

# Insider Threat Mitigation

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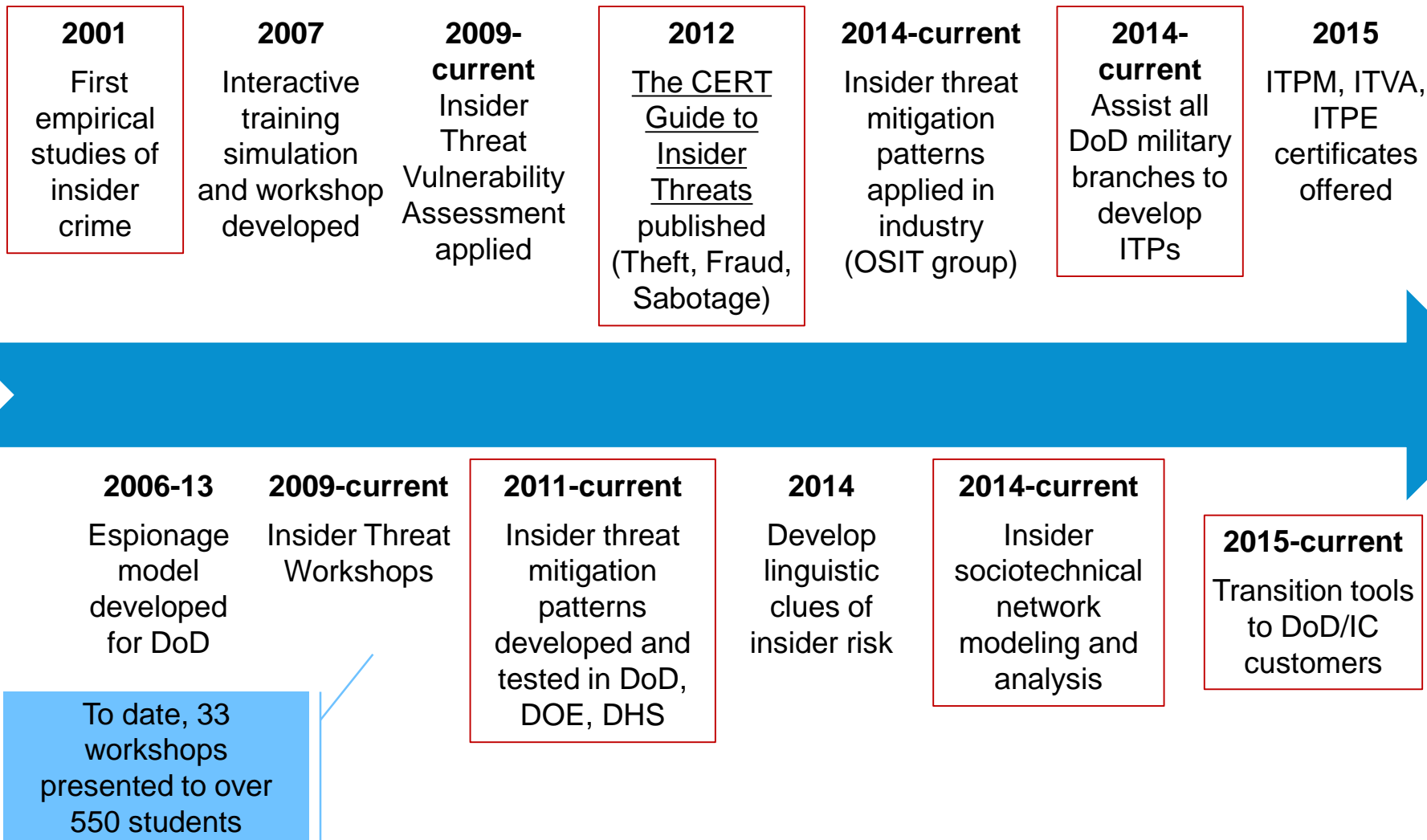
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# CERT Insider Threat Mitigation to Date



*ITPM = Insider Threat Program Manager; ITVA = Insider Threat Vulnerability Assessor; ITPE = Insider Threat Program Evaluator  
OSIT = Open Source Insider Threat Information Sharing Working Group*



