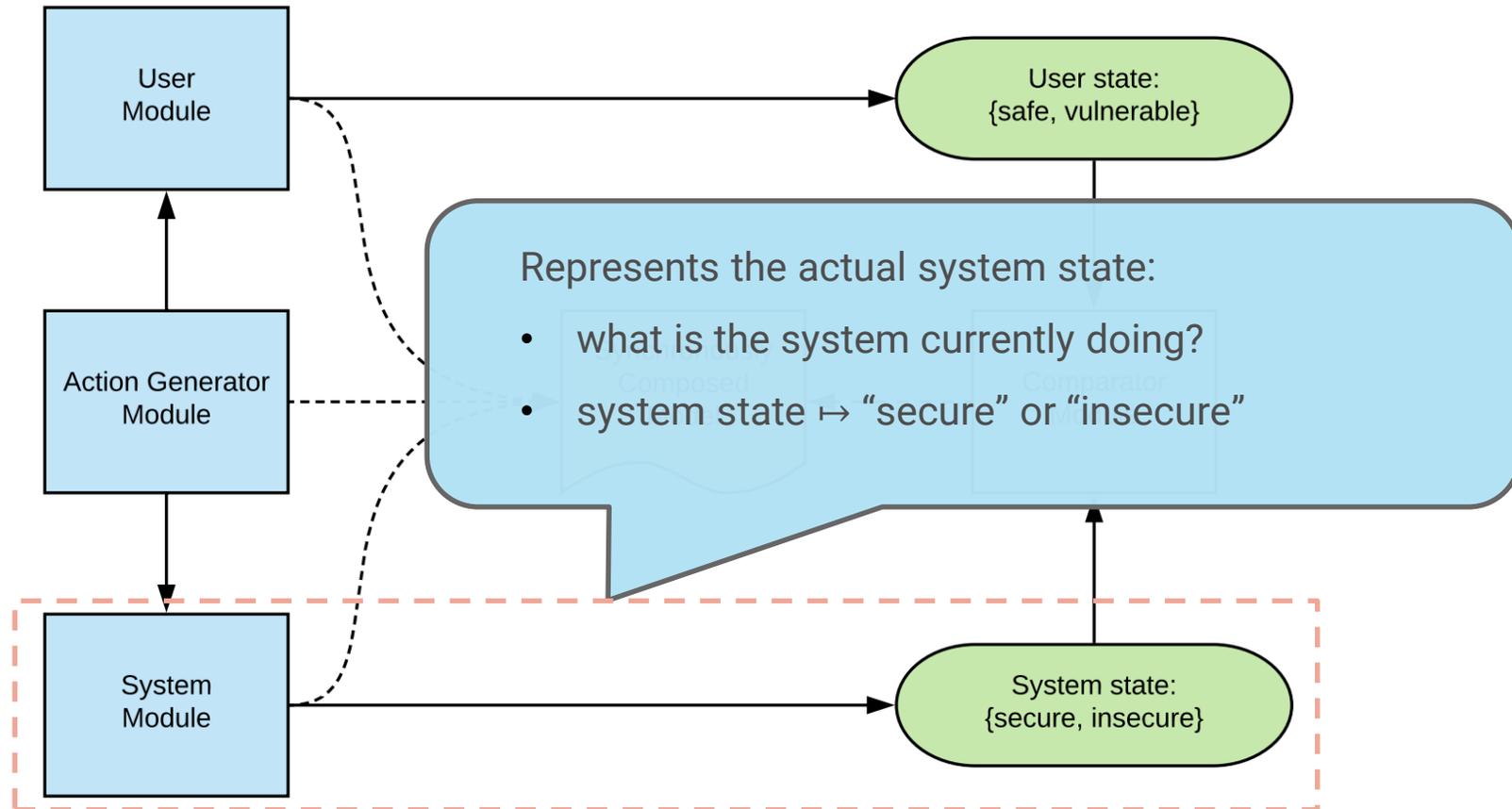
# Generic system model architecture



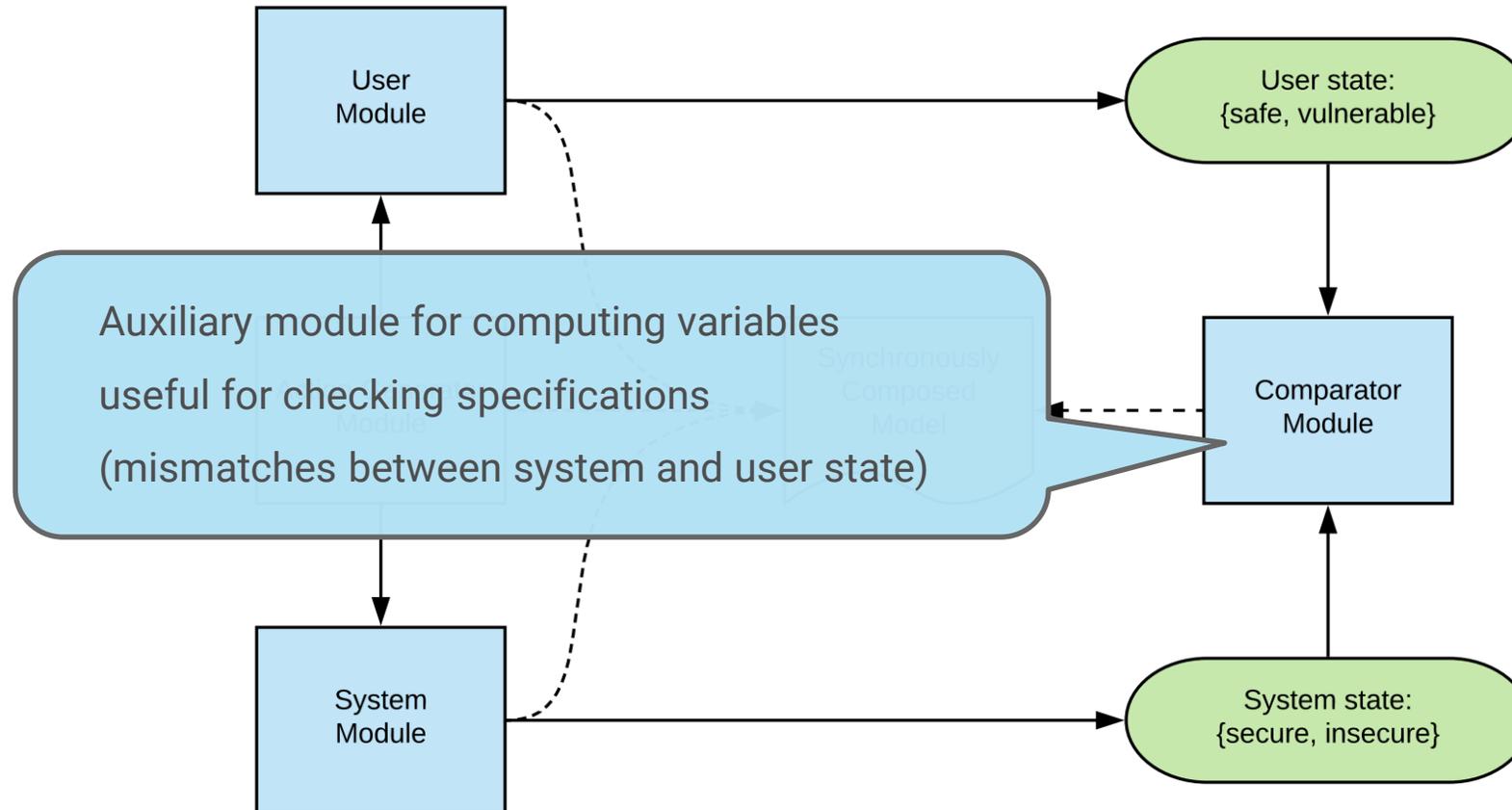
# Generic system model architecture



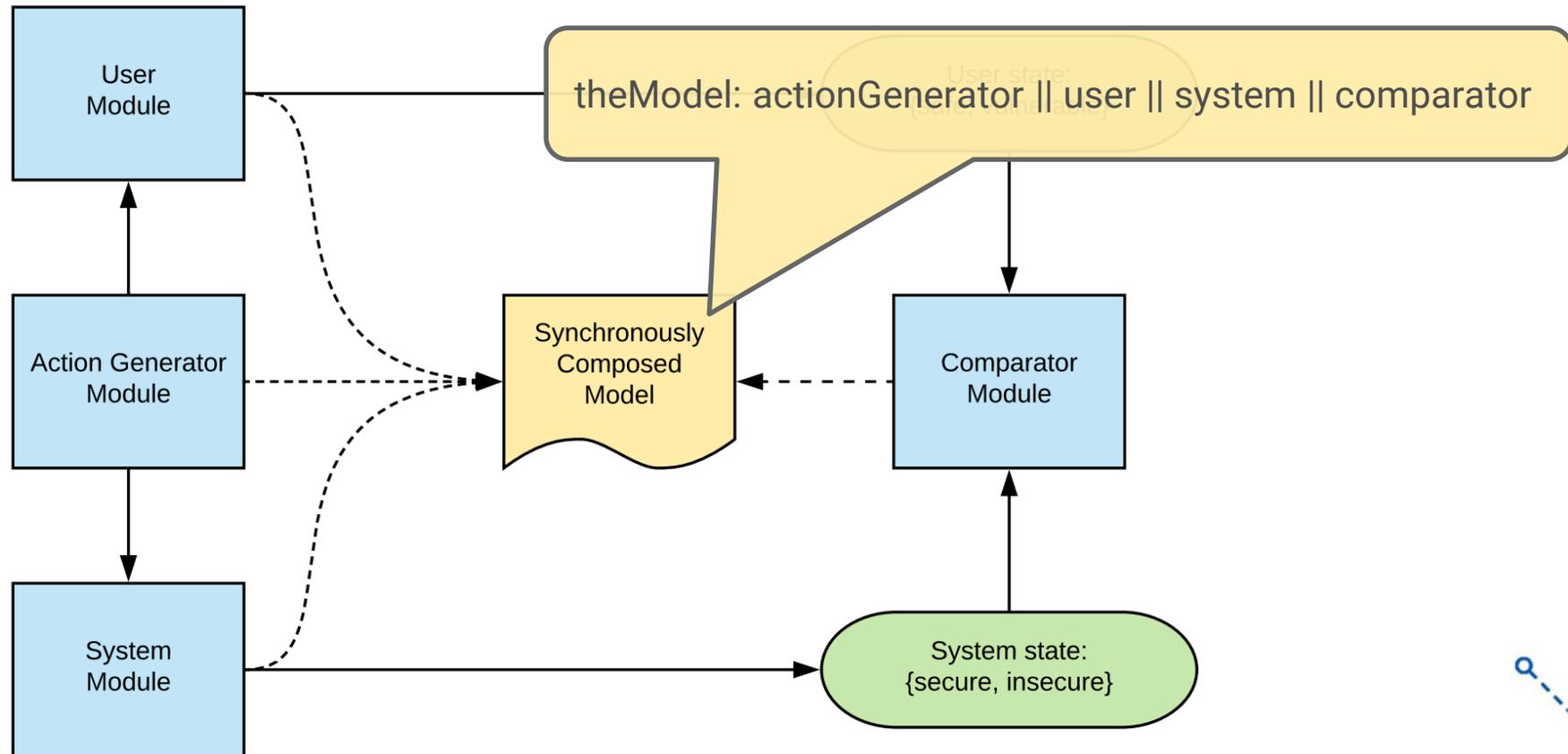
# Generic system model architecture



# Generic system model



# Generic system model





# Use case: Amazon Web Services

# What is AWS?

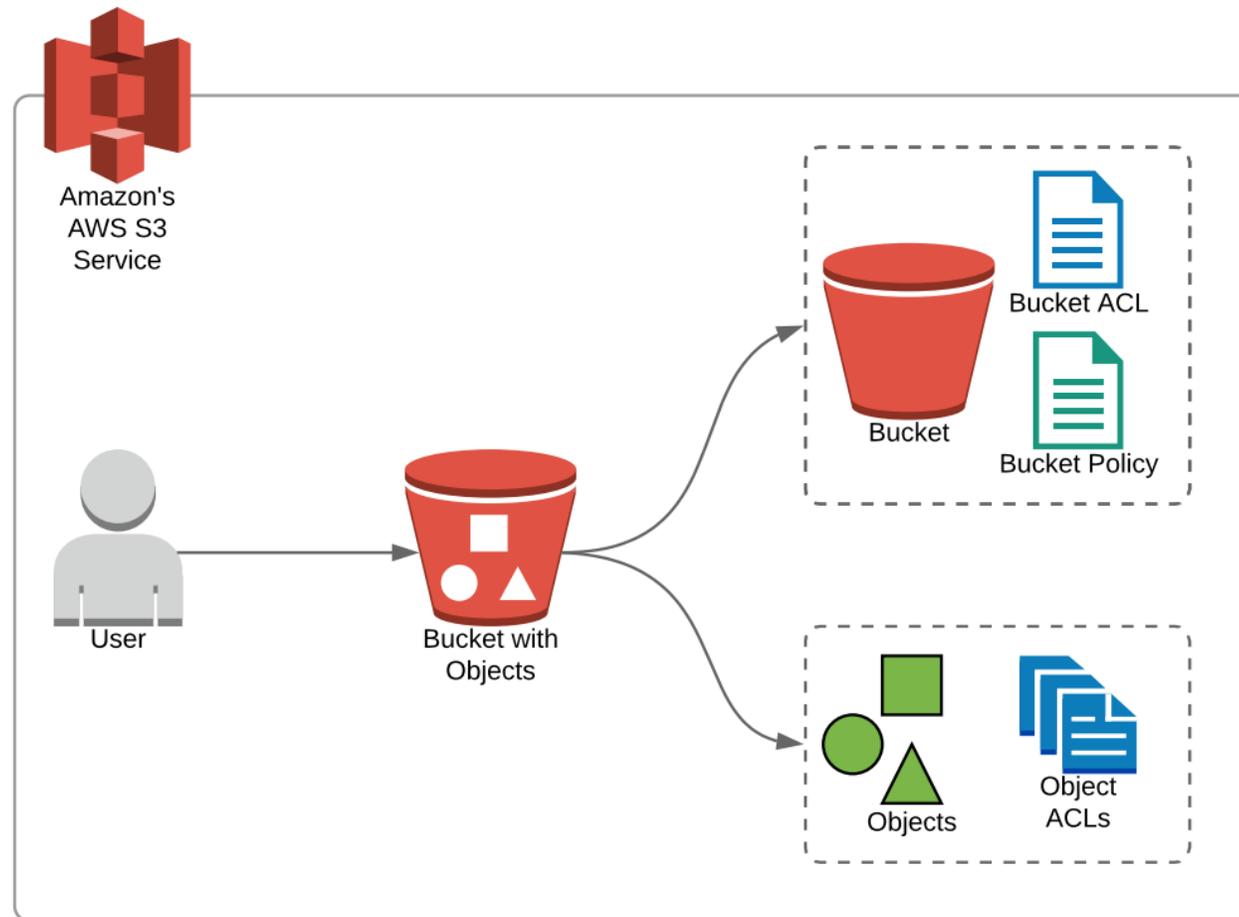
- Largest single provider of cloud computing and data storage services on the planet
- Range of (131) services, from small (AWS EC2) to very large (AWS Snowmobile)
- Netflix, Hulu, GE Oil and Gas, Kellogg's, Airbnb, NASA, NASDAQ, FICO
  - \$20B in revenue for Amazon in AY 2017
- Pay as you go, so anyone can create a free account
- What could go wrong?



