

# Bringing Science to the Evaluation of Malware Forensics Analysis Tools

Dr Ian Kennedy BEng(Hons) PGCE CITP CEng FBCS

# My Background

- Software developer / Commissioning
  - Public sector: In-house within NHS trusts
  - Commercial: Servicing healthcare sector
  - Commercial: Finance sector (US)
- Digital Forensic practitioner
  - Law enforcement (Kent Police)
  - Consultancy (Control Risks)
  - UK Government
- Academic
  - The Open University
  - Canterbury Christ Church University
  - Member of peer review Board for *Digital Investigation*
- BCS Roles
  - Fellow of BCS (as of March 2019 - Yay!)
  - Contributor/Author
  - BCS Assessor (CEng/CITP)

# Overview

- Background
- Prior work
- Framing the problem – the RQ
- A solution : the MATEF
- Interpreting the data
- Results
- Conclusions
- Contributions and further work

# Background to the problem

Who in this room doesn't  
use the Internet?





Not so long ago in a Police building not so far,  
far away...

# One day at work....





# The case of Nicholas GRANT: Royal Collage of Physicians<sup>1</sup>

- >700 IIOC
- 24 counts of IIOC
- Malware found
- Trojan defence
- Light-touch analysis
- Conclusion: IIOC not attributed to malware
- Court were convinced. As a scientist, was I?



# Other examples



Source: cbc.ca



Source: youtube.com

Michael FIOLA

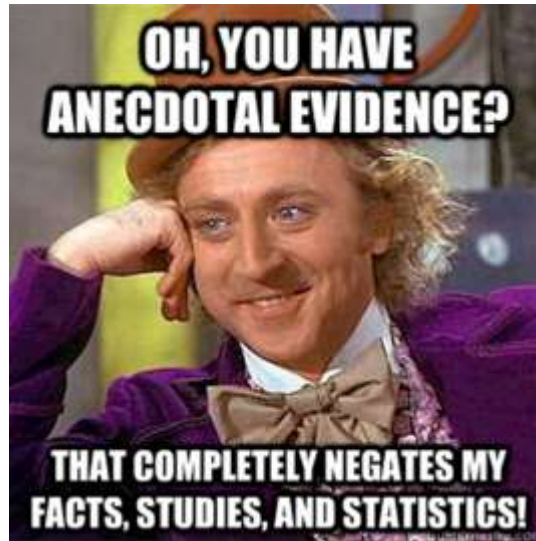
Julie AMERO

# Wider issues with Expert Evidence

- Trojan Defence
- Unfounded trust repeated confirmation
- Expert evidence problems
- *Lack of scientific underpinning*
- *Reproducibility flaws*
- *Acceptance of fact*
- Statutory requirements

# Research justification

- **Unfounded trust repeated confirmation**



Source: quickmeme.com

"haven't seen a single case"<sup>1</sup>

"Yet to see an example"<sup>2</sup>

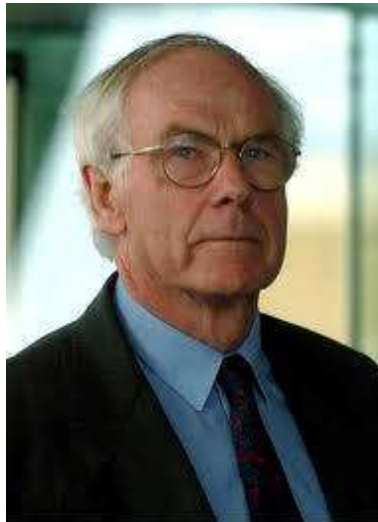


Source: docdata.co.uk

"solely on reputation of the vendor"<sup>3</sup>

# Research justification

- **Expert evidence problems**
  - Judges have no test to “gauge unreliability”<sup>1</sup>



Source: whale.to

**Prof. Sir Roy Meadows**



Source: wikimedia.org

**Casey Anthony case**

# Research justification

- **Lack of provenance**
  - Individualisation:
    - Not “rigorously shown” to be reliable <sup>1</sup>
  - Malware forensics:
    - Hostile nature of malware
    - Analysis skills
    - Repeatability

# Research justification

- **Reproducibility flaws**

- Dual-tool verification

- Unsupported claims:

- Can “confirm result integrity”<sup>1</sup>
      - Allows “verification of findings”<sup>2</sup>