# What is the Insider Threat?



# The Insider Threat

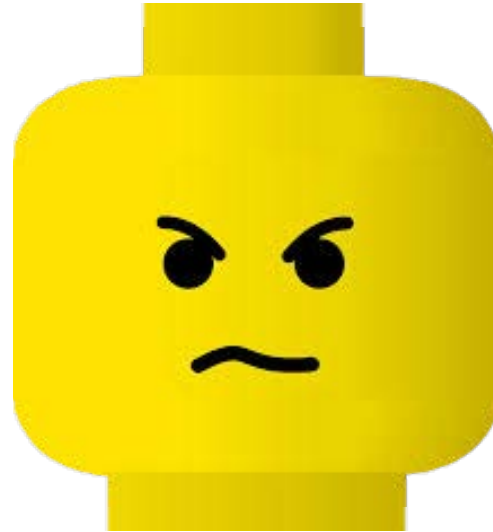


**“When you're in positions of privileged access like a systems administrator ... you're exposed to a lot more information on a broader scale than the average employee”**

**Edward Snowden**



# The Insider Threat

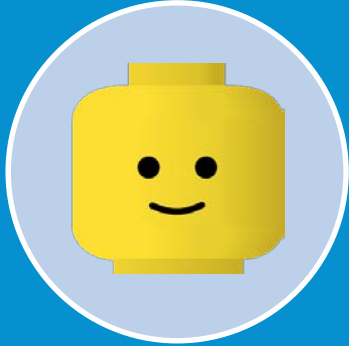


**“We’re trying to locate the fugitive, but his face is so generic it matches every other face in our database.”**

*- The LEGO® Movie*



# Where to Look



## Person

Psychological factors,  
previous experience,  
etc.



## Environment

Stress (professional,  
financial, medical,  
personal, etc.),  
social pressures, etc.

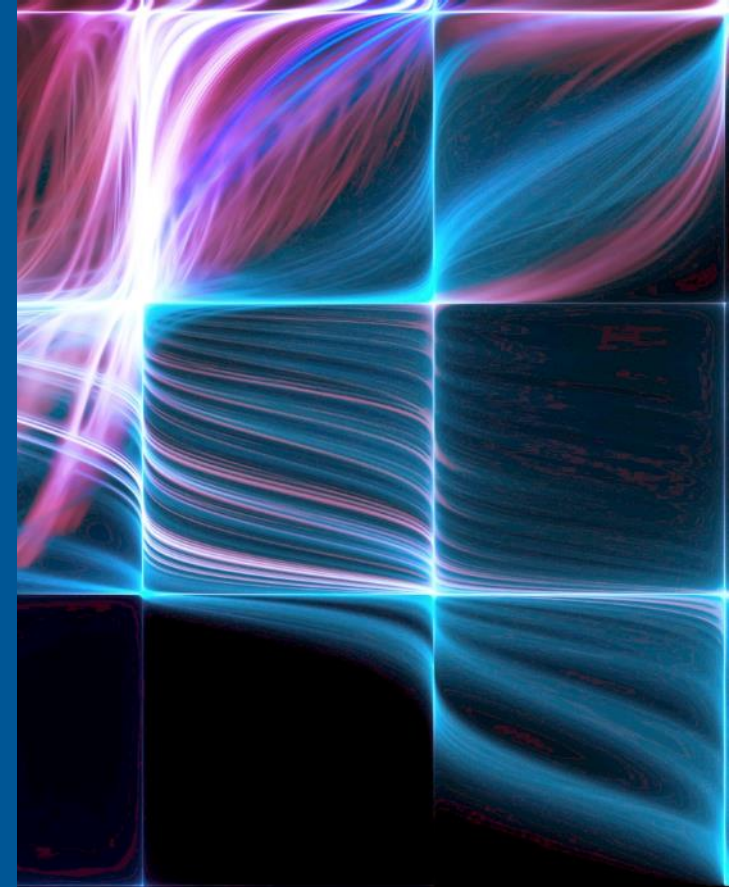


## Actions

Use of information  
technology,  
engaging with others



Insider Threat Mitigation  
**Social Network Dynamics**





# Social Network Dynamics of Convicted Spies

## Overview

- **Hypothesis:** Over time, insider social networks exhibit weakening of internal connections, AND the strengthening of external connections to adversaries
- **Data:** ~140 insider espionage incidents: court docs, media, ...
- **Data Analysis method:** Measure connection strength over time between insider and family/coworkers/adversaries - Organizational Risk Analyzer (ORA)
- **Connection strength measures:** communication frequency, affect positivity