# Customer data “fire sales”

- AWS Simple Storage Service, or S3
- Potentially difficult to secure, leaving data unprotected – easy targets
- Notable recent events:
  - Analytics company, 198 million voting records ([Newman, 2017](#))
  - BAH, 60K DoD files and passwords ([Cameron, 2017](#))
  - Pentagon, 100GB of contract and sensitive info ([O’Sullivan, 2017](#))
  - Verizon, 14 million customer records ([Whittaker, 2017](#))
  - National Credit Union Federation, 100GB of Social Security, bank accounts, and customer credit reports ([Ashok, 2017](#))

# How does S3 work?





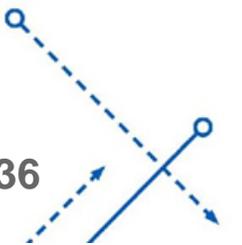
# How does a policy work?

```
1 {
2   "Id": "Policy1523476503635",
3   "Version": "2012-10-17",
4   "Statement": [
5     {
6       "Sid": "Stmt1523476501084",
7       "Action": [
8         "s3:GetBucketPolicy",
9         "s3:GetObject",
10        "s3:PutBucketPolicy",
11        "s3:PutObject"
12      ],
13      "Effect": "Allow",
14      "Resource": "arn:aws:s3:::alice-taxreturns/*",
15      "Principal": "*"
16    }
17  ]
18 }
```



# What can you do with S3?

- Store files of any type, from personal to corporate (I do)
- Control who can access what with ACLs and policies
- Apply server-side encryption to keep data safe
- Treat like an unlimited Dropbox or file sharing service
- Host static websites (I did)



# Our method is well-suited for this use case

- Widespread use among a range of customers
- Security controls are difficult to understand, hard to configure, offer overlapping functionality
- Potentially simple user model, potentially complex system model
  - How will users know if something is in an unsafe state?
  - Will they know how to recover if something bad happens?
- Difficult to anticipate how configuration could compromise security

# Analysis and Results



# Analysis scenario

- A user can take a number of actions with their S3 account
  - Create, modify, or delete resources (bucket and objects)
  - Change encryption settings on resources
  - Change permissions on resources (read, write, readPerms, writePerms)
- Can a user interacting with AWS S3 inadvertently compromise their security through a combination of configuration decisions?

mental: MODULE = BEGIN

```
LOCAL thinkBucketExists:    BOOLEAN
LOCAL thinkBucketEncryption: encryptionSetting
LOCAL thinkBucketACL:      permissionSetting
LOCAL thinkObjectExists:    BOOLEAN
LOCAL thinkObjectEncryption: encryptionSetting
LOCAL thinkObjectACL:      permissionSetting
INPUT  action:              userAction
INPUT  actionPerm:         permissionSetting
INPUT  actionEnc:          encryptionSetting
OUTPUT userWrite:          userState
OUTPUT userRead:          userState
```

#### INITIALIZATION

```
thinkBucketExists    = FALSE;
thinkObjectExists    = FALSE;
thinkBucketEncryption = none_Option;
thinkObjectEncryption = none_Option;
```

#### DEFINITION

```
userWrite = IF thinkObjectExists AND thinkObjectACL.public AND
  (thinkObjectACL.write OR thinkObjectACL.writePermissions) AND
  thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
userRead = IF thinkObjectExists AND thinkObjectACL.public AND
  (thinkObjectACL.read OR thinkObjectACL.readPermissions) AND
  thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
```

...

```
...
TRANSITION [
  action = create_Object AND thinkBucketExists AND NOT thinkObjectExists -->
    thinkObjectExists' = TRUE;
    thinkObjectEncryption' = actionEnc;
    thinkObjectACL' = actionPerm;

  [] action = delete_Object AND thinkObjectExists -->
    thinkObjectExists' = FALSE;
    thinkObjectEncryption' = none_Option;

  [] action = change_ObjectPermissions AND thinkObjectExists -->
    thinkObjectACL' = actionPerm;

  [] action = change_ObjectEncryption AND thinkObjectExists -->
    thinkObjectEncryption' = actionEnc;

  [] action = create_Bucket AND NOT thinkBucketExists -->
    thinkBucketExists' = TRUE;
    thinkBucketEncryption' = actionEnc;
    thinkBucketACL' = actionPerm;

  [] action = delete_Bucket AND thinkBucketExists -->
    thinkBucketExists' = FALSE;
    thinkBucketEncryption' = none_Option;
    thinkObjectExists' = FALSE;
    thinkObjectEncryption' = none_Option;

  [] action = change_BucketPermissions AND thinkBucketExists -->
    thinkBucketACL' = actionPerm;
    thinkObjectACL' = actionPerm;

  [] action = change_BucketEncryption AND thinkBucketExists -->
    thinkBucketEncryption' = actionEnc;
    thinkObjectEncryption' = IF thinkObjectExists = FALSE THEN
      none_Option ELSE actionEnc ENDIF;

  [] ELSE -->
    thinkObjectExists' = thinkObjectExists;
]
END;
```

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INPUT  action:              userAction
INPUT  actionPerm:          permissionSetting
INPUT  actionEnc:           encryptionSetting
OUTPUT userWrite:           userState
OUTPUT userRead:           userState
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  (thinkObjectACL.read OR thinkObjectACL.readPermissions) AND
  thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
```

## Variables describing things the human thinks about the system:

- Whether or not the bucket exists
- How the bucket is encrypted (if at all)
- The bucket's ACL permissions
- Whether or not the object exists
- How the object is encrypted (if at all)
- The object's ACL permissions

```
...
TRANSITION [
  action = create_Object AND thinkBucketExists AND NOT thinkObjectExists -->
  thinkObjectExists' = TRUE;
  thinkObjectEncryption' = actionEnc;
  thinkObjectACL' = actionPerm;
  [] action = delete_Object AND thinkObjectExists -->
  thinkBucketExists' = FALSE;
  thinkObjectExists' = FALSE;
  thinkObjectEncryption' = none_Option;
  [] action = change_ObjectPermissions AND thinkObjectExists -->
  thinkBucketACL' = actionPerm;
  thinkObjectACL' = actionPerm;
  [] action = change_BucketEncryption AND thinkBucketExists -->
  thinkBucketEncryption' = actionEnc;
  thinkObjectEncryption' = IF thinkObjectExists = FALSE THEN
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  [] ELSE -->
  thinkObjectExists' = thinkObjectExists;
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INPUT  action:               userAction
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INPUT  actionEnc:            encryptionSetting
OUTPUT userWrite:           userState
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#### INITIALIZATION

```
thinkBucketExists    = FALSE;
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...

```
...
TRANSITION [
  action = create_Object AND thinkBucketExists AND NOT thinkObjectExists -->
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  [] action = delete_Object AND thinkObjectExists -->
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  [] action = change_ObjectPermissions AND thinkObjectExists -->
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  thinkObjectEncryption' = actionEnc;

  [] action = change_ObjectEncryption AND thinkObjectExists -->
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  thinkObjectEncryption' = IF thinkObjectExists = FALSE THEN
    none_Option ELSE actionEnc ENDIF;

  [] ELSE -->
  thinkObjectExists' = thinkObjectExists;
]
END;
```

**Variables describing actions and their associated changes to ACL permissions and encryption**

mental: MODULE = BEGIN

```
LOCAL thinkBucketExists:    BOOLEAN
LOCAL thinkBucketEncryption: encryptionSetting
LOCAL thinkBucketACL:       permissionSetting
LOCAL thinkObjectExists:    BOOLEAN
LOCAL thinkObjectEncryption: encryptionSetting
LOCAL thinkObjectACL:       permissionSetting
INPUT  action:               userAction
INPUT  actionPerm:           permissionSetting
INPUT  actionEnc:            encryptionSetting
OUTPUT userWrite:            userState
OUTPUT userRead:             userState
```

#### INITIALIZATION

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  thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
```

...

```
...
TRANSITION [
  action = create_Object AND thinkBucketExists AND NOT thinkObjectExists -->
  thinkObjectExists' = TRUE;
  thinkObjectEncryption' = actionEnc;
  thinkObjectACL' = actionPerm;
```

**Variables representing what the human thinks about the Read and Write state of the system: safe or vulnerable**

```
[] action = delete_Bucket AND thinkBucketExists -->
  thinkBucketExists' = FALSE;
  thinkBucketEncryption' = none_Option;
  thinkObjectExists' = FALSE;
  thinkObjectEncryption' = none_Option;

>[] action = change_BucketPermissions AND thinkBucketExists -->
  thinkBucketACL' = actionPerm;
  thinkObjectACL' = actionPerm;

>[] action = change_BucketEncryption AND thinkBucketExists -->
  thinkBucketEncryption' = actionEnc;
  thinkObjectEncryption' = IF thinkObjectExists = FALSE THEN
    none_Option ELSE actionEnc ENDIF;

>[] ELSE -->
  thinkObjectExists' = thinkObjectExists;
]
END;
```

mental: MODULE = BEGIN

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LOCAL thinkBucketACL:       permissionSetting
LOCAL thinkObjectExists:    BOOLEAN
LOCAL thinkObjectEncryption: encryptionSetting
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INPUT  action:               userAction
INPUT  actionPerm:           permissionSetting
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[] action = change_ObjectPermissions AND thinkObjectExists -->
  thinkObjectACL'       = actionPerm;

[] action = change_ObjectEncryption AND thinkObjectExists -->
  thinkObjectEncryption' = actionEnc;

[] action = create_Bucket AND NOT thinkBucketExists -->
  thinkBucketExists'    = TRUE;
  thinkBucketEncryption' = actionEnc;
  thinkBucketACL'       = actionPerm;

```

## The initial mental model state:

- No bucket or object exists
- No encryption is set
- No assumptions are made about permissions

END;

...

# Guarded transitions in mental model state based on actions

```
INPUT  action:      userAction
INPUT  actionPerm:  permissionSetting
INPUT  actionEnc:   encryptionSetting
OUTPUT userWrite:   userState
OUTPUT userRead:   userState
```

## INITIALIZATION

```
thinkBucketExists = FALSE;
thinkObjectExists = FALSE;
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## DEFINITION

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  (thinkObjectACL.read OR thinkObjectACL.readPermissions) AND
  thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
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  thinkObjectEncryption' = actionEnc;

[] action = create_Bucket AND NOT thinkBucketExists -->
  thinkBucketExists' = TRUE;
  thinkBucketEncryption' = actionEnc;
  thinkBucketACL' = actionPerm;

[] action = delete_Bucket AND thinkBucketExists -->
  thinkBucketExists' = FALSE;
  thinkBucketEncryption' = none_Option;
  thinkObjectExists' = FALSE;
  thinkObjectEncryption' = none_Option;

[] action = change_BucketPermissions AND thinkBucketExists -->
  thinkBucketACL' = actionPerm;
  thinkObjectACL' = actionPerm;

[] action = change_BucketEncryption AND thinkBucketExists -->
  thinkBucketEncryption' = actionEnc;
  thinkObjectEncryption' = IF thinkObjectExists = FALSE THEN
    none_Option ELSE actionEnc ENDIF;

[] ELSE -->
  thinkObjectExists' = thinkObjectExists;
]
END;
```

mental: MODULE = BEGIN

```
LOCAL thinkBucketExists:    BOOLEAN
LOCAL thinkBucketEncryption: encryptionSetting
LOCAL thinkBucketACL:       permissionSetting
LOCAL thinkObjectExists:    BOOLEAN
LOCAL thinkObjectEncryption: encryptionSetting
LOCAL thinkObjectACL:       permissionSetting
INPUT  action:               userAction
INPUT  actionPerm:           permissionSetting
INPUT  actionEnc:            encryptionSetting
OUTPUT userWrite:            userState
OUTPUT userRead:            userState
```

**Example:** Changing the bucket permissions sets the bucket's and the object's permissions to the new permissions values

```
(thinkObjectACL.write OR thinkObjectACL.writePermissions) AND
thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
userRead = IF thinkObjectExists AND thinkObjectACL.public AND
(thinkObjectACL.read OR thinkObjectACL.readPermissions) AND
thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
```

...