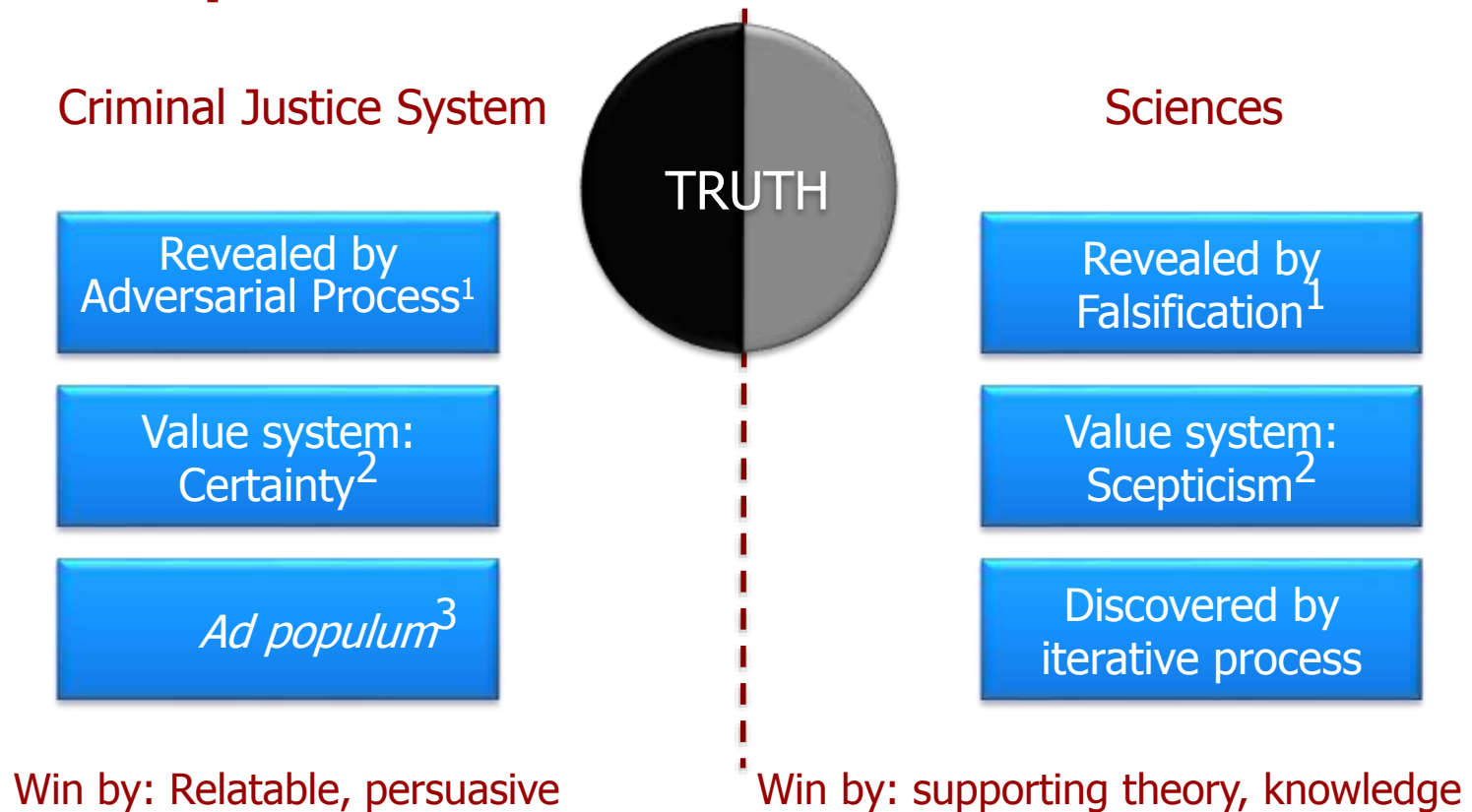
- Misuse of term ‘verification’

- Dual-tool can *corroborate*, not *confirm*
      - Should use **reference** point<sup>3</sup>
      - Should be **statistically** significant

- Good for finding discrepancies<sup>4</sup> – Falsification!

# Research justification

- **Acceptance of fact**



[1] Kritzer (2009)

[2] Marsico (2004)

[3] Beckett (2010)



# Research justification

- **Statutory Requirements**

- Forensic Science Regulator

- ISO 17025
      - Codes of Practice
      - October 2017 deadline
    - Requirements include:
      - Validation
      - Peer review
      - Generally accepted

**What has been done to address this?**

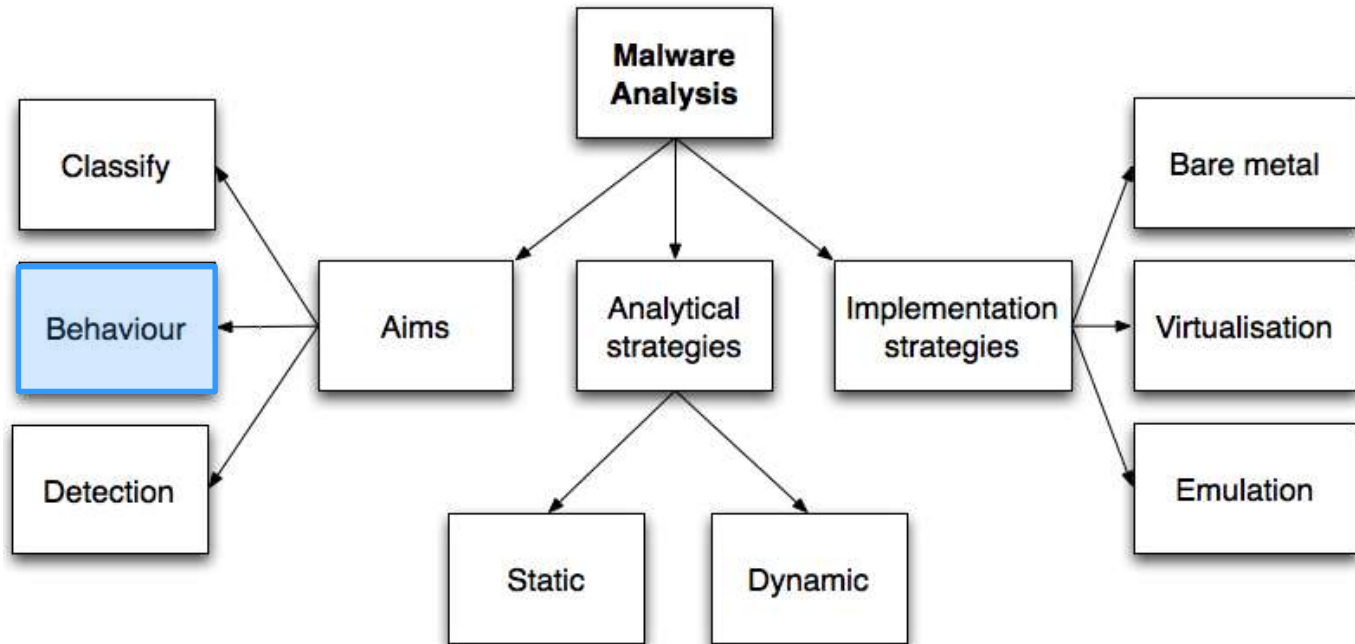
# Prior Work

- Digital Forensic (DF) practice
- Malware Forensics (MF) practice
- Tool evaluation