# Social Network Dynamics of Convicted Spies

**Progress:** Hypothesis supported but is more complex than framed

- Analyzed dynamic, multidimensional networks of 9 espionage incidents (ORA)
  - Connections with family weaken; Connections with coworkers weaken or strengthen
  - Networks need to distinguish job activity from a spy gathering intel
  - Connections with adversary strengthen, including connections with any colluders
- Distinguished Enron “insiders” using machine learning (WEKA tool)
  - ROC curve identified 50% of insiders with a 18% false positive rate
- Developed simulation model of *physics* of job engagement and espionage
  - Shows how the flow of disengagement within organization translates to espionage



# Sociotechnical Network Analysis

**Sociotechnical network (STN) = social network + info flow network**

## Key Ideas

- Combine analysis of information flow networks with social network analysis
  - earlier detection with lower false positive rates
- Focus not on insider access rights
  - but movement and trajectory of info flow

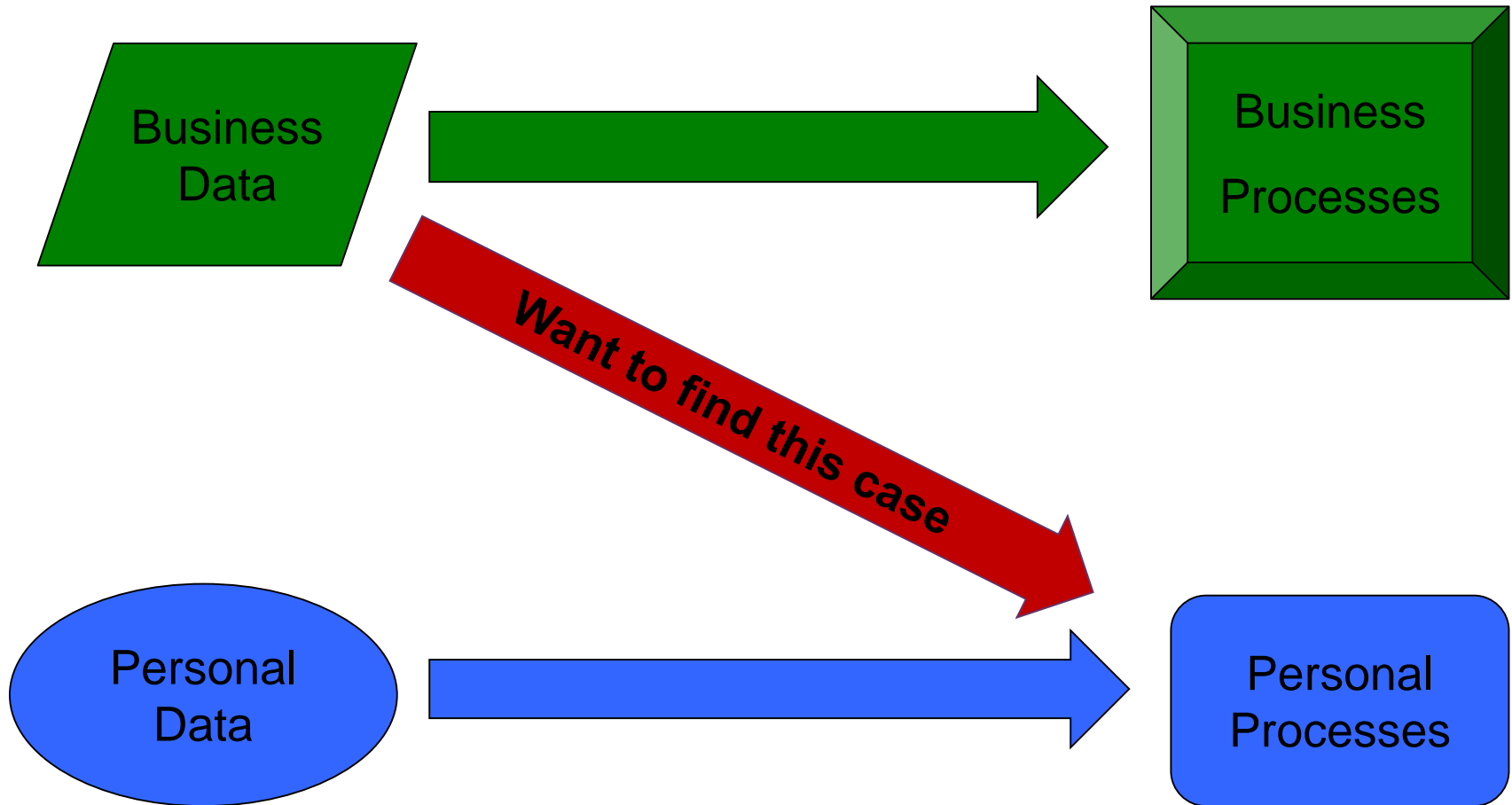
## Compare baseline document flows with actuals (Gemini tool)\*