```
...
TRANSITION [
  action = create_Object AND thinkBucketExists AND NOT thinkObjectExists -->
  thinkObjectExists' = TRUE;
  thinkObjectEncryption' = actionEnc;
  thinkObjectACL' = actionPerm;

  [] action = delete_Object AND thinkObjectExists -->
  thinkObjectExists' = FALSE;
  thinkObjectEncryption' = none_Option;

  [] action = change_ObjectPermissions AND thinkObjectExists -->
  thinkObjectACL' = actionPerm;

  [] action = change_ObjectEncryption AND thinkObjectExists -->
  thinkObjectEncryption' = actionEnc;

  [] action = create_Bucket AND NOT thinkBucketExists -->
  thinkBucketExists' = TRUE;
  thinkBucketEncryption' = actionEnc;
  thinkBucketACL' = actionPerm;

  [] action = delete_Bucket AND thinkBucketExists -->
  thinkBucketExists' = FALSE;
  thinkBucketEncryption' = none_Option;
  thinkObjectExists' = FALSE;
  thinkObjectEncryption' = none_Option;

  [] action = change_BucketPermissions AND thinkBucketExists -->
  thinkBucketACL' = actionPerm;
  thinkObjectACL' = actionPerm;

  [] action = change_BucketEncryption AND thinkBucketExists -->
  thinkBucketEncryption' = actionEnc;
  thinkObjectEncryption' = IF thinkObjectExists = FALSE THEN
  none_Option ELSE actionEnc ENDIF;

  [] ELSE -->
  thinkObjectExists' = thinkObjectExists;
]
END;
```

## The human's perception about Read and Write safety:

**IF** the object exists and: it has public permissions,  
the object can be written or its permissions can be written  
it has no encryption

**THEN** then writing is Vulnerable **OTHERWISE** writing is Safe

**IF** the object exists and: it has public permissions,  
the object can be read or its permissions can be read  
it has no encryption

**THEN** then reading is Vulnerable **OTHERWISE** reading is Safe

### DEFINITION

```
userWrite = IF thinkObjectExists AND thinkObjectACL.public AND  
  (thinkObjectACL.write OR thinkObjectACL.writePermissions) AND  
  thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;  
userRead = IF thinkObjectExists AND thinkObjectACL.public AND  
  (thinkObjectACL.read OR thinkObjectACL.readPermissions) AND  
  thinkObjectEncryption = none_Option THEN vulnerable ELSE safe ENDIF;
```

END;