# Prior Work : DF practice

- Heavily cited:
  - DFRWS (2001) : Six stage process model
  - Carrier & Spafford (2003) : 17 phase model (phy+dig)
  - Carrier (2003) : Abstraction layer model
- NIST DF procedure (2006) : Six stage model
- Adopted process “does not exist”<sup>1</sup>
- No standard methodology,  
including searching for malware<sup>2</sup>

# Prior Work : MF practice



- Analysis approaches:
  - MF framework<sup>1</sup> – extends Cuckoo sandbox<sup>2</sup>
  - Five phase approach<sup>3</sup> – (Pres./RAM/FA/Static/Dynamic)

# Prior work : Tool evaluation

- Evaluation Criteria
  - CFTT, SWGDE, DC3
  - FSR (Validation, Peer review, Generally accepted)
- Little traction of methodologies
  - Slay *et. al.* (2005-10)<sup>1</sup> : Functional – theoretical only
- No consensus on methodology for testing

# Framing the problem: The Research Question

# Research Question

Can a systematic basis for trusted practice be established for evaluating malware artefact detection tools used within a forensic investigation?

In other words:

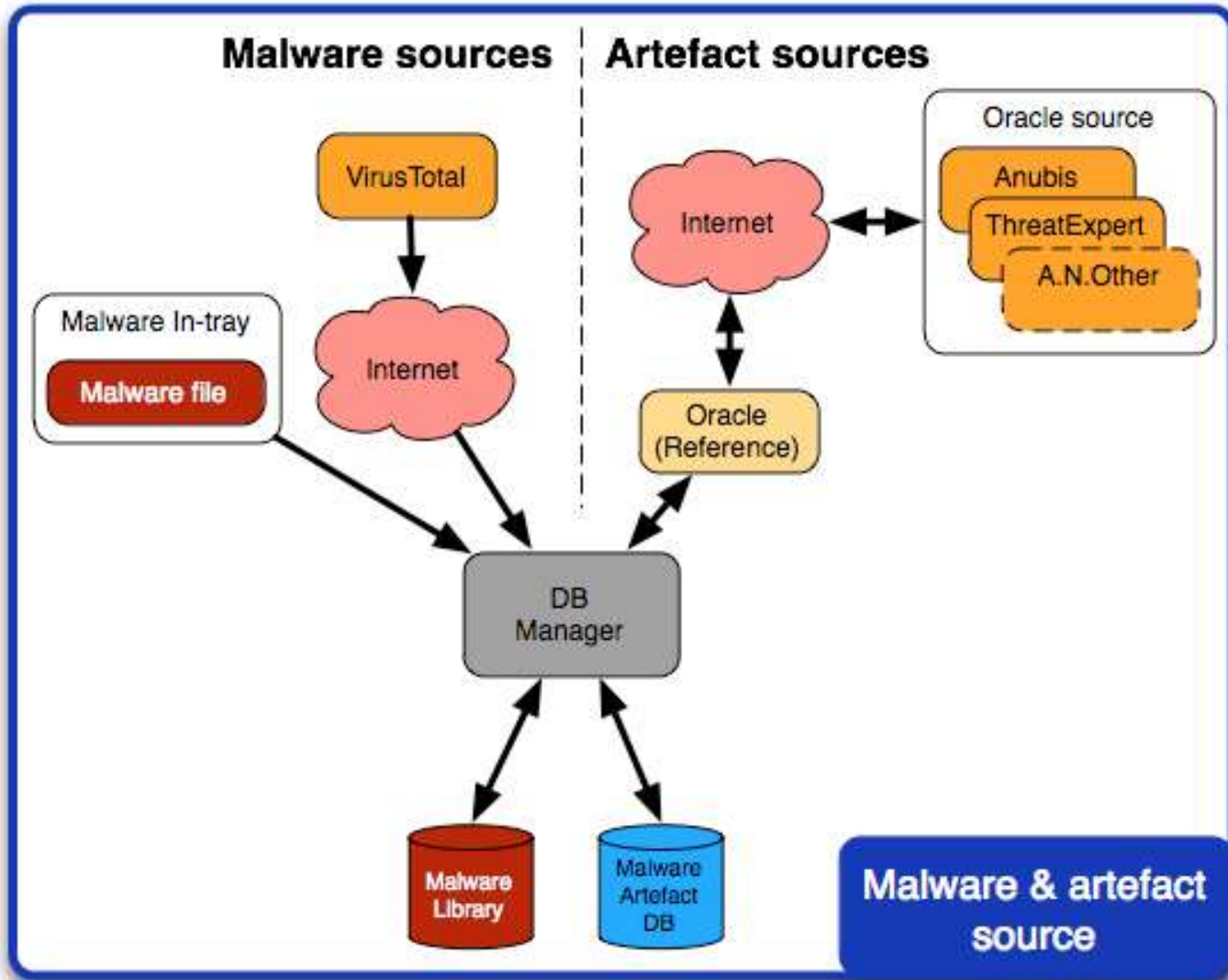
Can tools used for malware forensics be scientifically evaluated?



