## RS/Conference2015

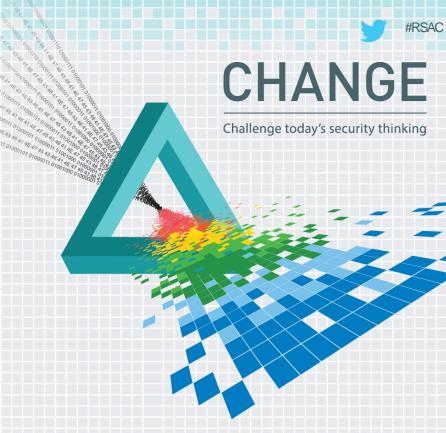
San Francisco | April 20-24 | Moscone Center

SESSION ID: ANF-F02

### The Physics of Security

#### **Andrew Rutkiewicz**

Principal IT Security Analyst
EMC
@packethawk



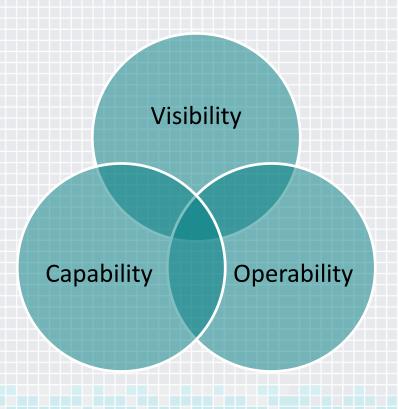






### **Challenges For (Analytics Driven) Security**

- Visibility
- Normalization of Data
  - Both Packet and Log
  - Transaction Reconstruction
- Traditional Anomaly Analytics Fail
  - Misconfigurations
  - Broken Business Process
  - Can't Operationalize
- No Standardized Measures or Models

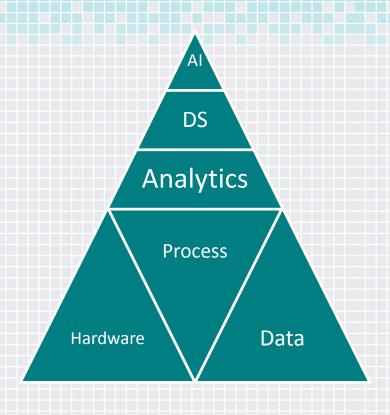




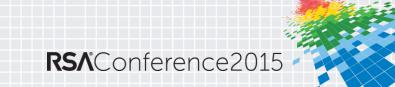


### **Big Data Pitfalls**

- Analytics
  - Apophenia
- Data Science
  - Perception Bias
- Machine Learning
  - Over Fitting
- Traditional analytic methods for network security carry high transaction costs and low yields
- Outcome: Negative ROI This is changing









### **Physics and Its Applications**

- Physics
  - Knowledge of Nature
- Applied Physics
  - Useful Application of the Knowledge
- Example: Light\Optics
  - Euclid, Alhazen, Newton, Hooke, Kao
  - 300AD First Studies of Light
  - 1973 First Fiber Optic Network







### **Entropy**

- Thermal Dynamics
  - Boltzmann and Gibbs
    - Extraction of Metals From Oxides
    - Melting/Boiling Point Manipulation
- Information Theory
  - Claude Shannon
    - Communication
    - Compression
    - Cryptanalysis

"surely must be one of the most important master's theses ever written... The paper was a landmark in that it helped to change digital circuit design from an art to a science." - The Computer from Pascal to von Neumann