```
[ ] action = change_BucketPermissions AND thinkBucketExists -->  
  thinkBucketACL' = actionPerm;  
  thinkObjectACL' = actionPerm;  
[ ] action = change_BucketEncryption AND thinkBucketExists -->  
  thinkBucketEncryption' = actionEnc;  
  thinkObjectEncryption' = IF thinkObjectExists = FALSE THEN  
    none_Option ELSE actionEnc ENDIF;  
[ ] ELSE -->  
  thinkObjectExists' = thinkObjectExists;
```

# Results

Table 4.1: Amazon AWS S3 Use Case Verification Results

	False Vulnerability			False Safety			Blocking		
	States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result
Read	932,580	0.12	✗	932,580	0.12	✗	3,229,908	0.61	✓
Write	932,580	0.12	✗	932,580	0.11	✗	3,188,724	0.36	✓

*Note.* A ✓ indicates a proof was returned, while a ✗ indicates a counterexample was returned.

# Results

Table 4.1: Amazon AWS S3 Use Case Verification Results

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Write	932,580	0.12	✗	932,580	0.11	✗	3,188,724	0.36	✓

Note. A ✓ indicates a proof was returned, while a ✗ indicates a counterexample was returned.

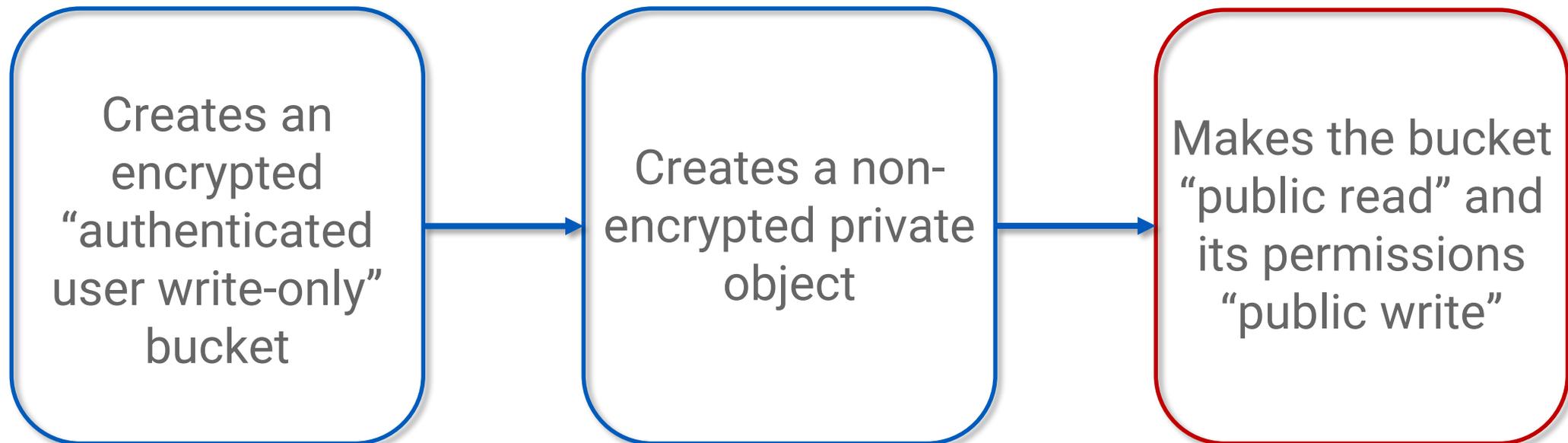
Improper Understanding of Permissions

Improper Understanding of Encryption

## Results: False Security Read Mismatch



## Results: False Vulnerability Write Mismatch



# Validation

- We recreated all four scenarios within an AWS S3 account
- All represent sensible scenarios possible with a minimum of clicks and steps
- Permissions mismatches could explain majority of scenarios identified in press coverage about AWS breaches (more investigation needed)

## Potential limitations

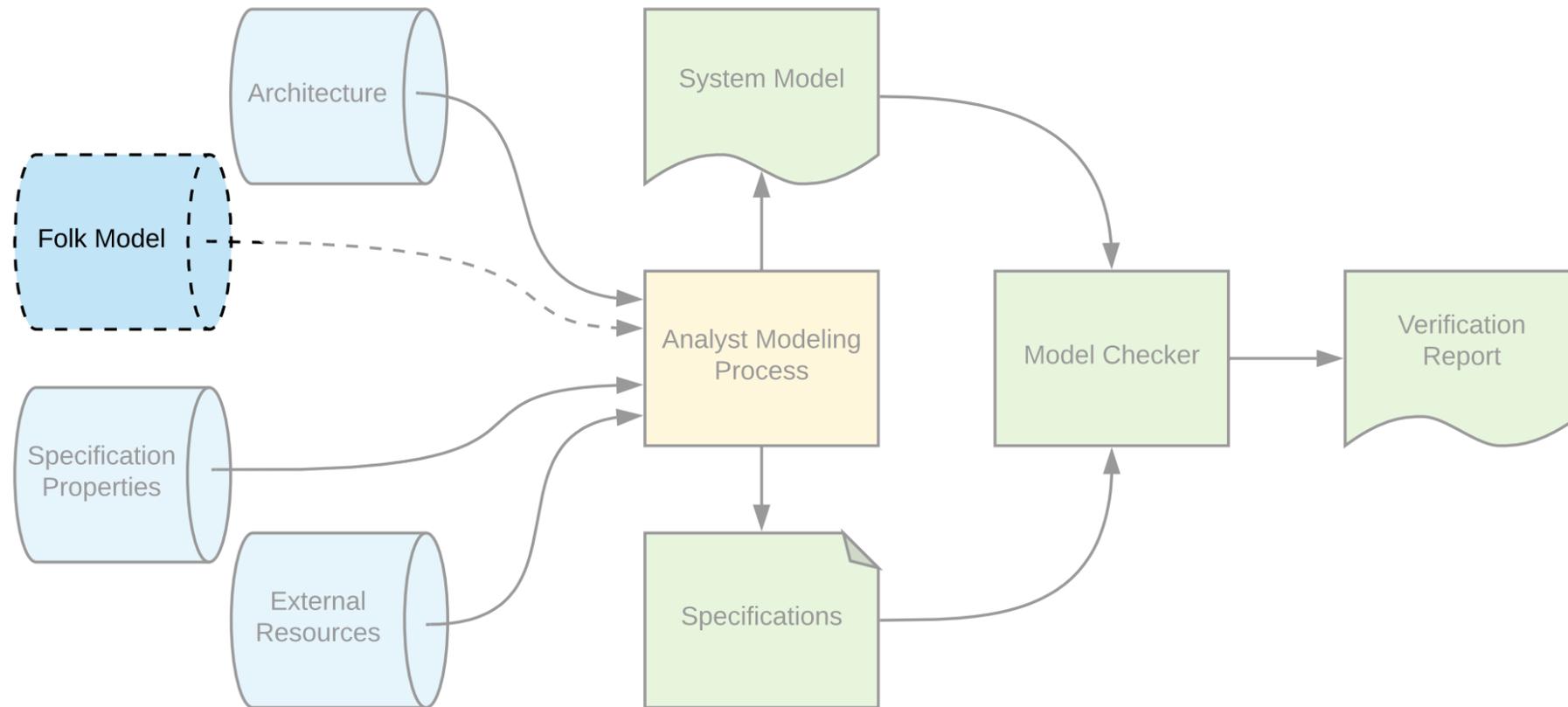
- Our method only uses a generically-instantiated mental model
- Lacks the capability to determine effects of different mental models on cybersecurity
- Addressed in second part of the dissertation

## Part II:

# Integrating folk models of cybersecurity vulnerabilities



# Extending the method



# Extending the method: Folk model input

Table 5.1: Folk models and adherence to security advice

Computer security advice	Folk models			
	Graffiti	Burglar	Big Fish	Contractor
1. Use anti-virus software	∅	3	1	1
2. Keep anti-virus software updated	∅	∅	∅	1
3. Regularly scan computer with anti-virus	∅	∅	∅	1
4. Use security software (firewall, etc.)	2	2	2	1
5. Don't click on attachments	3	3	∅	∅
6. Be careful downloading from websites	2	2	1	1
7. Be careful which websites you visit	3	3	2	3
8. Disable scripting in web and mail	∅	∅	∅	1
9. Use good passwords	2	∅	2	1
10. Make regular backups	3	1	1	1
11. Keep patches up-to-date	3	3	1	1
12. Turn off computer when not in use	2	3	1	1

3: "It is very important to follow this advice."

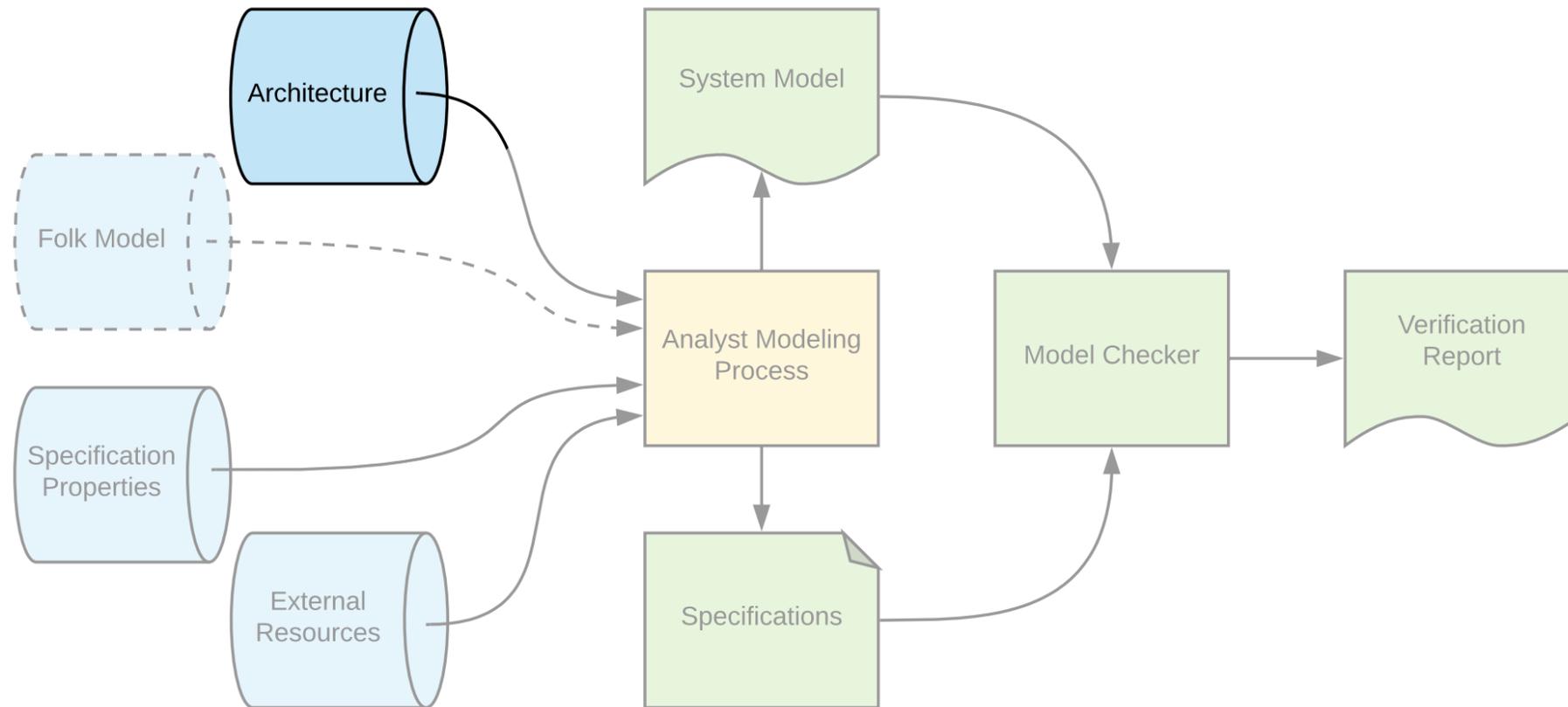
2: "Following this advice might help, but it isn't all that important to do."

1: "It is not necessary to follow this advice."

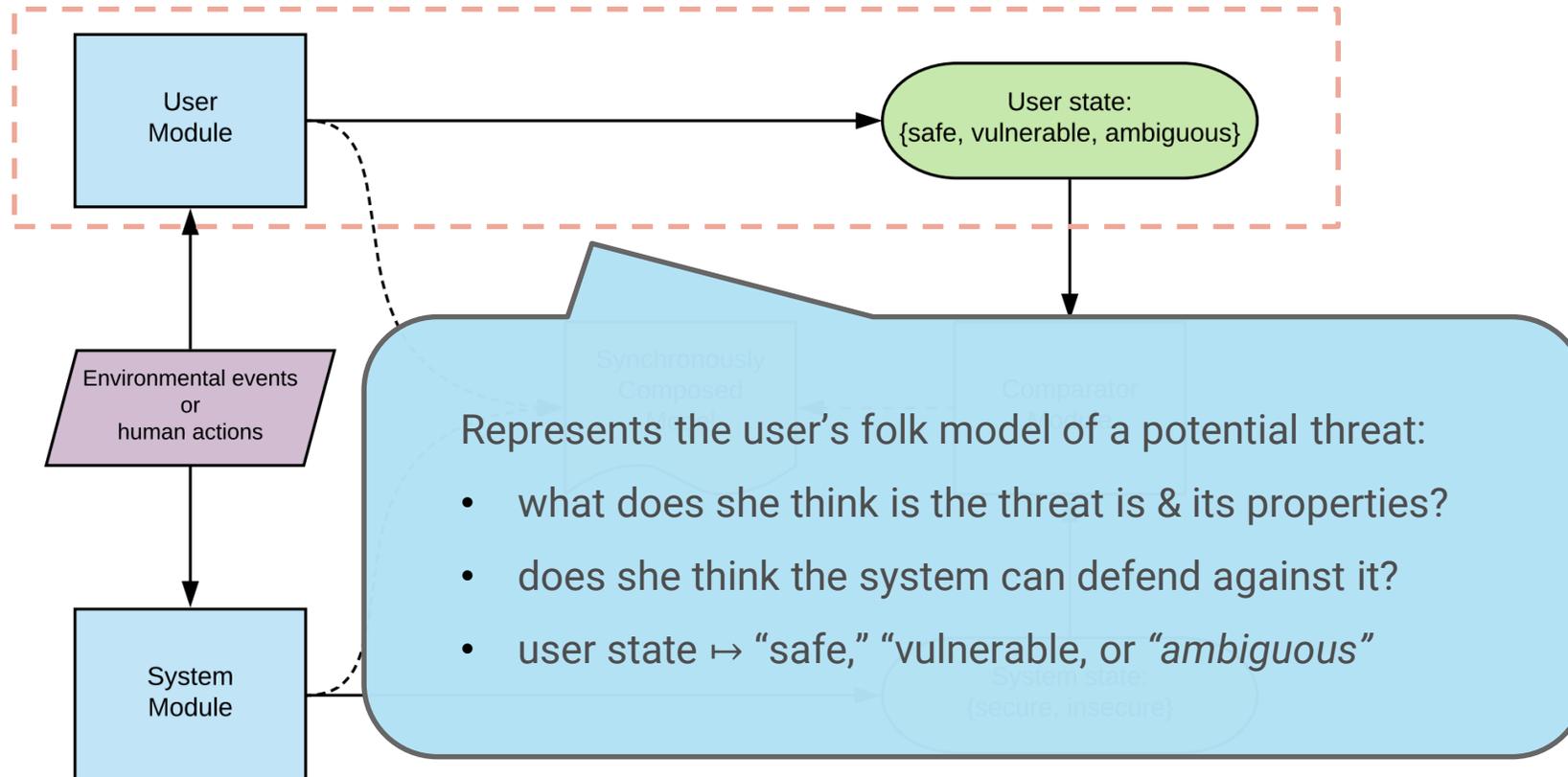
∅: "This model has nothing to say about this advice, or there is insufficient data from interviews to determine an opinion."

*Note.* A summary of survey user data regarding the importance of following security advice with respect to their folk models of hackers. Descriptions of the importance levels appearing in quotations has been taken directly from Wash, 2010, p. 10, and the remainder of the table has been adapted.

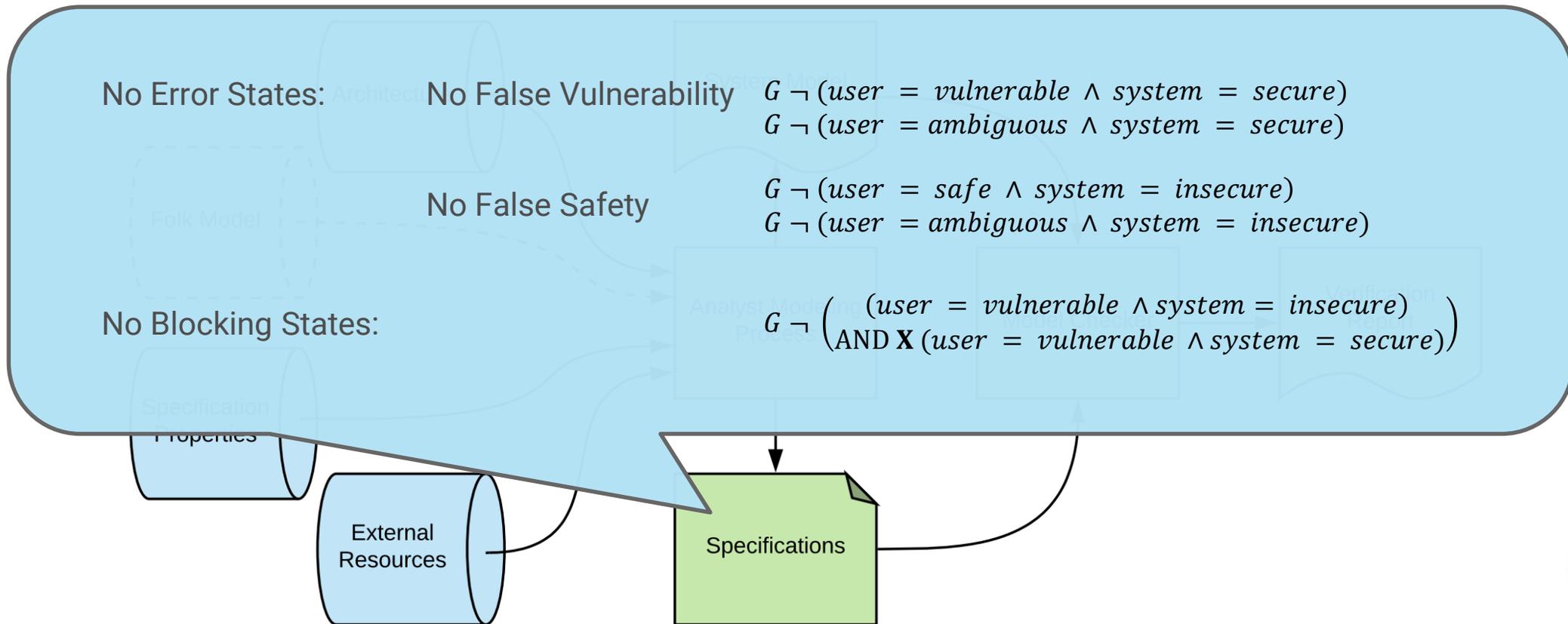
# Extending the method



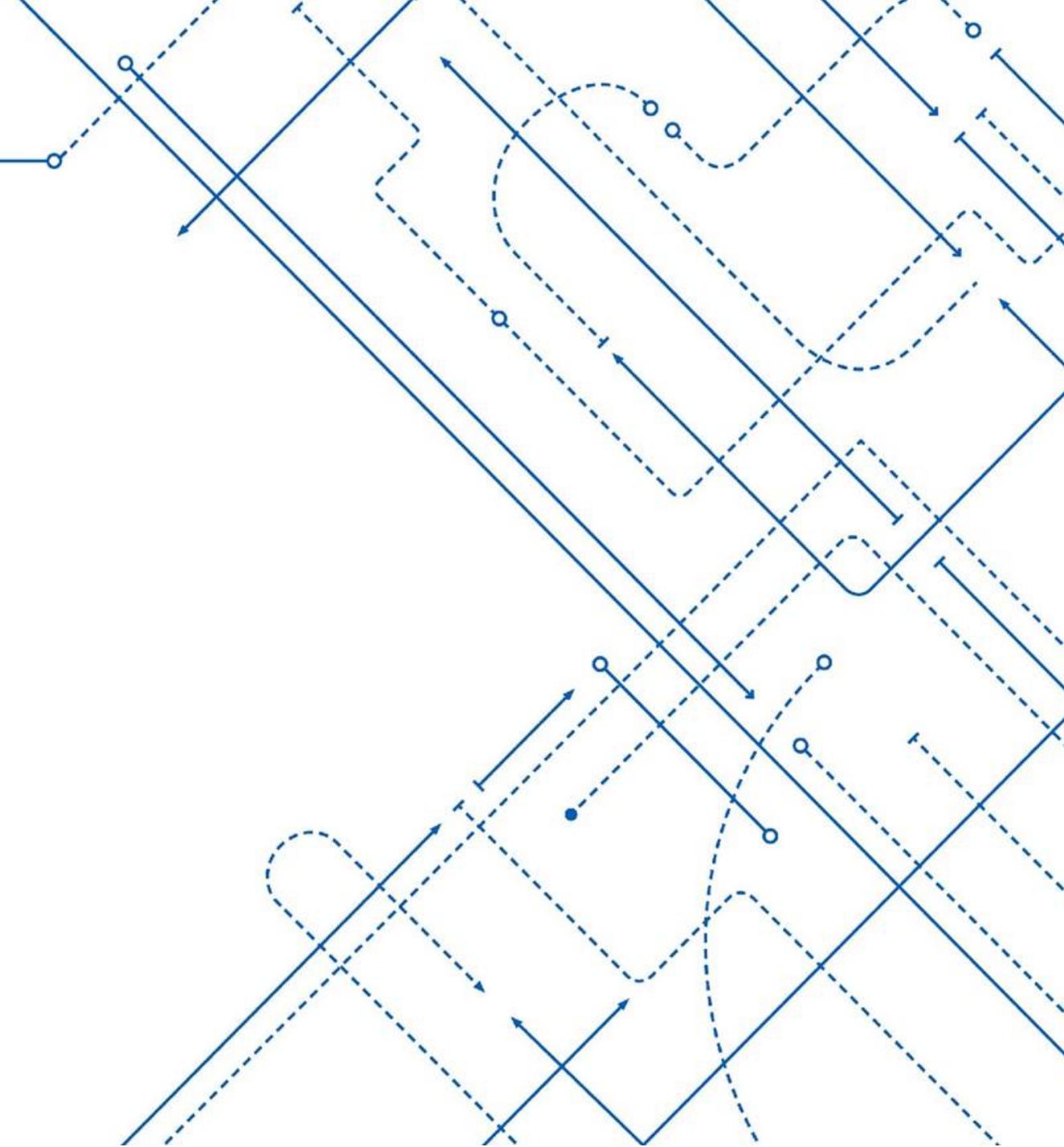
# Extending the method: Updated architecture



# Extending the method: Updated architecture



# Use case: Phishing attacks



## Analysis scenario

- Phishing: sending deceptive emails with the intent of gathering personal information, credentials, installing malware, or other malicious purposes
- Email is received that has one of three “threat types”: link, download, and attachment
- Users respond to them in a way informed by their folk model of the perceived threat:

Click a website link  
Toggle ad blocker

Download from website  
Patch their software

Open attachment  
No Action

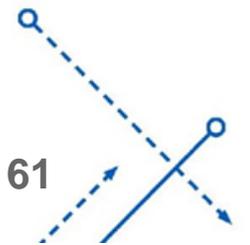


Table 5.1: Folk models and adherence to security advice

Computer security advice	Folk models			
	Graffiti	Burglar	Big Fish	Contractor
Use anti-virus software	∅	3	1	1
Keep anti-virus software updated	∅	∅	∅	1
Regularly scan computer with anti-virus	∅	∅	∅	1
Use security software (firewall, etc.)	2	2	2	1
Don't click on attachments	3	3	∅	∅
Be careful downloading from websites	2	2	1	1
Be careful which websites you visit	3	3	2	3
Disable scripting in web and mail	∅	∅	∅	1
Use good passwords	2	∅	2	1
Make regular backups	3	1	1	1
Keep patches up-to-date	3	3	1	1
Turn off computer when not in use	2	3	1	1

Action	Folk models			
	Graffiti	Burglar	Big Fish	Contractor