# Designing a solution

## The Malware Analysis Tool Evaluation Framework

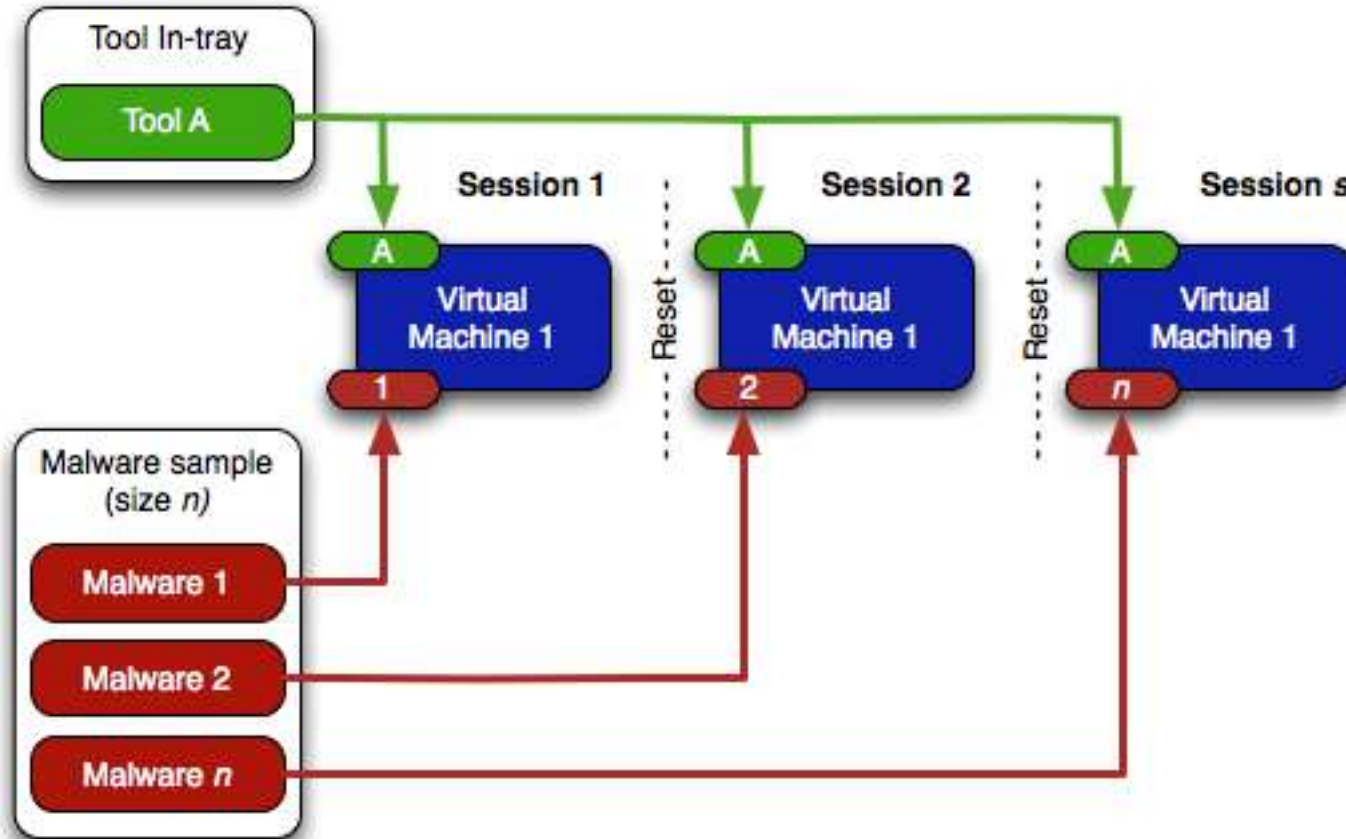
# Getting malware and artefacts



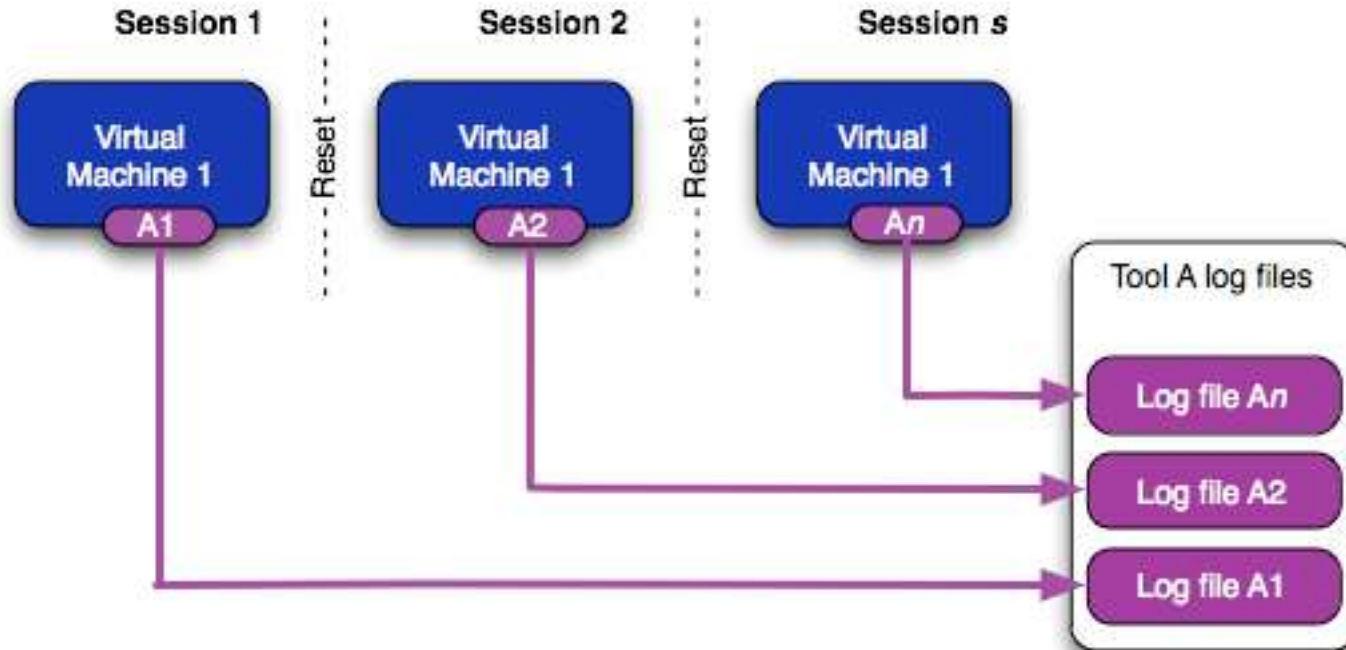
# Virtual Machine (VM)