By HH Goldstine







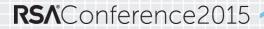


### **Entropy Hypothesis: RAT Detection**

- Detecting Binary C2 communications
  - NON-HTTP Based
- Specifically APT RATs
  - 9002, Pivy, PlugX, Gh0st
  - All use compression and or encryption
- Descriptive Based Detection
  - Non Signature Based
  - Non IoC based

```
0x00000000 (00000)
                     53544154 0178013b b8f365fc ac37d7be
                                                           STAT.x.:..e..7..
0x00000010 (00016)
                     effec580 15700145 ed80383c 332f25bf
                                                            ....p.E..8<3/%.
0x00000020 (00032)
                     bc582122 40c154cf 5041c3c8 ccc0402f
                                                            .X!"@.T.PA....@/
0x00000030 (00048)
                     38b5a82c 33395521 2031395b c15813ab
                                                           8...39U! 19[.X..
0x00000040 (00064)
                     01504115 283d4164 62a2ecf4 850e2aff
                                                            .PA. (=Adb.....*.
0x00000050 (00080)
                     1819fcfc 83423cc2 3dfd745d 8c2d8d0d
                                                            .....B<.=.t1.-..
                                                           1.i.*..U.4A....
0x00000060 (00096)
                     5df069c7 2ac78f55 943441a7 d2cc9c14
0x00000070 (00112)
                     05230303 73036343 03a05e43 033d4320
                                                            .#..s.cC..^C.=C
0x00000080 (00128)
                     34523034 37d23334 d3b3d033 24cd44c2
                                                            4R047.34...35.D.
0x00000090 (00144)
                     aa85814a 5c2b0a72 f28b528b f45c235c
                                                            ...J\+.r..R..\#\
0x000000a0 (00160)
                     ble9d8ed 2b6d7f23 f2890317 370f2f48
                                                            ....+m.#....7./H
0x0000000b0 (00176)
```



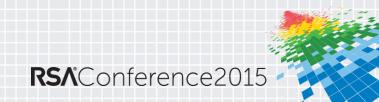




### **The Entropy Experiment**

- Calculation of entropy for network traffic
  - Most common C2 channels (20 different TCP/UDP Ports)
- Basic Byte Frequency Measures
  - Most Common Byte (MCB)
  - MCB Frequency (MFB)
  - Unique Bytes (UB)
- Analysis Applications
  - Variance from known protocols
  - Obfuscation, Compression, and Encryption Detection
  - Encoding, Key Space Usage





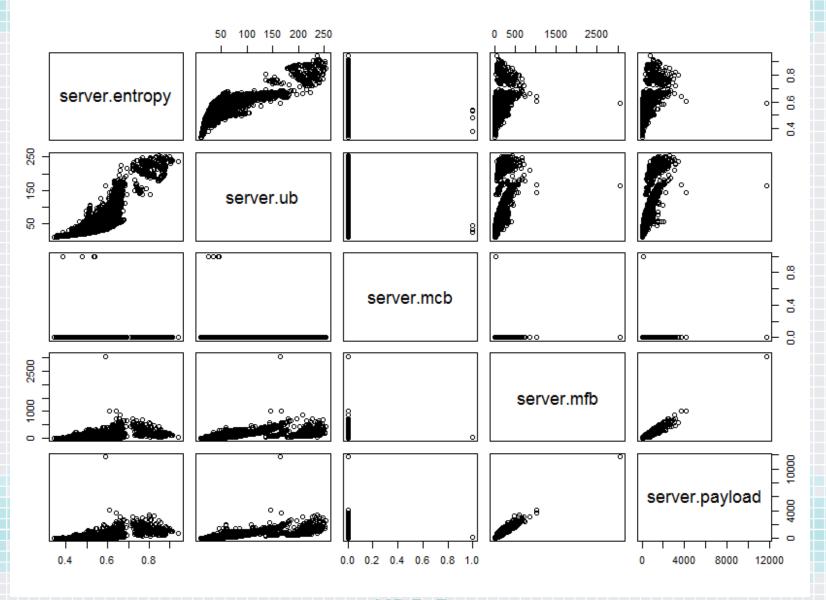


### Results (Still a WIP)

- Encoded and Compressed Data Have Predictable Patterns
  - ◆ <u>39U 19!</u>
  - ◆ \x4B63\x6060 → Gh0st
  - ◆ LZ Artifacts other than <u>789C</u>
- Scalability Concerns
  - Entropy calculation at line speeds is difficult
- DNS Anomalies
  - AV Exfil
- Pretty Pictures