Toggle ad blocker	Depends	Depends	Depends	No Change
Open attachment	Insecure	Insecure	Ambiguous	Ambiguous
Download from website	Depends	Depends	No Change	No Change
Click a website link	Insecure	Insecure	Depends	Insecure
Patch their software	Insecure	Insecure	No Change	No Change
No Action	No Change	No Change	No Change	No Change

3: "It is very important to follow this advice."

2: "Following this advice might help, but it isn't all that important to do."

1: "It is not necessary to follow this advice."

∅: "This model has nothing to say about this advice, or there is insufficient data from interviews to determine an opinion."

Table 5.1: Folk models and adherence to security advice

Computer security advice	Folk models			
	Graffiti	Burglar	Big Fish	Contractor
Use anti-virus software	∅	3	1	1
Keep anti-virus software updated	∅	∅	∅	1
Regularly scan computer with anti-virus	∅	∅	∅	1
Use security software (firewall, etc.)	2	2	2	1
Don't click on attachments	3	3	∅	∅
Be careful downloading from websites	2	2	1	1
Be careful which websites you visit	3	3	2	3
Disable scripting in web and mail	∅	∅	∅	1
Use good passwords	2	∅	2	1
Make regular backups	3	1	1	1
Keep patches up-to-date	3	3	1	1
Turn off computer when not in use	2	3	1	1

3: "It is very important to follow this advice."

2: "Following this advice might help, but it isn't all that important to do."

1: "It is not necessary to follow this advice."

∅: "This model has nothing to say about this advice, or there is insufficient data from interviews to determine an opinion."

Action	Folk models			
	Graffiti	Burglar	Big Fish	Contractor
Toggle ad blocker	Depends	Depends	Depends	No Change
Open attachment	Insecure	Insecure	Ambiguous	Ambiguous
Download from website	Depends	Depends	No Change	No Change
Click a website link	Insecure	Insecure	Depends	Insecure
Patch their software	Insecure	Insecure	No Change	No Change
No Action	No Change	No Change	No Change	No Change

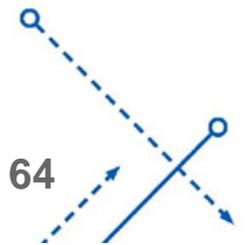
**IF** siteContent = basic **AND** software = secure **THEN**  
 no change  
**ELSE**  
 vulnerable  
**ENDIF**

# Results: False Vulnerability Mismatches

Table 5.2: Folk Model-Cross-Attack Verification Results: False Vulnerability Error States with Potential Ambiguity

Folk Model	Link			Download			Attachment			No Action		
	States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result
Graffiti	798	0.06	✗	816	0.06	✗	834	0.06	✗	930	0.06	✓
Burglar	798	0.07	✗	816	0.06	✗	834	0.06	✗	930	0.07	✓
Big Fish	816	0.07	✗	978	0.06	✓	858, 840	0.07, 0.07	✓ ●	1002	0.07	✓
Contractor	810	0.06	✗	978	0.08	✓	858, 846	0.06, 0.05	✓ ●	1002	0.06	✓

*Note.* A ✓ indicates a generic proof was returned, a ✗ indicates a generic counterexample was returned, and a ● indicates that an “ambiguity” counterexample was returned. Where ● is absent, an “ambiguity” proof was returned.



# Results: False Safety Mismatches

Table 5.3: Folk Model-Cross-Attack Verification Results: False Safety Error States with Potential Ambiguity

Folk Model	Link			Download			Attachment			No Action		
	States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result
Graffiti	846	0.07	✓	834	0.06	✗	858	0.06	✓	906	0.07	✓
Burglar	846	0.06	✓	834	0.06	✗	858	0.06	✓	906	0.08	✓
Big Fish	864, 906	0.07, 0.06	✗ ●	930	0.06	✗	858, 870	0.06, 0.07	✓ ●	960	0.06	✓
Contractor	846	0.07	✓	954	0.07	✗	858, 870	0.06, 0.06	✓ ●	966	0.06	✓

Note. A ✓ indicates a generic proof was returned, a ✗ indicates a generic counterexample was returned, and a ● indicates that an “ambiguity” counterexample was returned. Where ● is absent, an “ambiguity” proof was returned.

# Results: Blocking State Mismatches

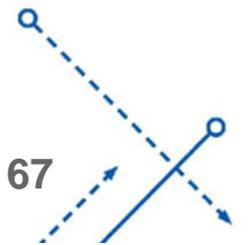
Table 5.4: Folk Model-Cross-Attack Verification Results: Blocking States

Folk Model	Link			Download			Attachment			No Action		
	States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result
Graffiti	834	0.06	✓	834	0.06	✓	834	0.07	✓	834	0.06	✓
Burglar	834	0.07	✓	834	0.05	✓	834	0.07	✓	834	0.06	✓
Big Fish	834	0.07	✓	834	0.06	✓	834	0.06	✓	834	0.05	✓
Contractor	834	0.06	✓	834	0.07	✓	834	0.06	✓	834	0.07	✓

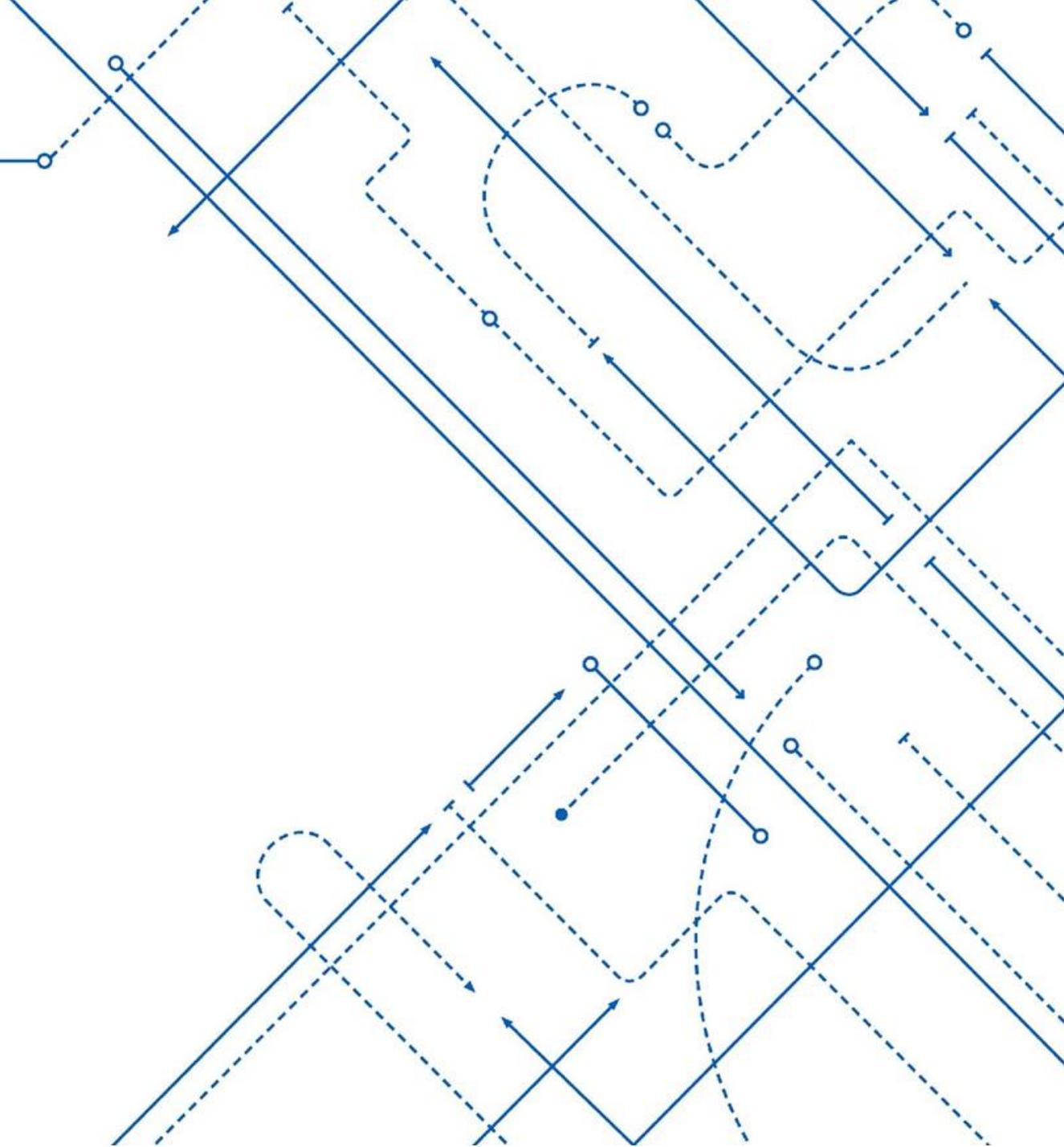
Note. A ✓ indicates a proof was returned, while a ✗ indicates a counterexample was returned.

# Validation using real-world data

- Used data collected by Cofense, phishing training and simulation
  - **2016**: 18mos, 40 million simulation emails, 1,000 organizations
  - **2017**: 24mos, 52.4 million emails, 216,000 real emails, 1,400 organizations
- Significant agreement between data and findings
  - False security: Real users fell for link-based attacks more than others
  - False vulnerability: Real users drastically over-report emails with links as phishing attempts
  - High face validity associated with these findings