- Identify document (expected) workflows as baseline (up front)
- Compare actual document flows with expected; identify anomalies (real time)
- Requires comparing *documents to documents* and *flows to flows*
- *Proposed Measures*
  - *Document Similarity* : hashing, plagiarism detection, keyword matching
  - *Flow Similarity* : graph matching algorithms – eg, using GED measures

\* Ard, et.al., “Information Behaving Badly,” NSPW ‘13



# Information Flow Analysis



# New Paradigms for IF Net Analysis

- Moves the focal point of behavioral analysis from the **user** to the **information** we want to protect.
  - Anomalous information flows point back to a user.
  - Combine these flags with SNA flags for higher-value alerts.
- Document content similarity analysis
  - Progress in the Enron dataset:
    - Analyzed cases where the same filename can indicate dissimilar content (e.g., Resume.doc, Agenda.doc), and that the same content can be found under different filenames (renamed files)
    - File extension is incorrect for 24% of the files in the Enron dataset, which inhibits our ability to extract and compare raw text

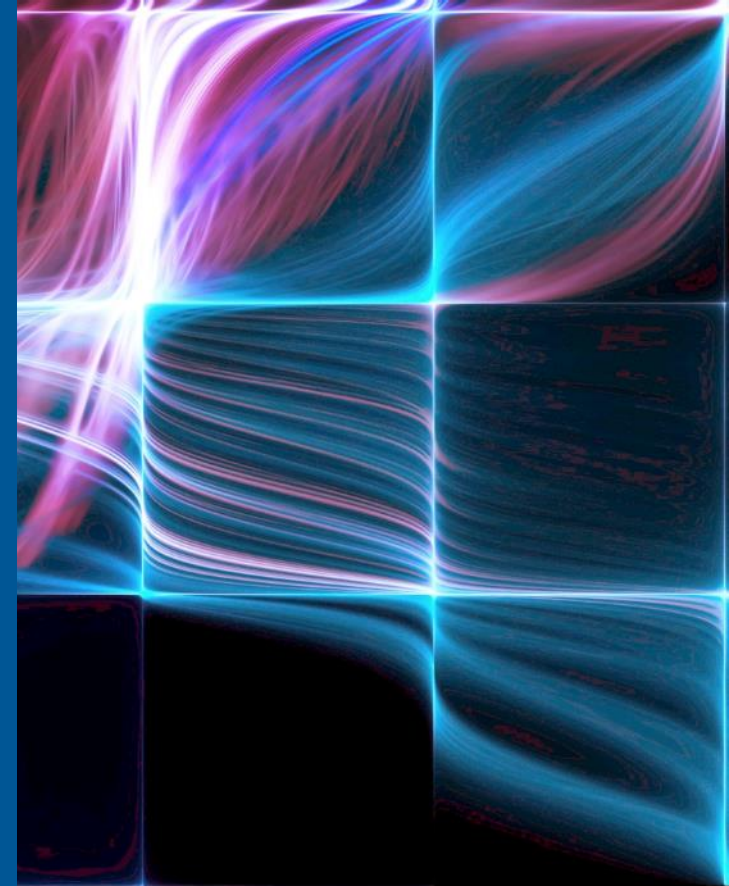


# Similarity Metric Conclusions

- Bit-based forensic hashes
  - Successful in detecting file extension changes
  - Easily defeated by minor text changes
    - e.g .docx, due to xml encoding
- Text-based similarity measures
  - Similar to plagiarism detection
  - Successful at detecting minor text changes
  - Easily defeated when file extension is incorrect, for some tools