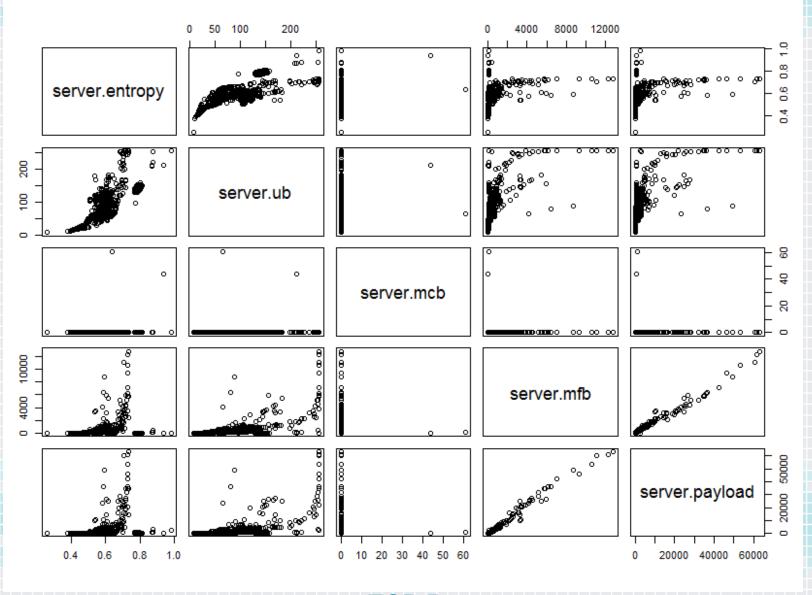






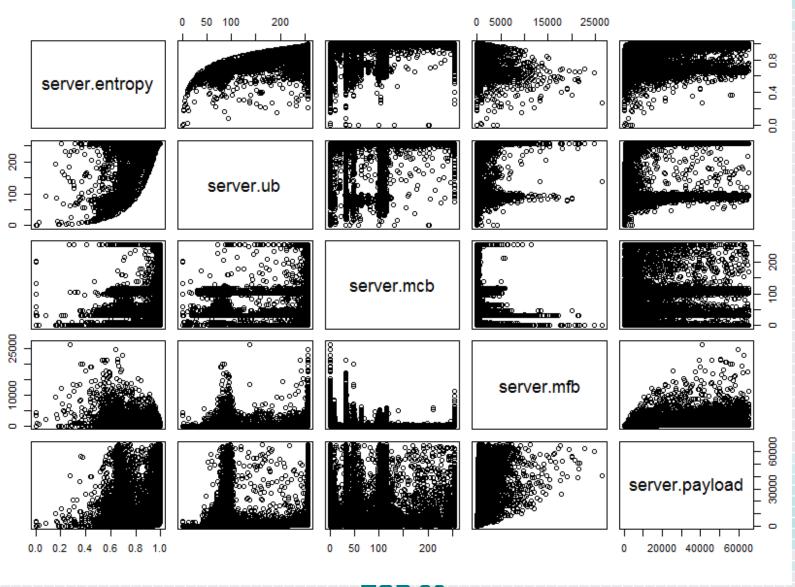
**UDP 53** 







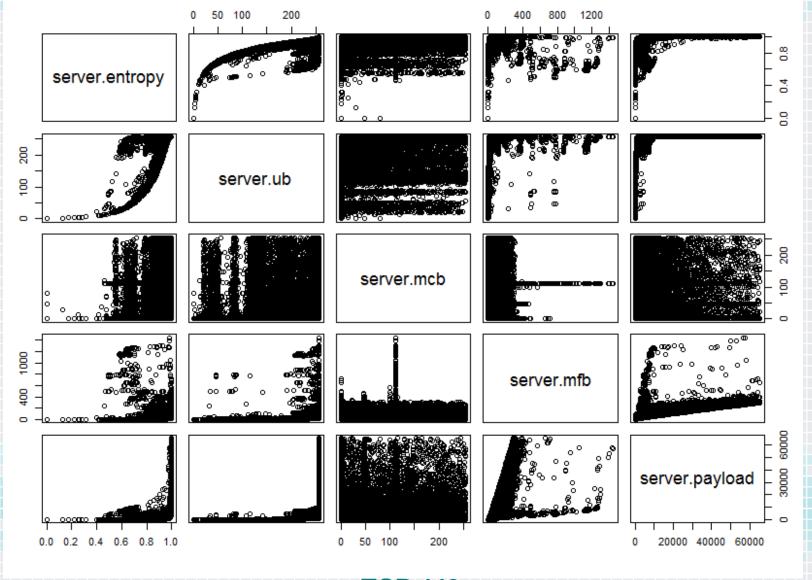




**TCP 80** 







**TCP 443** 

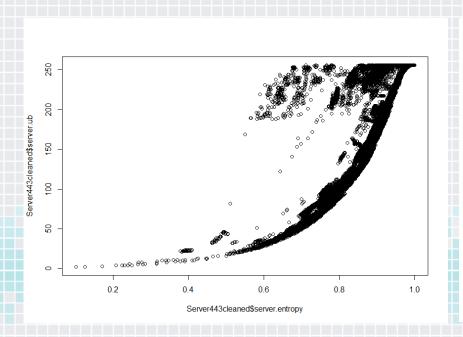


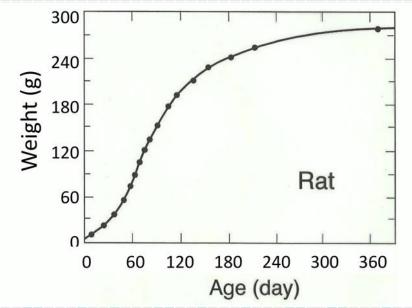


### **SSL Entropy vs Biological Growth**

### **Unique Bytes Used vs Entropy**

#### Rat Weight vs Age





(From Geoffrey West, Ted Talk, July 2011)



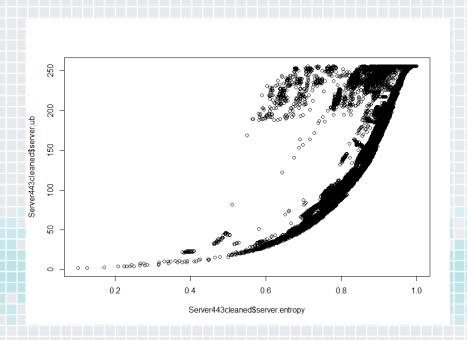


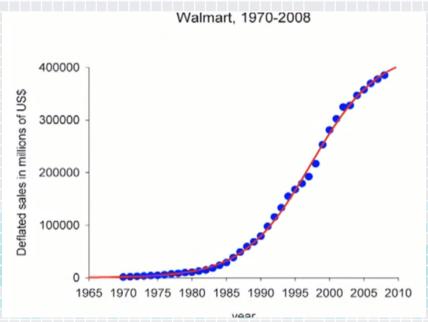


## **SSL Entropy vs Commercial Growth**

#### **Unique Bytes Used vs Entropy**

#### Walmart Sales vs Age





(From Geoffrey West, Ted Talk, July 2011)







### **Universal Driving Forces**

- Growth
  - Sigmoidal Curve or S Curve
  - Lag, Log, Decel, Plateau
- Economies of Scale
  - Parabolic Curve
  - Advantage, Neutral, Disadvantage
- These forces are as important in the understanding of the data as they are in the system they are built upon.







### **Cost Benefit Analysis**



- Data is cheap
- Data enrichment at collection time is almost as cheap as raw data
- Post processing and enrichment costs grows as you go up levels of abstraction
- "Wisdom is not tactical"







### **Going Beyond Entropy**

- Purpose Built Hardware
  - ASICs
  - DSPs
- Wave Equation
  - Application of frequency, amplitude and wavelength
  - Additional quantitative measures
- Timing Based Analysis
  - Kaminsky BlackOps
- ROWHAMMER
  - Proof physics rule HW and all it is built upon (IMO)







### **Summary**

- Security analytics are still in the lag stage
- Statistics are better than intuition
  - Physics are better than statistics
- Entropy is one of many measures available
  - But an important one
- Growth and Scale
  - Leverage economies of scale
  - S curve as a forecasting tool
- Game Theory Considerations
- As a community we must move from an art form to a science!







### **Apply What You Have Learned Today**

- Next week you should:
  - Identify where your organization is on the growth chart
- In the first three months following this presentation you should:
  - Inventory visibility and current data sets
  - Assess operational feasibility of analytics program
- Within six months you should:
  - Evaluate options between DIY or turnkey
  - Establish a plan for partnering with BI teams to conduct a POC for a practical and achievable use case.







# Questions?