- Some limitations to using a “found” data set vs purpose-collected data



# Conclusion

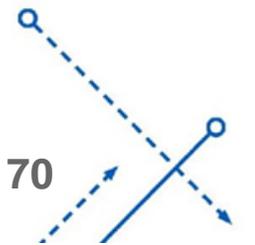


# Significant findings and takeaways

- A framework that ...
  - extends Degani and Heymann (2002)'s concepts to cybersecurity
  - establishes formal analytic constructs for cybersecurity applications
  - improves rigor and brings runnability to folk modeling approaches
- To the best of our knowledge, these are completely novel developments
- Validated our findings using real-world data
  - Sometimes difficult to do with work in formal methods
  - Finds potential vulnerabilities that exist without altering code or breaking the law

## Future work

- Additional CTL recovery specifications
- Update Wash (2010)'s folk modeling concepts for modern threats
- Expand AWS method to include complete bucket policies
- Investigate physical exploit delivery strategies (e.g., rubber duckies)
- Explore specific software utilities (Gmail vs Outlook vs Thunderbird)
- Integrate our method into cybersecurity testbeds (National Cyber Range)



# Published and planned literature

## Dissertation-related work:

**Houser, A.**, and Bolton, M.L. (2017). Formal mental models for inclusive privacy and security. In *Proceedings of the Thirteenth Symposium on Usable Privacy and Security (SOUPS)*, Santa Clara CA.

**Houser, A.**, Bolton, M.L., Bisantz, A.M., and Zhuang, J. (n.d.) Discovering unanticipated human-automation interaction in cybersecurity using formal methods techniques. In preparation.

*Plus one more journal article and perhaps two more conference papers...*

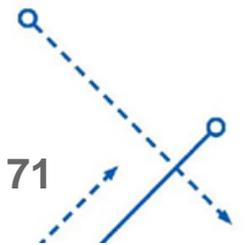
## Additional work:

**Houser, A.**, Ma, L., Feigh, K., and Bolton, M.L. (2017). Using formal methods to reason about taskload and resource conflicts in simulated air traffic scenarios. *Innovations in Systems and Software Engineering*, 14(1), pp. 1-14. DOI 10.1007/s11334-017-0305-2.

Bolton, M. L., Zheng, X., Molinaro, K., **Houser, A.**, and Li, M. (2016). Improving the scalability of formal human-automation interaction verification analyses that use task analytic models. *Innovation in Systems and Software Engineering*, 13(1), pp. 1-17. DOI 10.1007/s11334-016-0272-z.

**Houser, A.**, Ma, L. M., Feigh, K., and Bolton, M. L. (2015). A formal approach to modeling and analyzing human taskload in simulated air traffic scenarios. In *Proceedings of the IEEE International Conference on Complex Systems Engineering*, 6 pages. Piscataway: IEEE.

Ma, L., **Houser, A.**, Feigh, K., and Bolton, M.L. (n.d.) An analysis of air traffic management concepts of operation using simulation and formal verification. Under review with the American Institute of Aeronautics and Astronautics (AIAA).



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## Articles under review:

Ma, L., **Houser, A.**, Feigh, K., and Bolton, M.L. (n.d.) An analysis of air traffic management concepts of operation using simulation and formal verification. Under review with the American Institute of Aeronautics and Astronautics (AIAA).

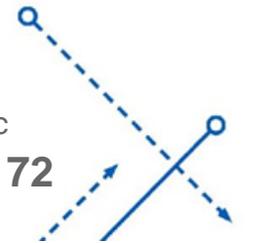
## Articles in preparation:

**Houser, A.**, Bolton, M.L., Bisantz, A.M., and Zhuang, J. (n.d.) Discovering unanticipated human-automation interaction in cybersecurity using formal methods techniques.

## Published conference papers:

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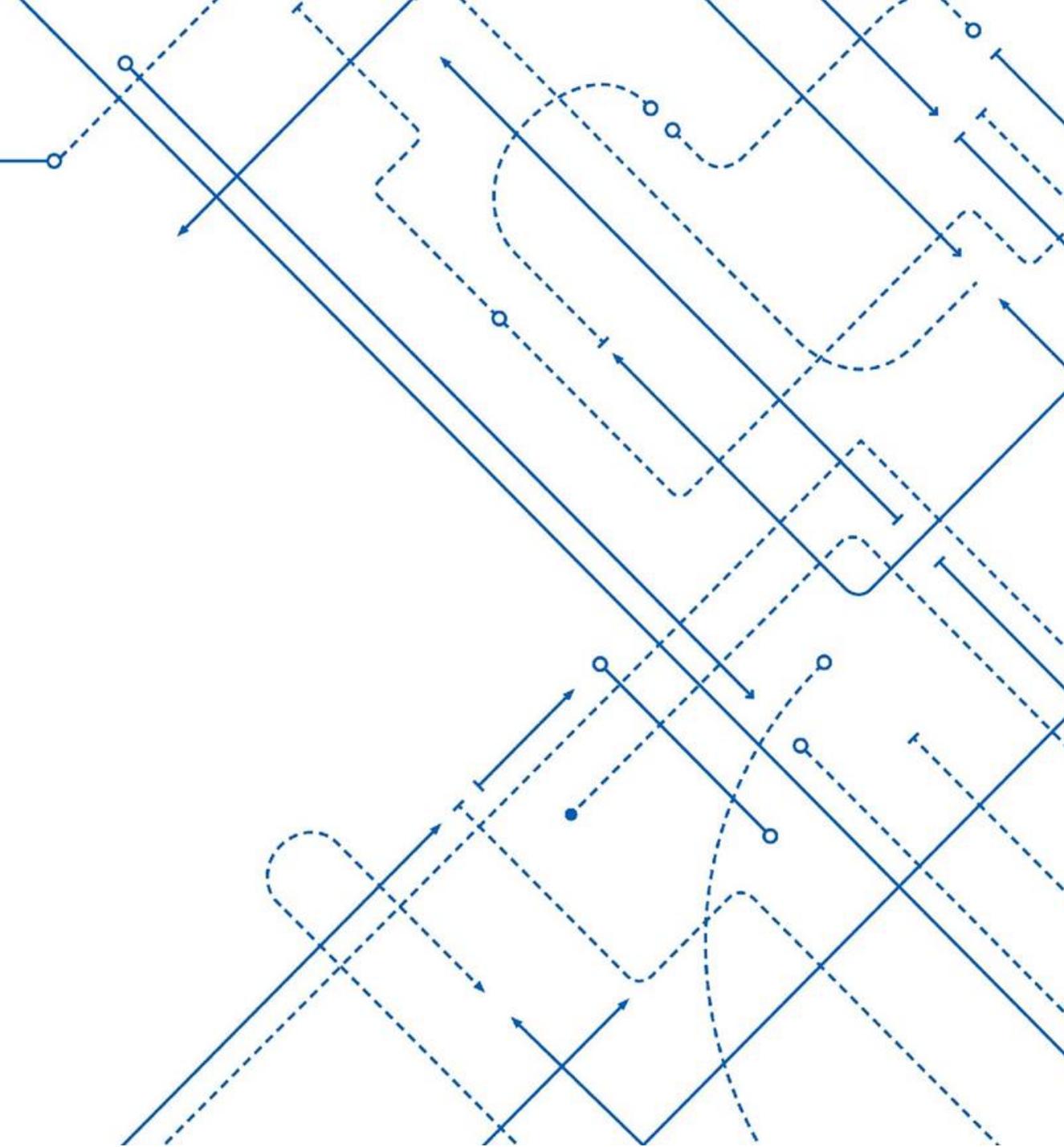
# Thank you for attending!

[adam.m.houser@gmail.com](mailto:adam.m.houser@gmail.com)

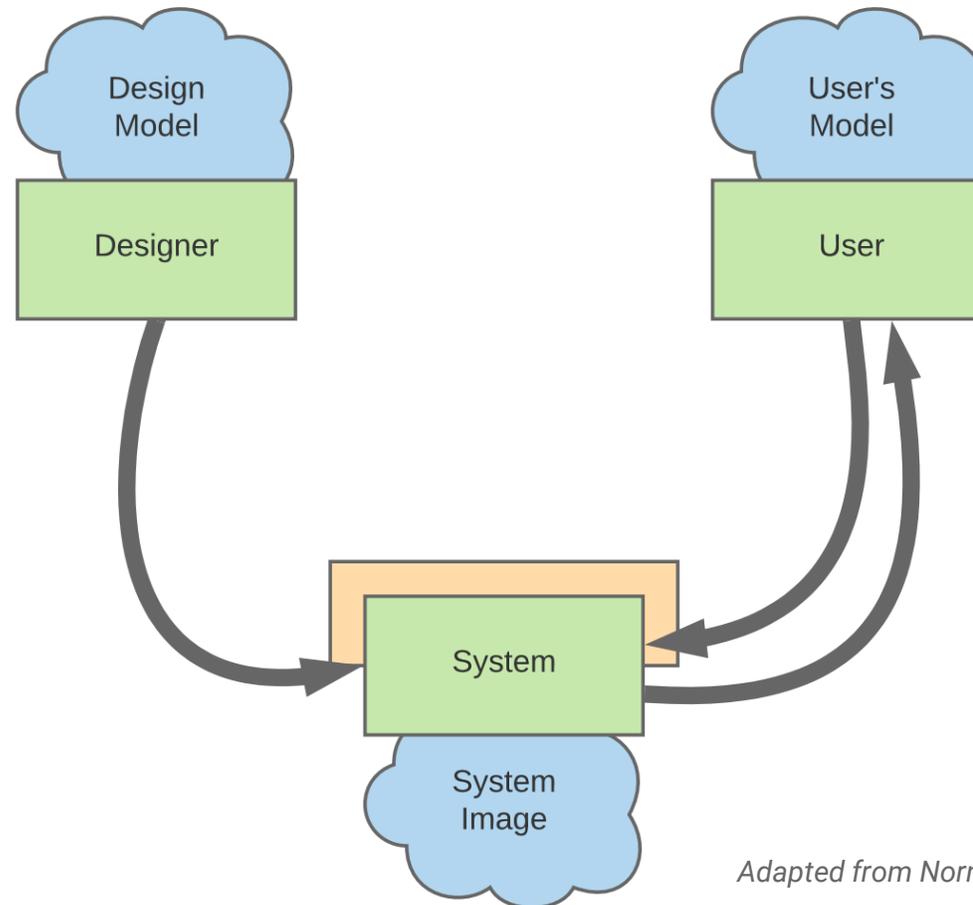
[@neutrinos4all](#)

[appliedcaffeine.org](http://appliedcaffeine.org)

# Reserve Slides

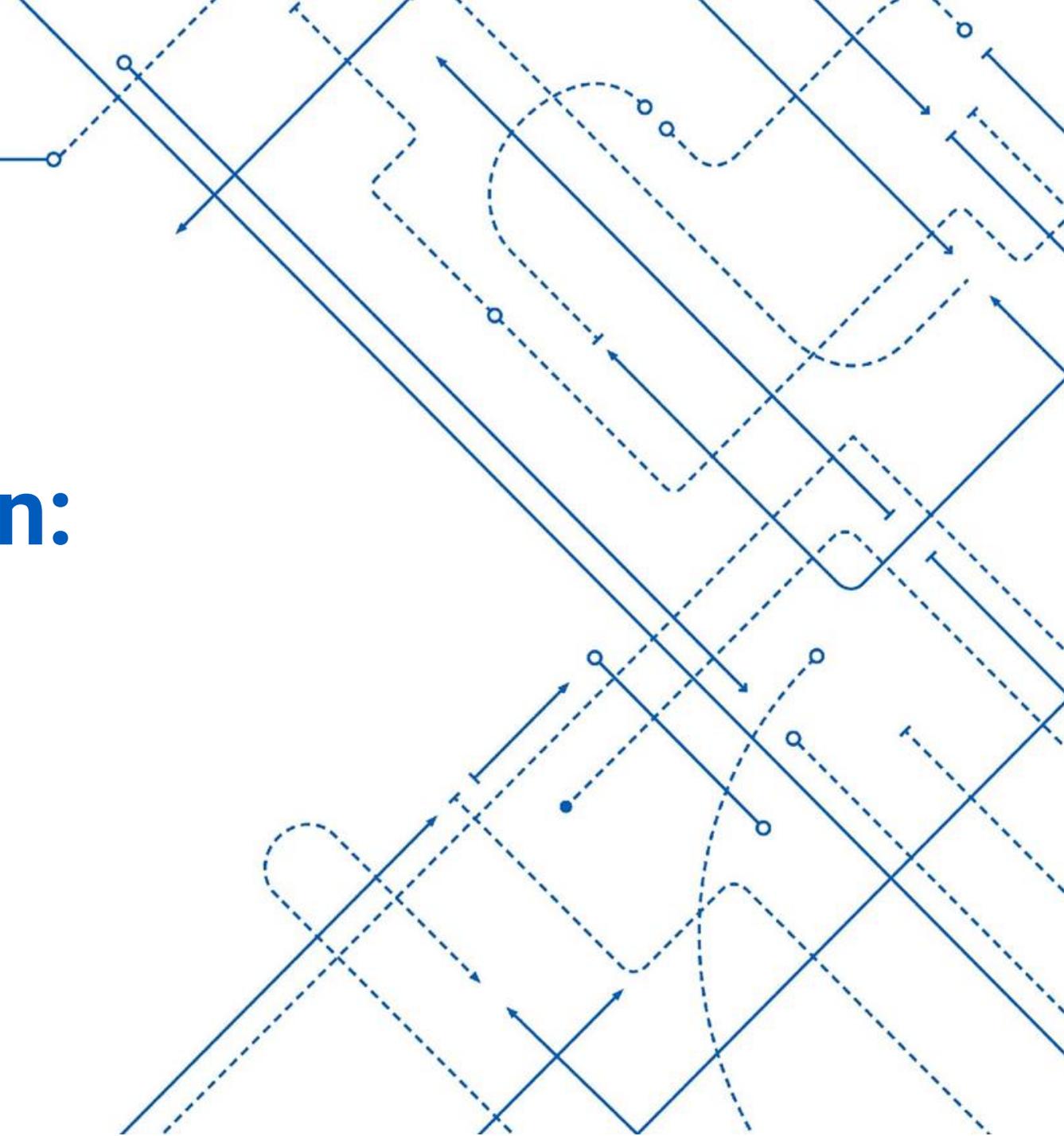


# Norman on mental models

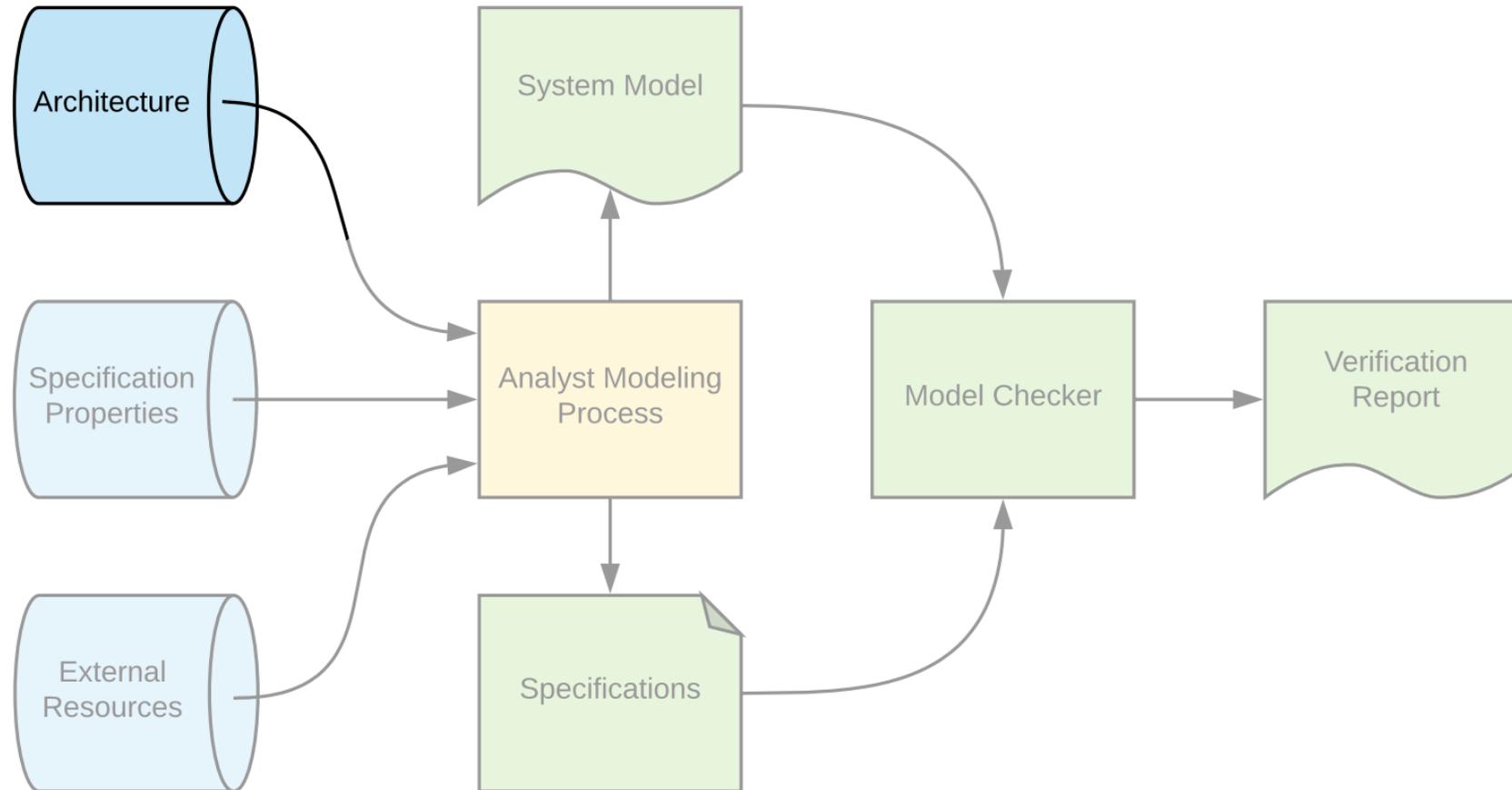


*Adapted from Norman (1983, 2007)*

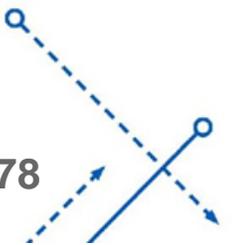
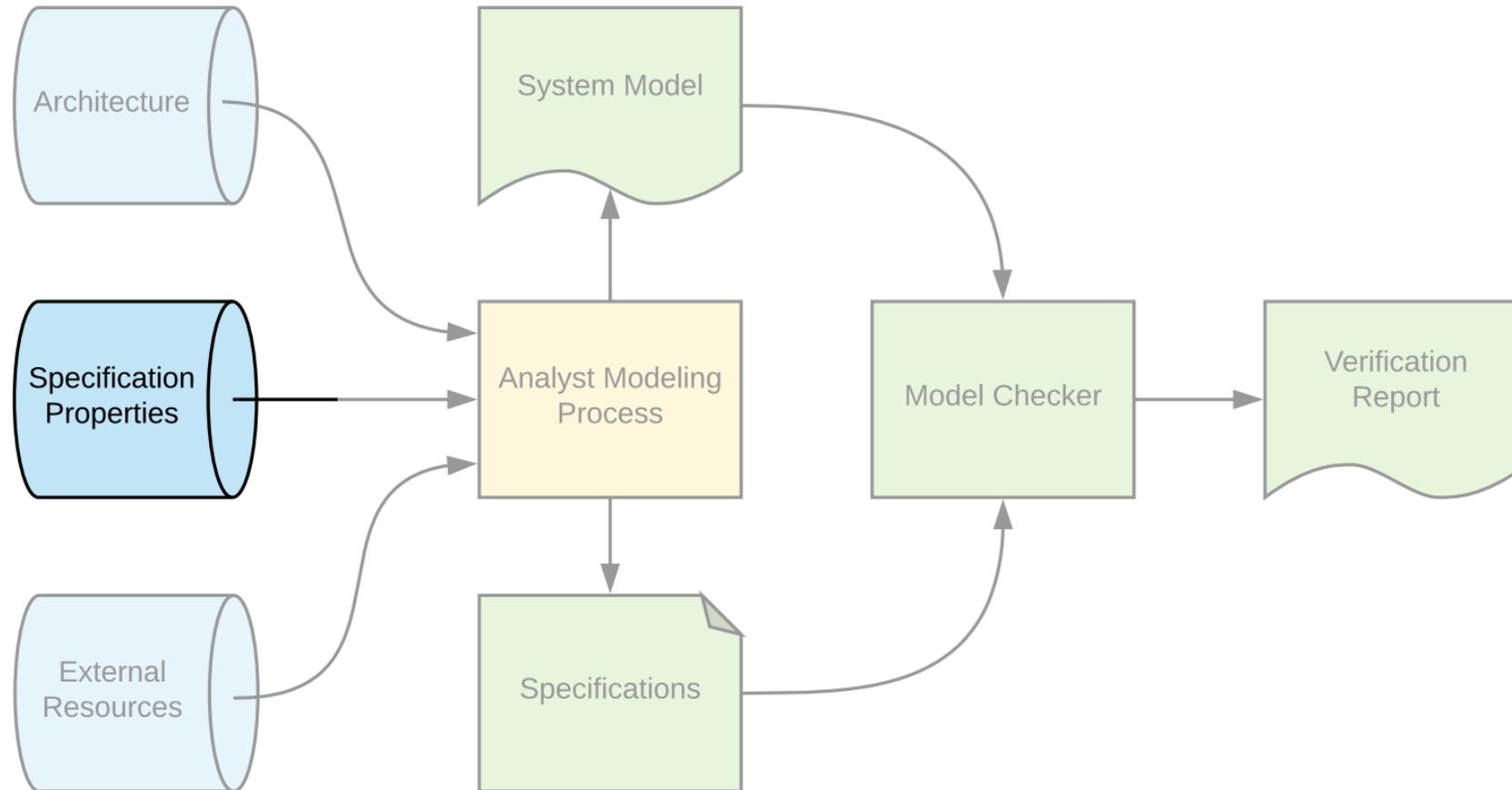
# Generic formulation: Stepwise overview



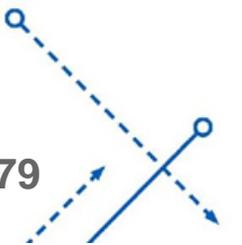
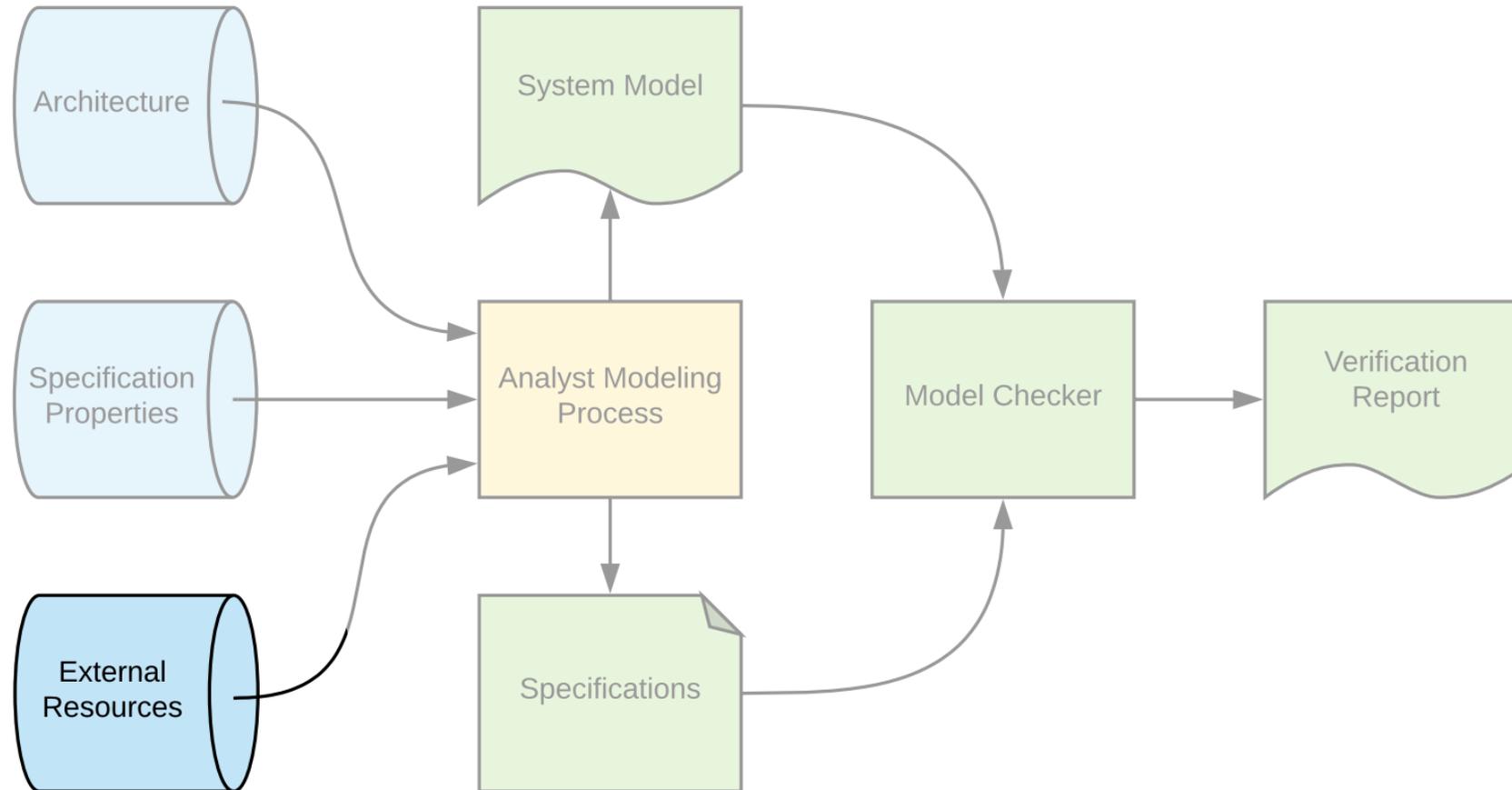
# Generic formulation of the method



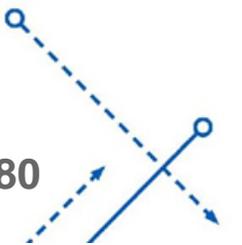
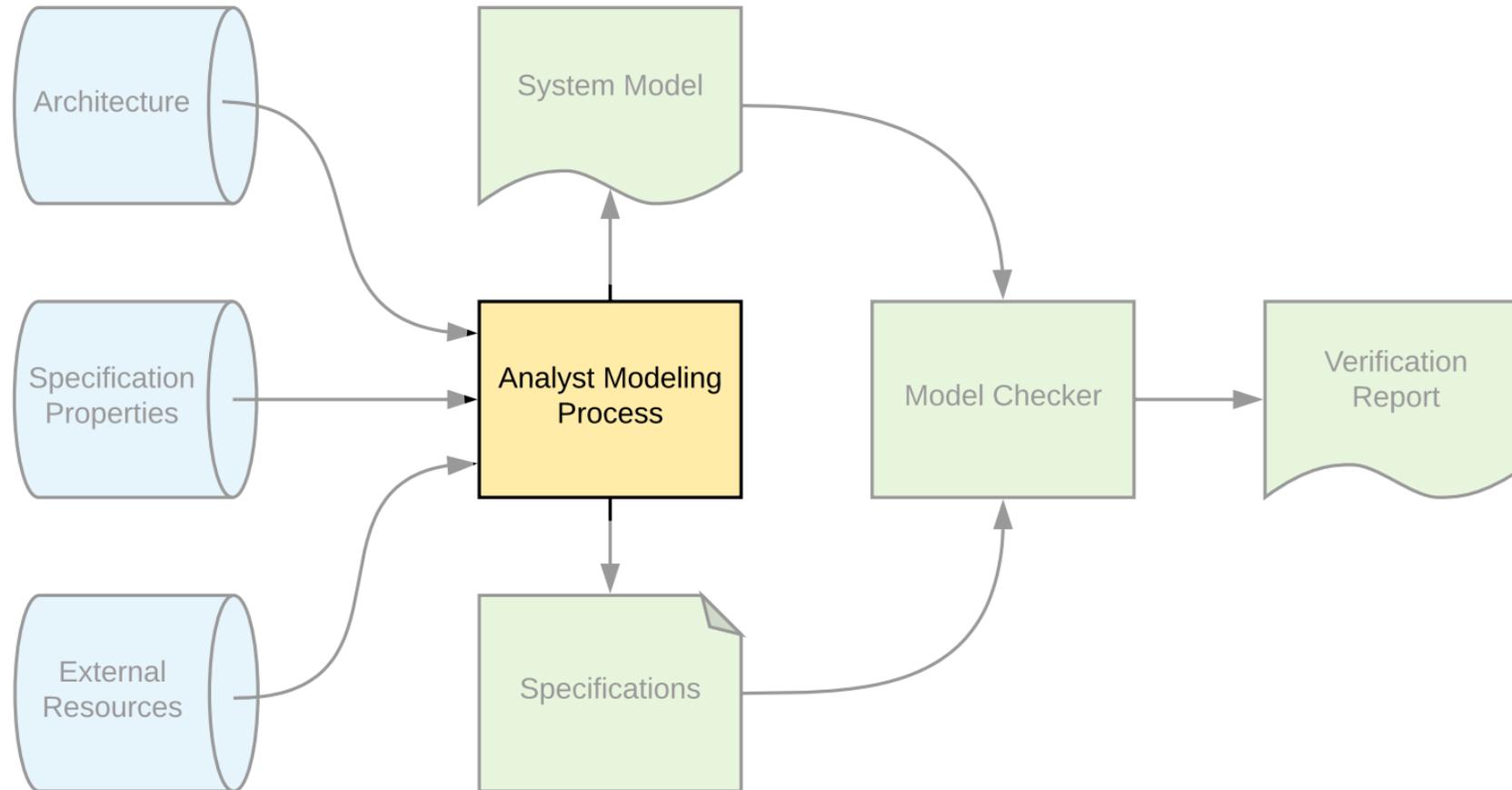
# Generic formulation of the method



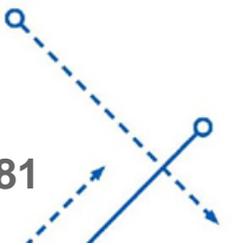
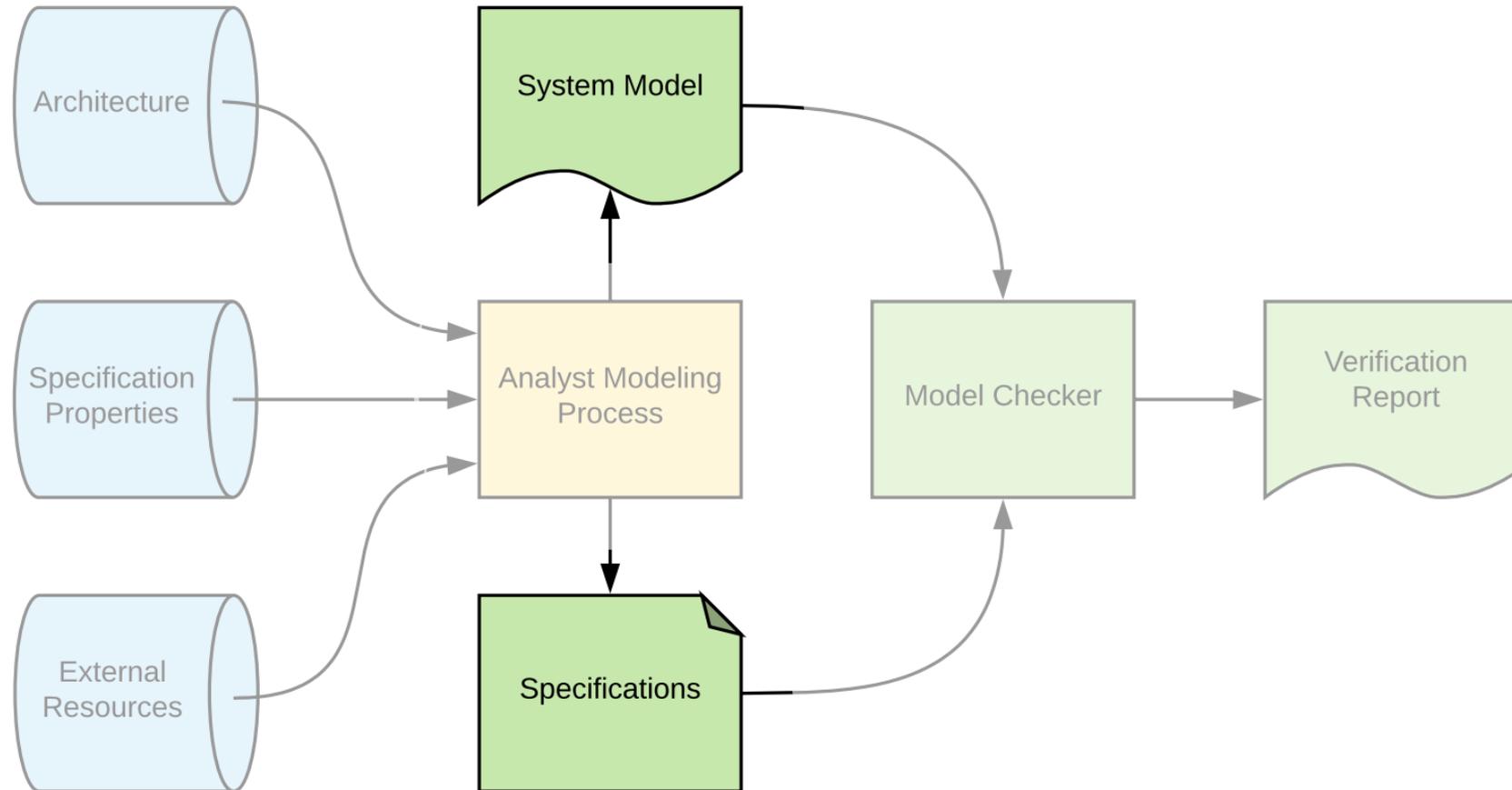
# Generic formulation of the method



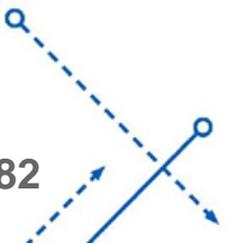
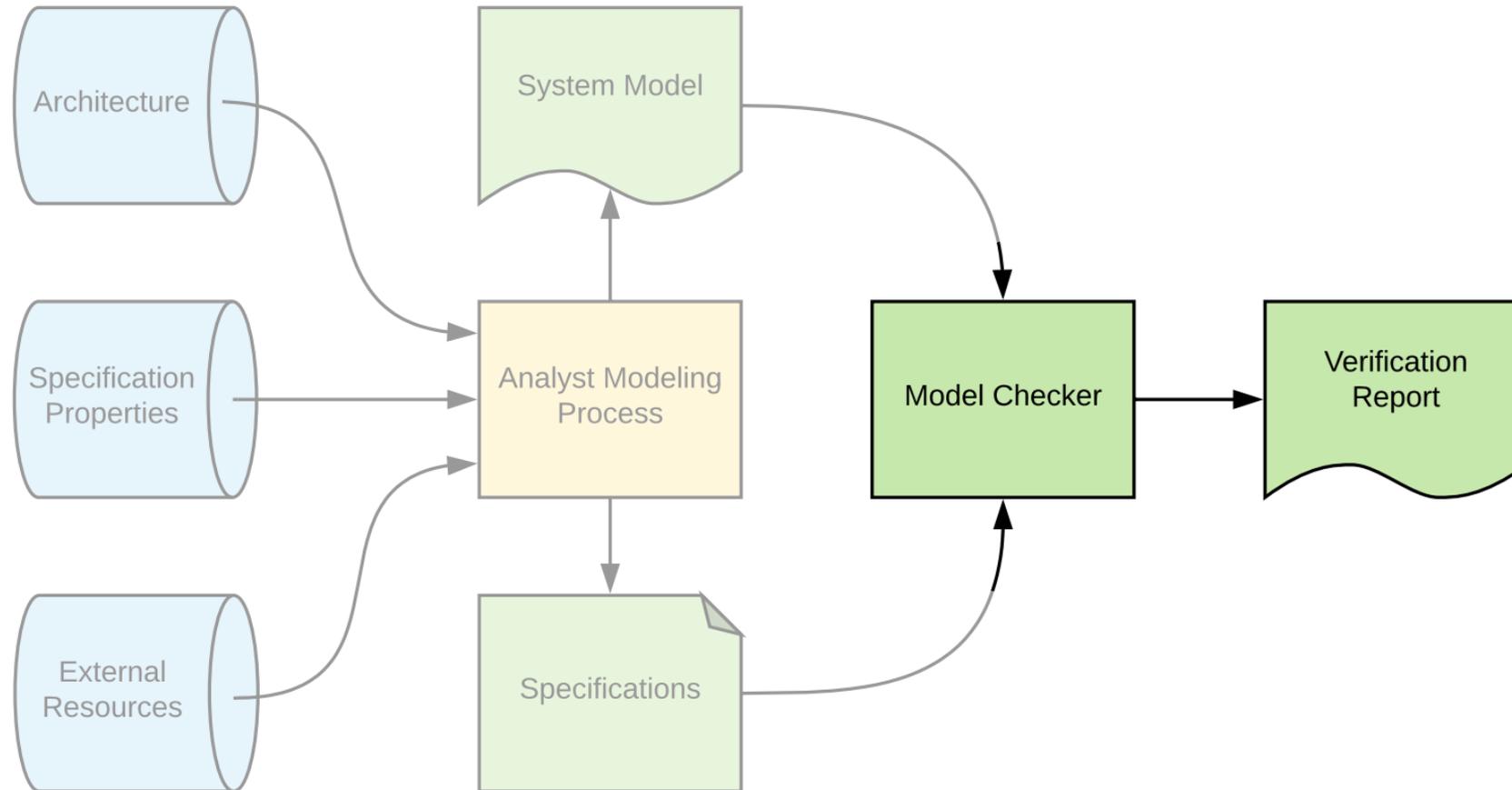
# Generic formulation of the method



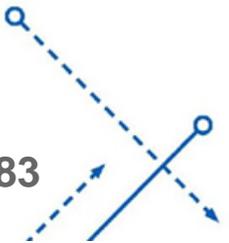
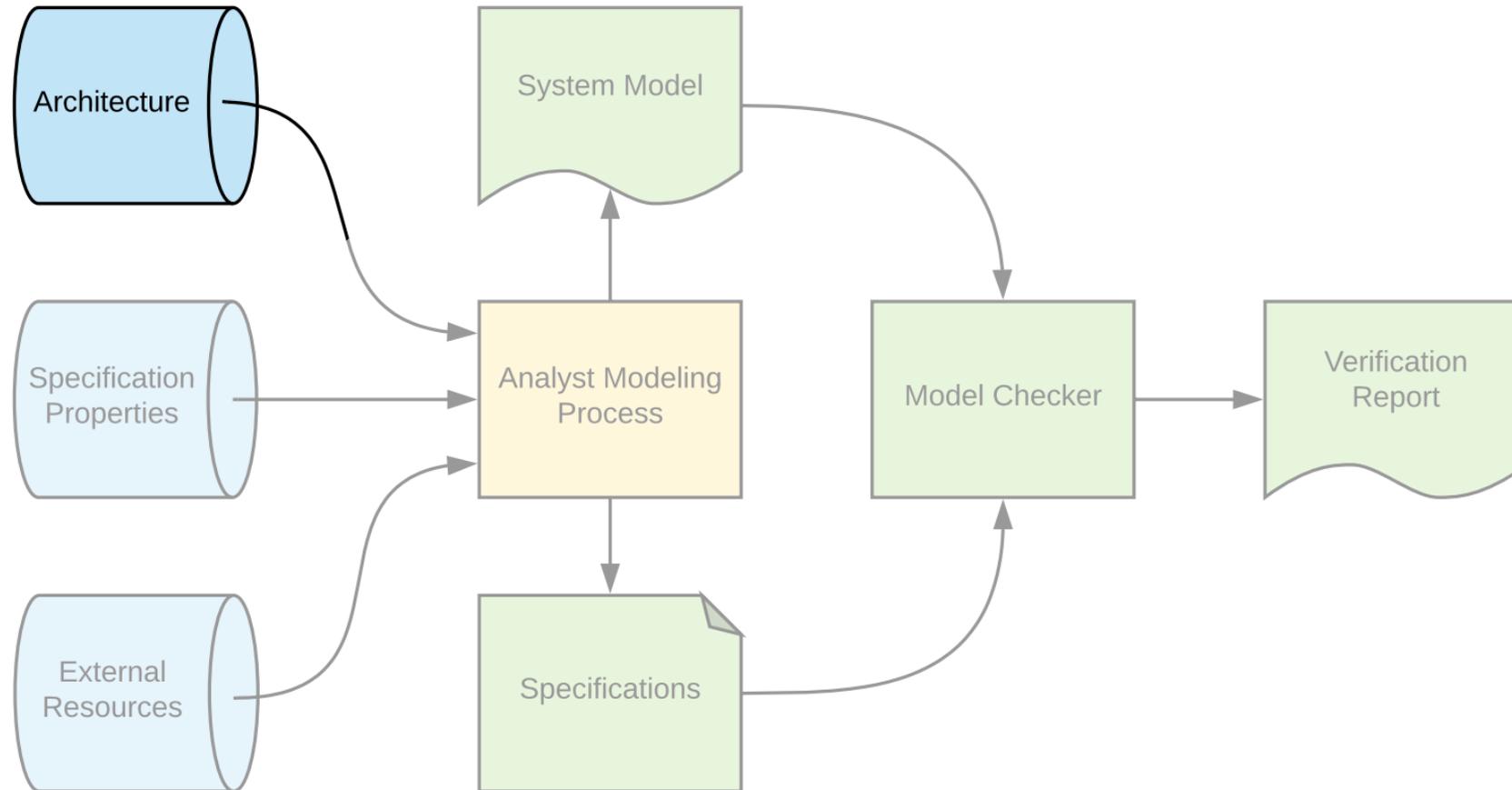
# Generic formulation of the method



# Generic formulation of the method



# Method Architecture



# Formal Model Code

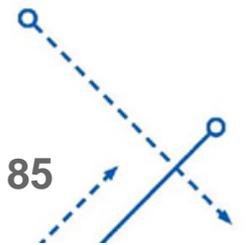


# The Action Generator module