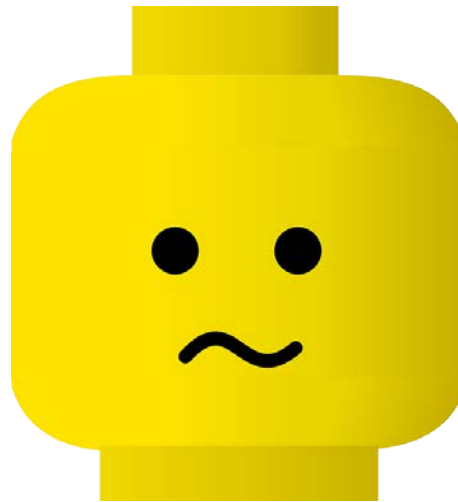


Insider Threat Mitigation  
**Detecting Stress**



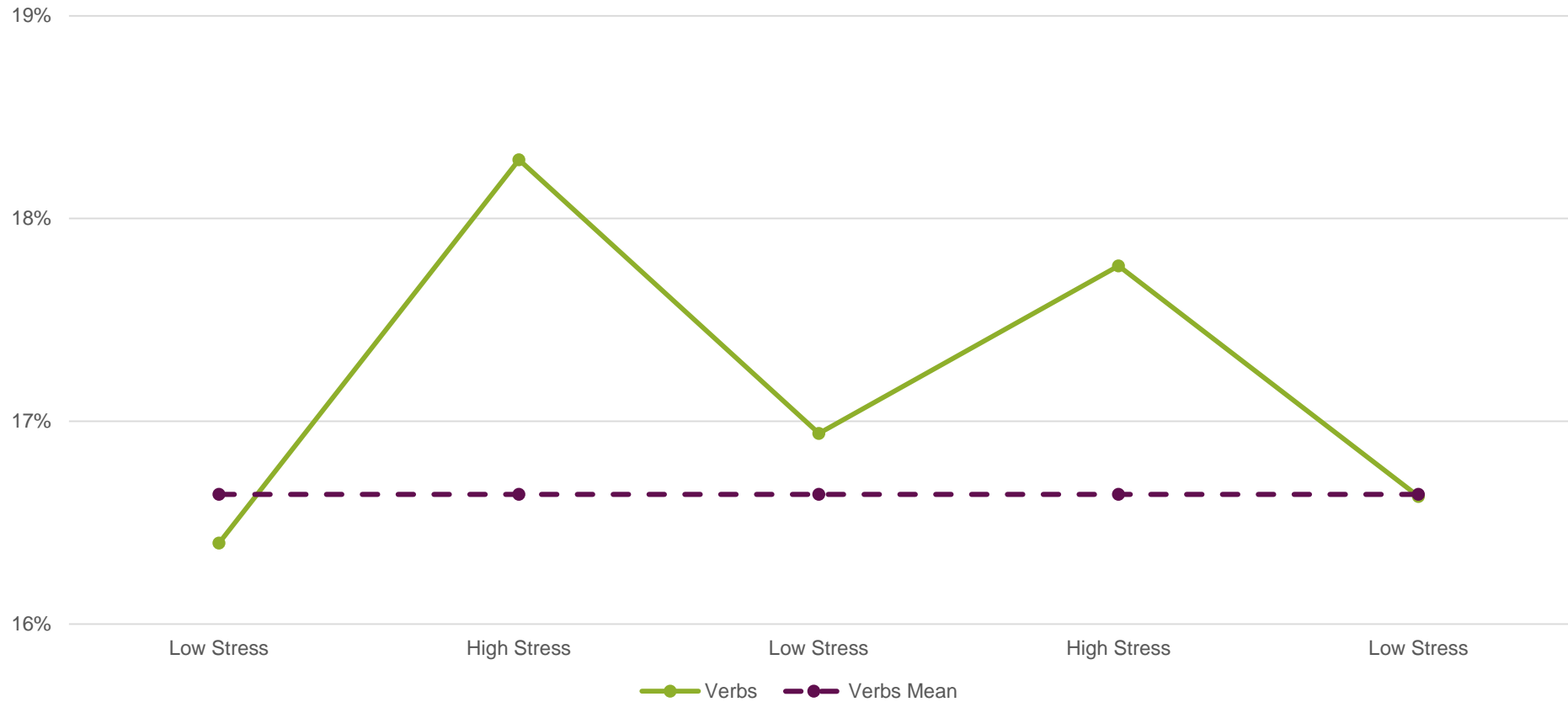
# Stress Detection

- Key ideas
  - Personality is reflected in language
  - Emotion and sentiment is also reflected in language
- Open question
  - Are temporary states such as stress also reflected in language?