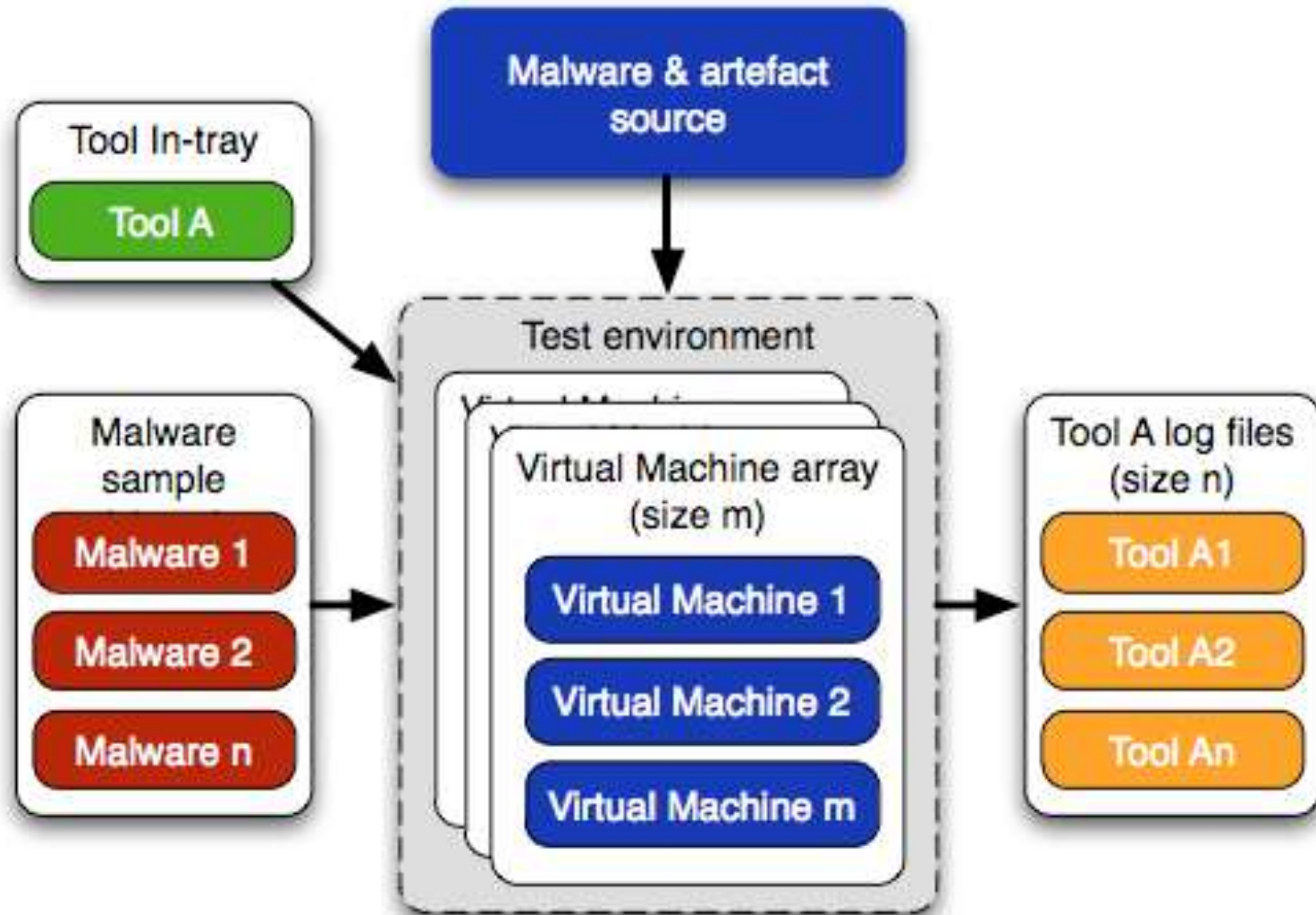
# Add the tool, then the malware



# Before reset, get tool log files

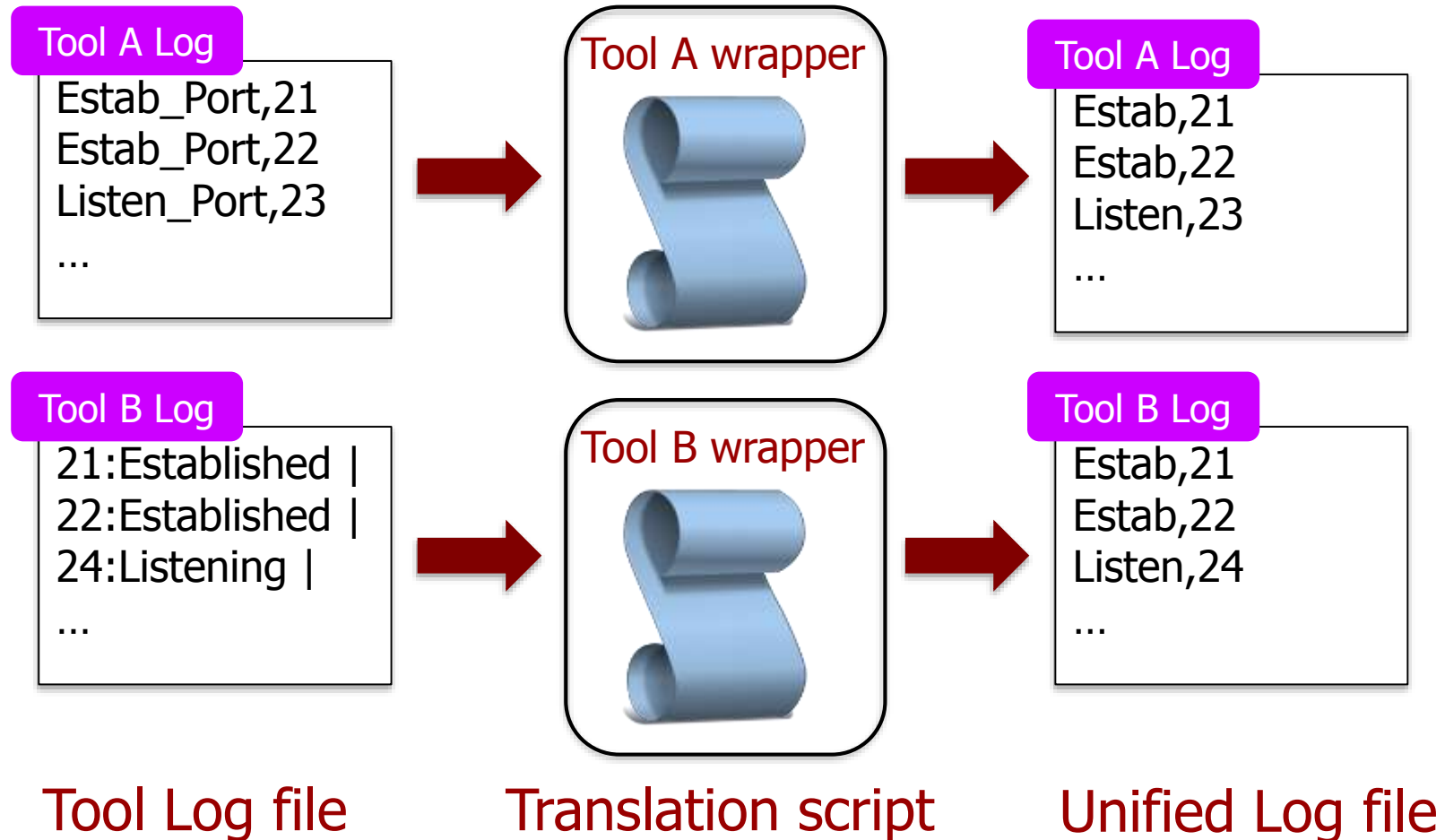


# Malware Analysis Tool Evaluation Framework



# Analysis methodology

# Normalising log files





# Interpreting the data

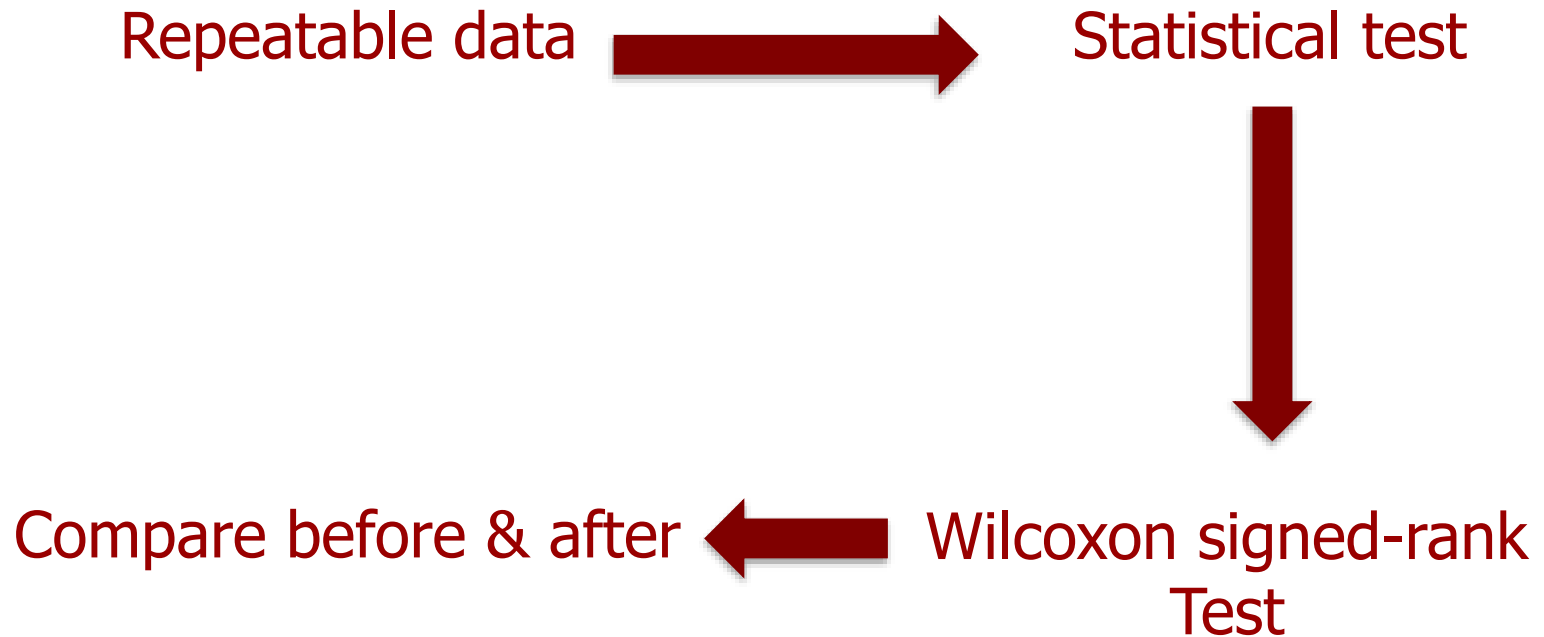