```
actionPerm IN IF action = change_ObjectPermissions OR action = create_Bucket OR action =  
change_BucketPermissions  
    THEN {x : permissionSetting | NOT (x.public AND isPrivate?(x))}  
    ELSE {x : permissionSetting | (NOT x.public) AND isPrivate?(x)}  
    ENDIF;
```

```
isPublic?(perm : permissionSetting) : BOOLEAN = perm.public AND (perm.read OR perm.write OR  
perm.readPermissions OR perm.writePermissions);
```

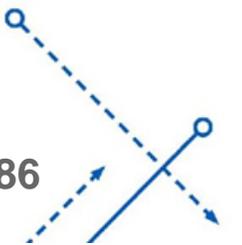
```
isPrivate?(perm : permissionSetting) : BOOLEAN = NOT perm.read AND NOT perm.write AND NOT  
perm.readPermissions AND NOT perm.writePermissions;
```



# The System and User modules: Example 1

```
[ ] action = create_Object AND bucketExists AND NOT objectExists -->
  objectExists'           = TRUE;
  objectEncryption'       = IF actionEnc = none_Option
                           THEN bucketEncryption
                           ELSE actionEnc
                           ENDIF;
  objectACL'              = actionPerm;
```

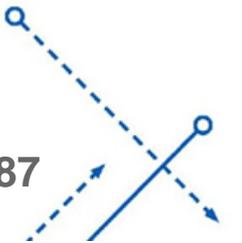
```
[ ] action = create_Object AND thinkBucketExists AND NOT thinkObjectExists -->
  thinkObjectExists'      = TRUE;
  thinkObjectEncryption'  = actionEnc;
  thinkObjectACL'        = actionPerm;
```



## The System and User modules: Example 2