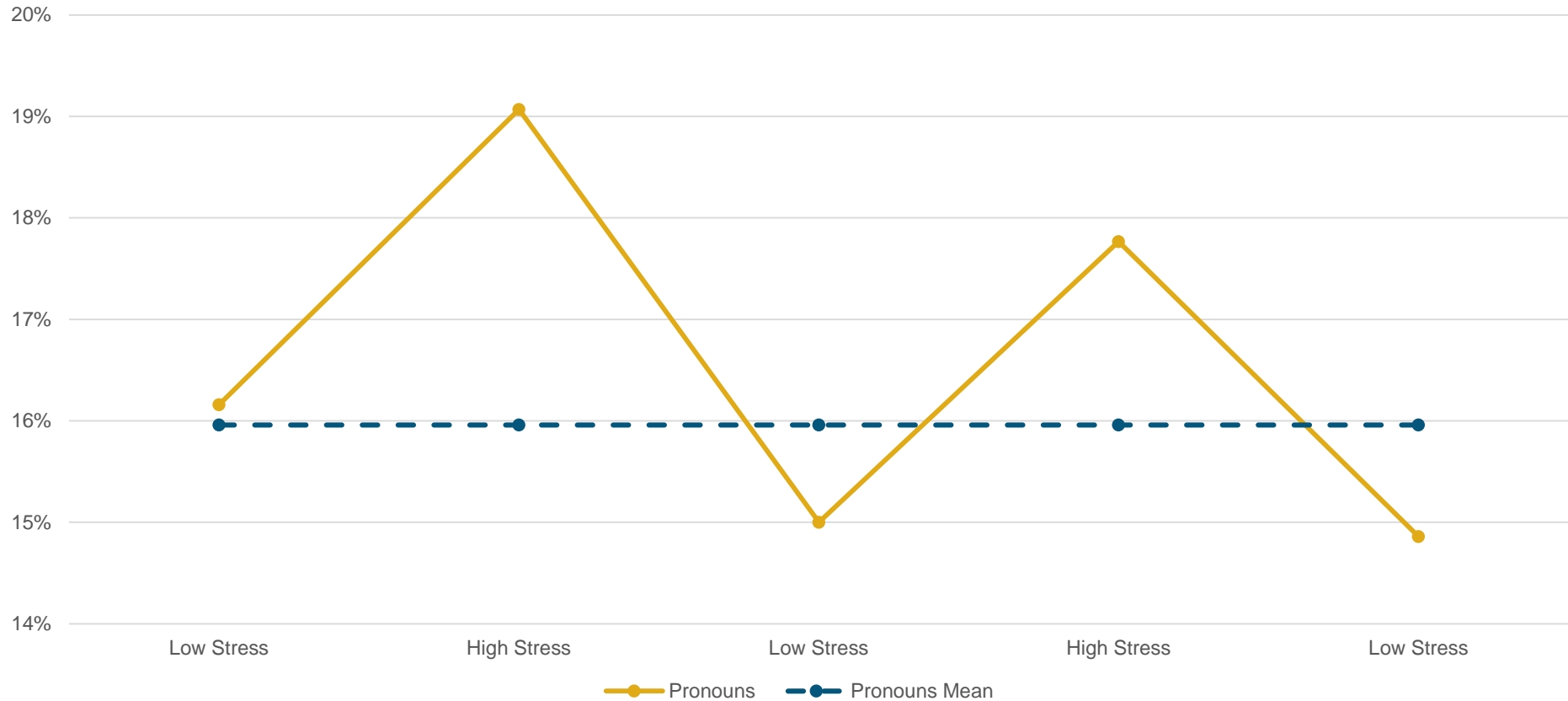




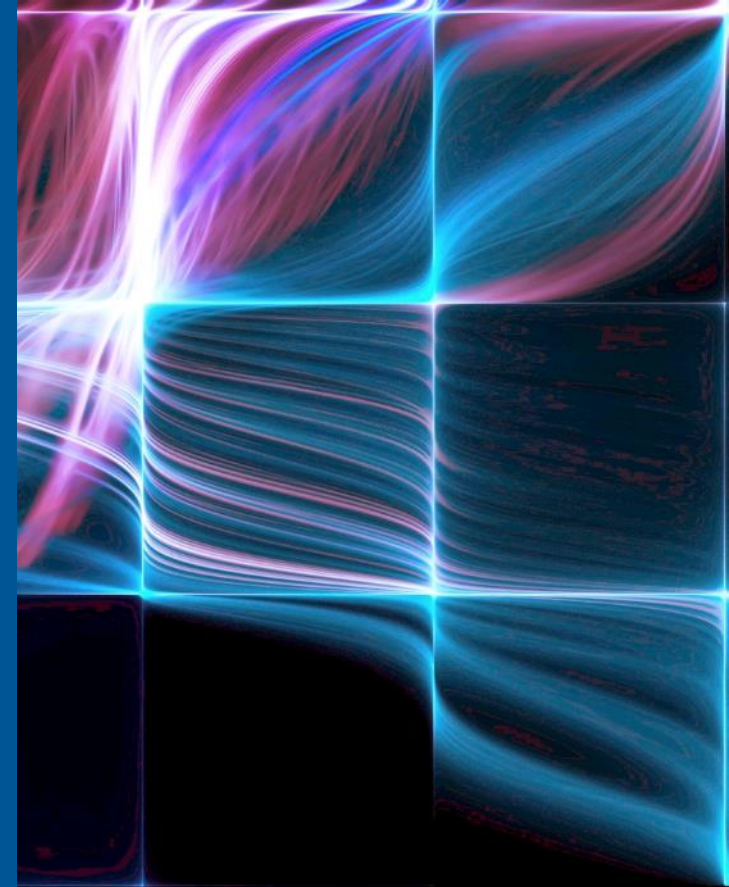
# Linguistic Metrics During Periods of Stress - Verb Use