Quantities, not values

Estimated ground truth

Absolute differences

Freq. dist. of differences

# Analysis strategy



# Results

# Study hypotheses

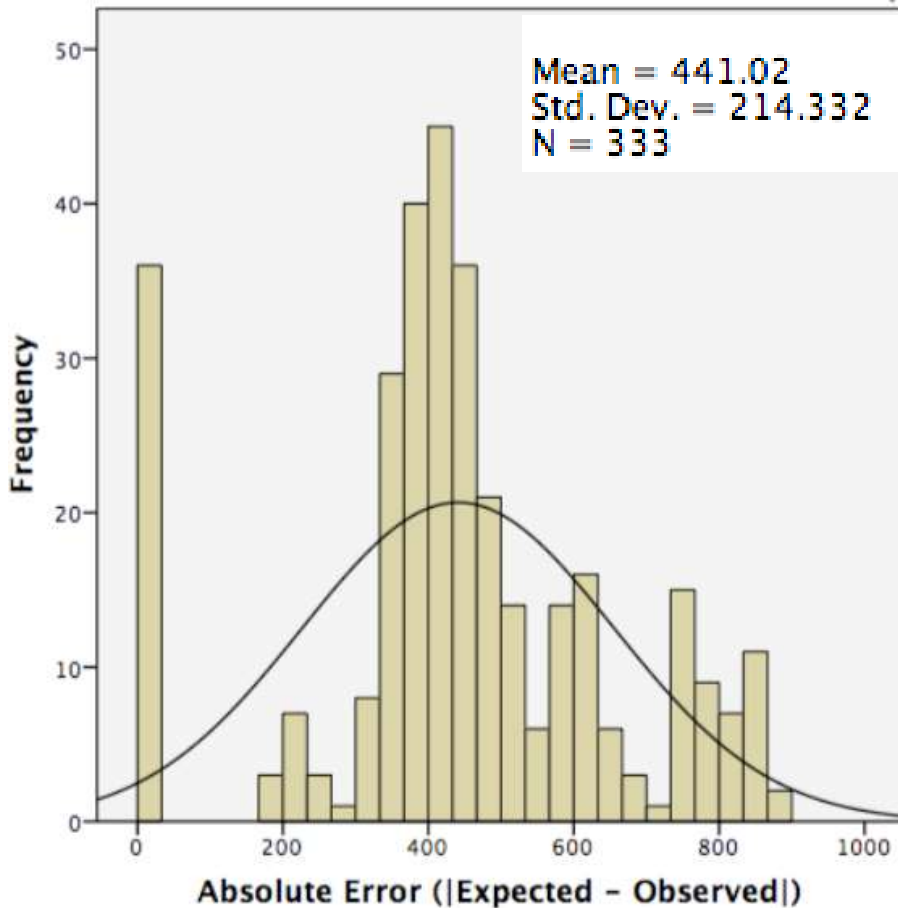
## Hypothesis 1

Changing the execution time has no effect on the number of open ports reported by a tool

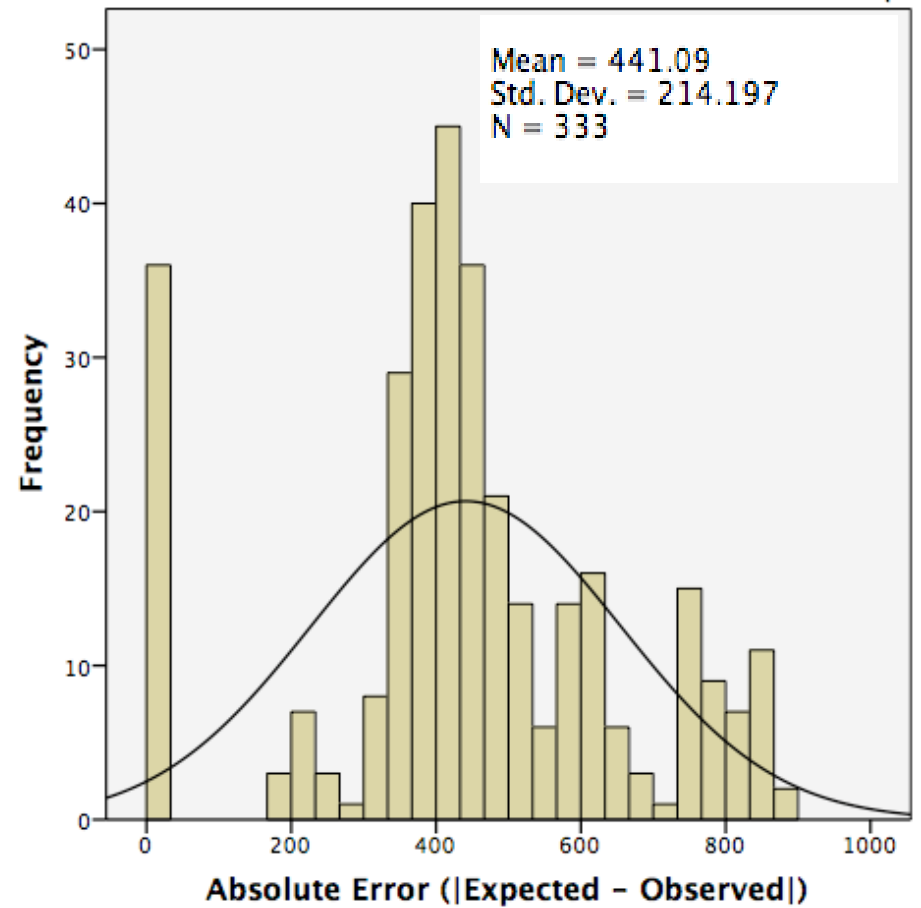
## Hypothesis 2

Both tools report the same number of opened ports at a given execution time

# Results : Execution times



Process Monitor  
(Run for 1 min)



Process Monitor  
(Run for 10 sec)

# Results : Execution time

## Hypothesis 1

Changing the execution time has no effect on the number of open ports reported by a tool