```
softwareRead =      IF objectExists AND objectACL.public AND (objectACL.read OR
                    objectACL.readPermissions OR objectACL.writePermissions)
                    THEN insecure
                    ELSE secure
                    ENDIF;
```

```
userRead =      IF thinkObjectExists AND thinkObjectACL.public AND (thinkObjectACL.read OR
                    thinkObjectACL.readPermissions) AND thinkObjectEncryption = none_Option
                    THEN vulnerable
                    ELSE safe
                    ENDIF;
```



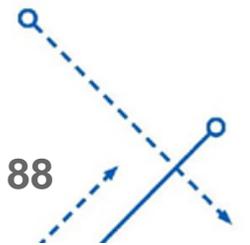
# The Comparator module

falseVulnerabilityReadMM = (userRead = vulnerable AND softwareRead = secure);

falseVulnerabilityWriteMM = (userWrite = vulnerable AND softwareWrite = secure);

falseSafetyReadMM = (userRead = safe AND softwareRead = insecure);

falseSafetyWriteMM = (userWrite = safe AND softwareWrite = insecure);



# Limitations

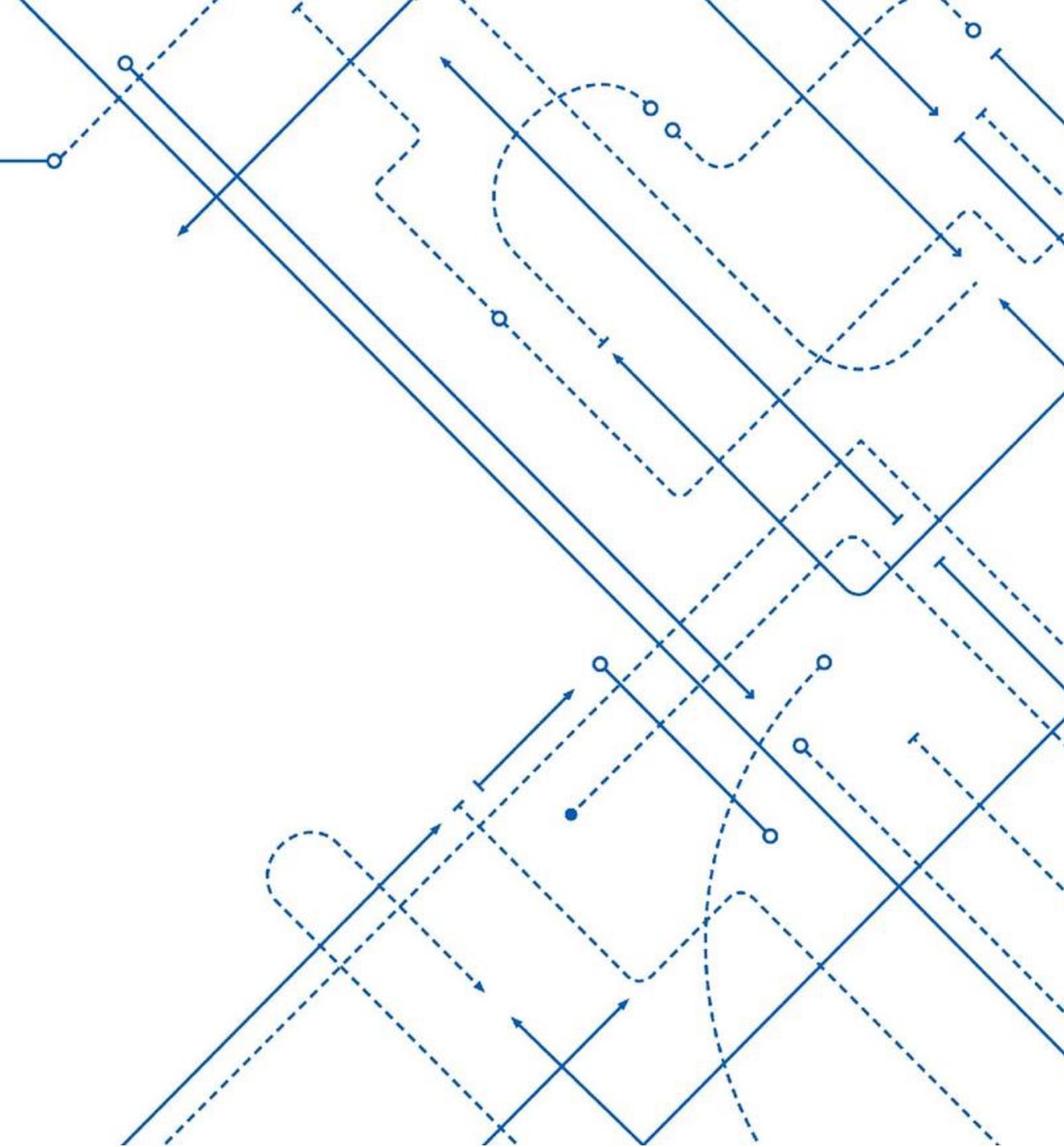
- Specification-based model checking finds one path to failure; could be others
- Investigated method of formulating specifications tailored to find scenarios in results

Table 4.2: Amazon AWS S3 Use Case Findings Validation Results

<b>Authenticated User Mismatch</b>			<b>Encrypted but Readable</b>			<b>Surprising Inheritance</b>		
States	Time (s)	Result	States	Time (s)	Result	States	Time (s)	Result
3,777,972	1.19	✘	3,833,412	0.14	✘	2,200,836	0.38	✘

Note. A ✓ indicates a proof was returned, while a ✘ indicates a counterexample was returned.

# Phishing Model Validation

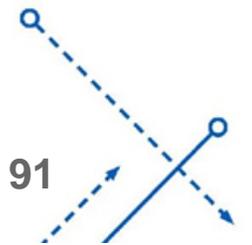


# Validation using real-world data

Table 5.5: Cofense Phishing Simulation Responses by Attack Strategy

Template	Click-only	Data entry	Attachment-based
File from scanner	31.1		
Package delivery—alternate	25.8		
Unauthorized access		24.8	
Digital fax	20.2		
Package delivery	19.7		
Scanned file			18.4
RSA phish	13.1		
Password survey		12.9	
Secure email			12.2
Adobe security update	7.0		
Restaurant gift receipt			6.7
Google docs link	6.0		
Funny pictures			3.4
Relative ratios	.610	.187	.202

*Note.* The values reported here indicate the percentage of users that clicked on the email out of all users who received it. For example, 31.1% of all users receiving the “file from scanner” phishing email clicked on it.



# Validation using real-world data

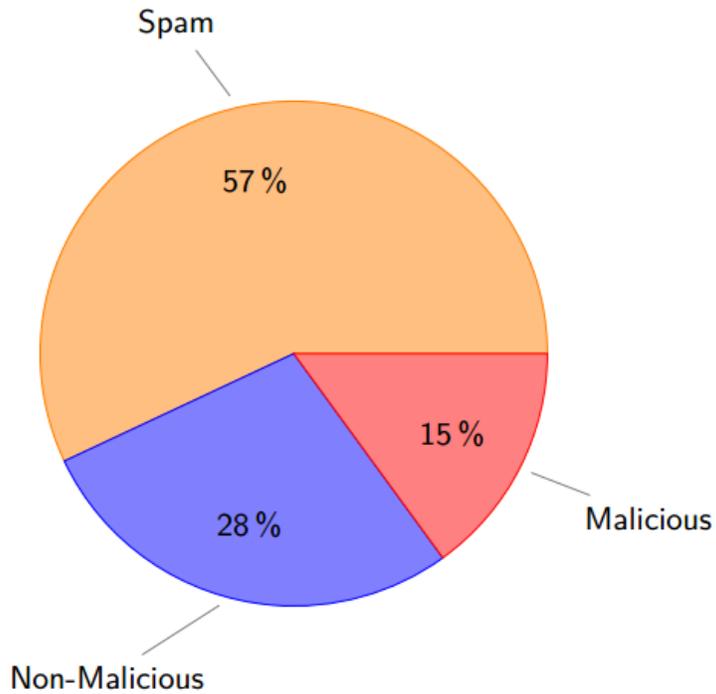


Figure 5.5: All emails, reported malicious versus non-malicious.

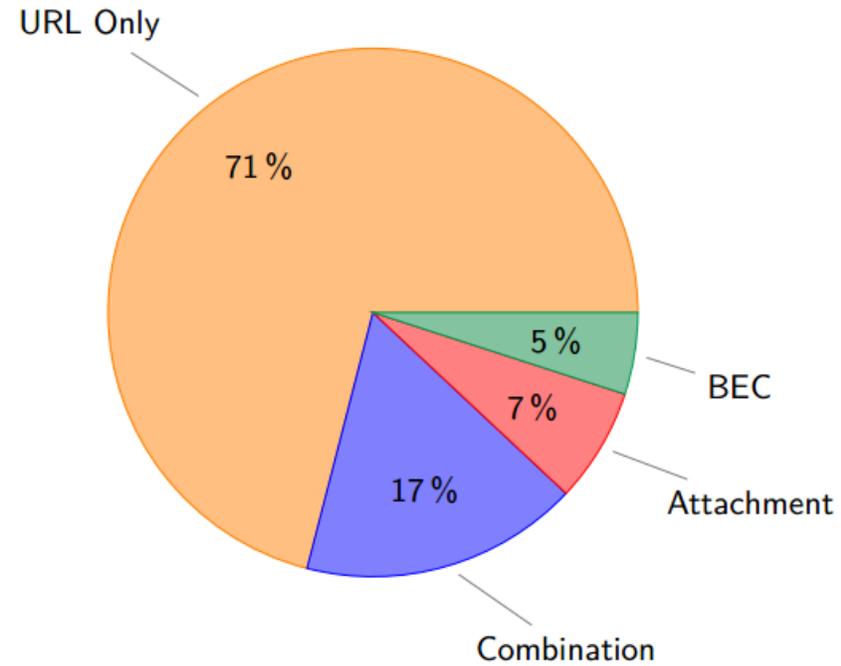


Figure 5.6: Confirmed malicious emails by attack type.

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