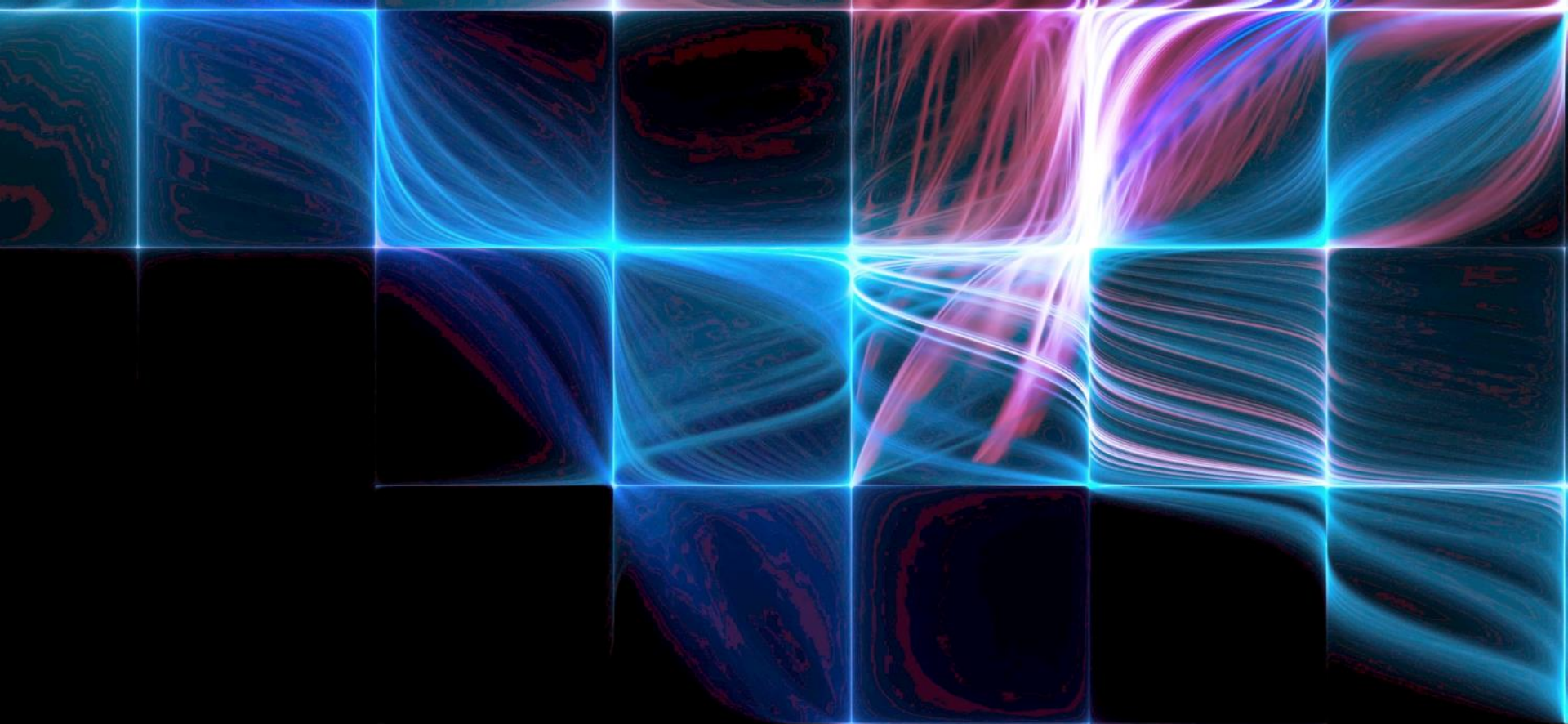


# Linguistic Metrics During Periods of Stress - Pronoun Use



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**But...**





# the threat just changed



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# Poster/demo Plug

**Come to our poster session and demo to see:**

- Dynamic meta-network analysis of espionage incidents
- Machine learning of Enron “insiders” showing false/true positive detection rates