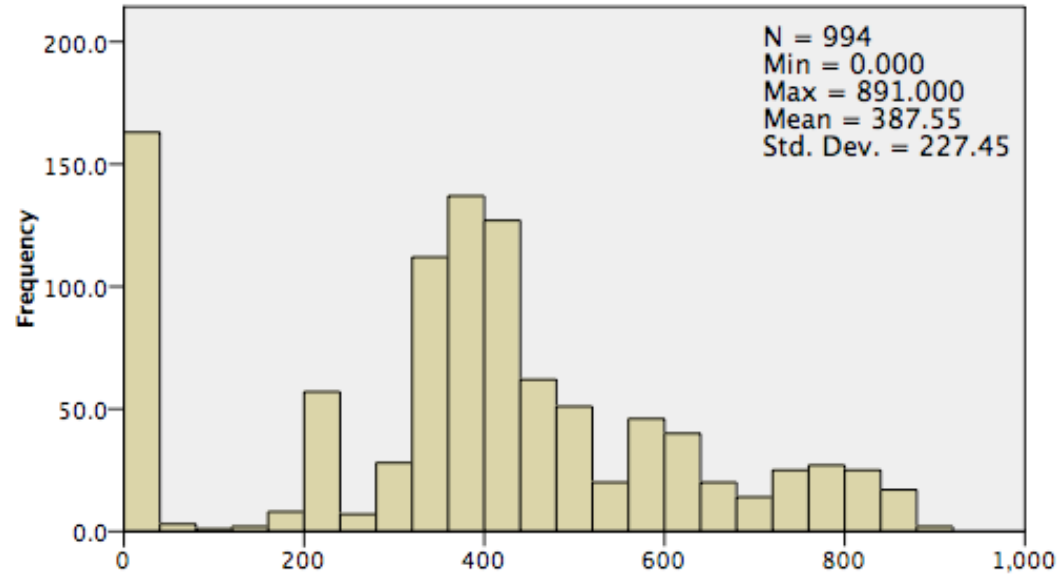
	10 sec v 1 min	1 min v 5 min	1 min v 10 min
Process Monitor	False	True	True
TCPVCon	True	True	True

Indicates:

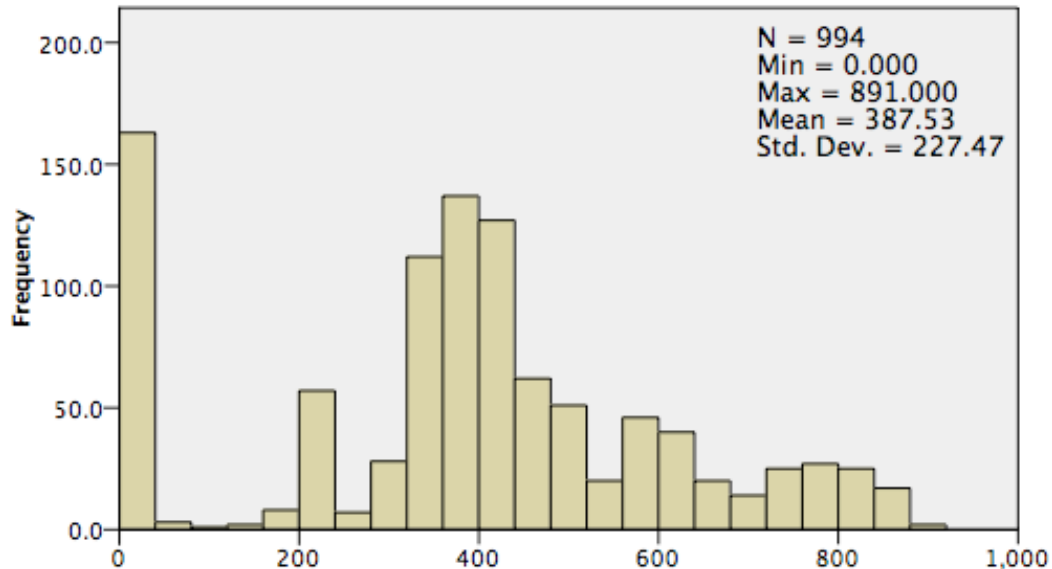
There is a statistically significant difference between 10 sec and 1min

# Results : Same execution time

Process Monitor  
(Run for 1 min)



TCPVCon  
(Run for 1 min)



# Results : Execution time

## Hypothesis 2

Both tools report the same number of opened ports at a given execution time

	10 sec	1 min	5 min	10 min
Process Monitor	True	True	True	True
TCPVCon				
<i>p</i> -value	1.000	0.056	0.157	0.317

Recall:

The *p*-value is the probability of the NULL hypothesis being true (No statistically significant difference between tools) as  $> 0.05$



# Conclusions

# Study Conclusions

- Tool & run time impacts outcome
- Minimum execution time
- No benefit if run  $> 1\text{min}$
- Impact:
  - Reduce testing time
  - Introduced quantifiable measure of uncertainty (statistical levels of confidence)

# Research conclusions

Research goals

Scope limitations

Method limitations

# Research contributions

- Evidence of a lack of trusted practice
- Framework to evaluate new tools
- Requirements to establish trusted practice
- Results of studies on tools
- MATEF performance data
- Methodology to set test time parameters

# Further work

- In-house Oracle
- GUI based tools
- Performance
- Bare metal
- Malware ingestion
- Statistical module
- Outstanding requirements

# Review

- Background
- Prior work
- Framing the problem – the RQ
- Design of a solution
- Interpreting the data
- Results
- Conclusions
- Contributions and further work

# Thank you

## Questions?

Ian Kennedy

[Ian.Kennedy@canterbury.ac.uk](mailto:Ian.Kennedy@canterbury.ac.uk)

[Ian.Kennedy@bcs.org.uk](mailto:Ian.Kennedy@bcs.org.uk)