- Simulation model of an emerging *physics* of job engagement and espionage



# Contact Information

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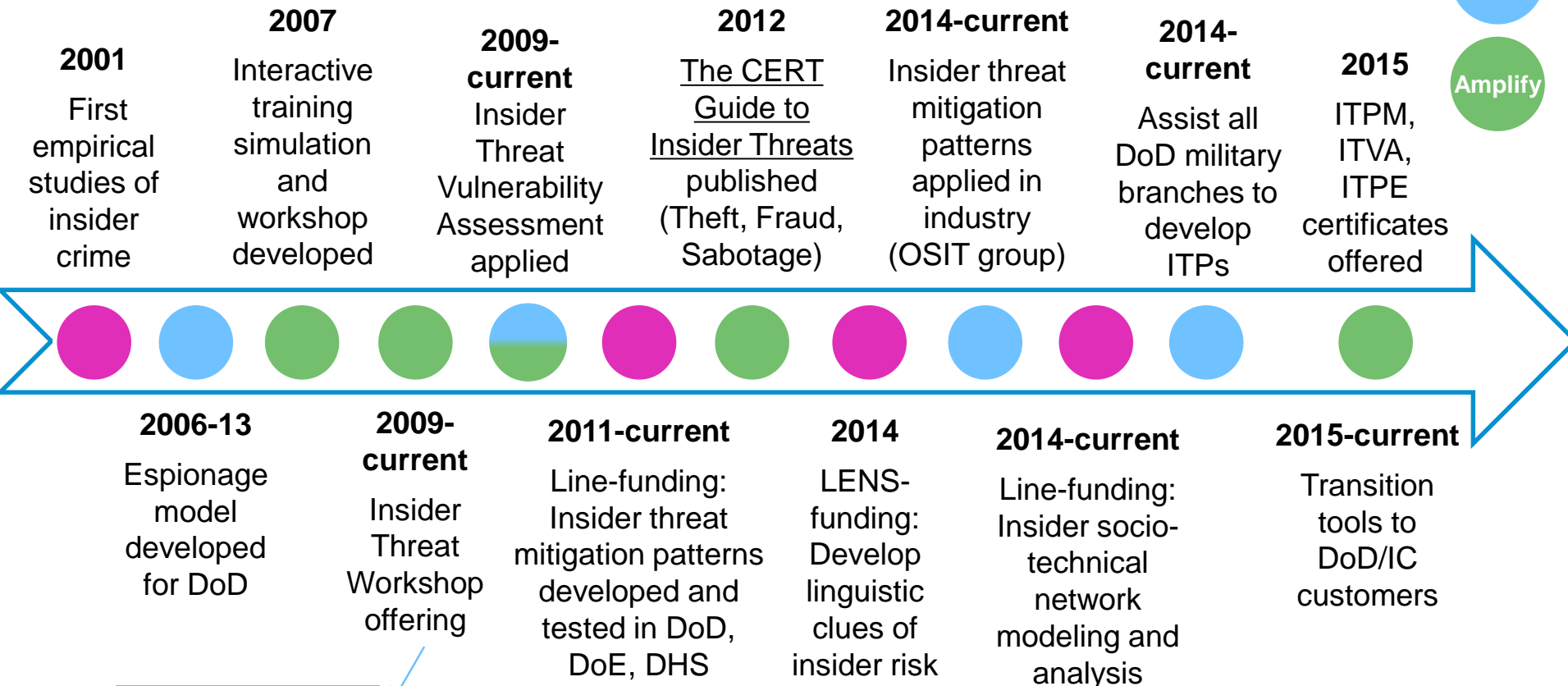
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# CERT Insider Threat Mitigation to Date



To date, 33 workshops presented to over 550 students

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