# Understanding and Disrupting Offensive Innovations

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# Bad Guys Finish First



"Few if any contemporary computer security controls have prevented a [red team] from easily accessing any information sought."

# **Bad Guys Finish First**



"Few if any contemporary computer security controls have prevented a [red team] from easily accessing any information sought."

Lt Col Roger Schell (USAF) in 1979

# **Central Question**



What cybersecurity innovations have given DEFENDERS the most advantage over ATTACKERS at greatest scale and least cost?

### Key Questions for a Defensible Cyberspace Results from NY Cyber Task Force



- 1. What is a defensible cyberspace and why hasn't it been defensible to date?
- 2. What past innovations have made the biggest difference? What made them so successful?
- 3. What innovations should we prioritize today?

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> Building a Defensible Cyberspace NEW YORK CYBER TASK FORCE



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| PAST                            | <ul> <li>Computer and network<br/>passwords (1960s–1980s)</li> <li>Intrusion detection (1990s)</li> <li>Mass vulnerability scanning<br/>(1990s)</li> <li>Encrypted data &amp; comms<br/>(2000s)</li> <li>Intrusion prevention (2000s)</li> <li>Hardware-based security<br/>(e.g., TPM) (2000s)</li> <li>Cloud-based architectures<br/>(2010s)</li> <li>Multifactor authentication<br/>(2010s)</li> </ul> | <ul> <li>Firewalls (1980s)</li> <li>Anti-virus/anti-malware (1990s+)</li> <li>Expedited deployment of patches (1990s+)</li> <li>Network segmentation (2000s)</li> <li>Malware sandboxing (2000s)</li> <li>Security analytics (2000s)</li> <li>User &amp; entity behavioral analytics (2000s)</li> <li>DDoS protection (2010s)</li> <li>Tokenization (2010s)</li> </ul> | <ul> <li>User education and awareness<br/>(1970s)</li> <li>Creation of CERTs (1980s)</li> <li>Creation of ISACs (1990s)</li> <li>Training &amp; certifications<br/>(1990s)</li> <li>Asset inventories (2000s)</li> <li>Top 20 controls (2000s)</li> <li>Board involvement, liability<br/>(2010s)</li> <li>Presumption of breach (2010s)</li> <li>NIST cyber framework (2010s)</li> <li>Intel-driven operations (2010s)</li> </ul>                                                       | <ul> <li>Creation of pentesting teams<br/>(1970s)</li> <li>Creation of CISO role (1990s)</li> <li>Capability Maturity Model<br/>(1990s)</li> <li>Response playbooks (1990s)</li> <li>Cyber exercises (2000s)</li> <li>Standard configurations<br/>(2000s)</li> <li>Cyber kill chain (2010s)</li> <li>Automated threat sharing<br/>(2010s)</li> <li>FBI sharing of IOCs (2010s)</li> </ul> | <ul> <li>Commission and task force report</li> <li>Cybersecurity laws (e.g., CFAA)</li> <li>Single White House cyber officia</li> <li>Atted ata breach laws (2000s)</li> <li>Recognition of cyber as operation</li> <li>Board accountability including SI</li> <li>USG disclosure to companies if t</li> <li>FTC enforcement actions (2010s)</li> <li>Enabling policies and laws (e.g., I</li> <li>Leveraging existing regulations, a (FFIEC IT Handbooks, GLBA)</li> </ul>                        | rts (e.g., Ware Report, PCCIP) (1970s-<br>(1980s)<br>I (2000s)<br>EC guidance (2010s)<br>hey're breached (2010s)<br>)<br>nfo. sharing, CISA, Exec. Orders) (199<br>as with finance sector                                                                       |
|---------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| POTENTIAL FUTURE<br>INNOVATIONS | <ul> <li>Critical mass of<br/>cloud deployment</li> <li>Automated measurement of<br/>attack surface</li> <li>Computer-generated<br/>software diversity</li> <li>Widespread chip-and-<br/>pin deployment</li> <li>Scalable security automation</li> </ul>                                                                                                                                                 | <ul> <li>Autonomic and<br/>autonomous defenses</li> <li>Strong bio-authentication</li> <li>Alternate computing and<br/>security architectures<br/>(e.g., islets)</li> <li>Instrumenting data<br/>with sensors</li> <li>Analog controls</li> </ul>                                                                                                                      | <ul> <li>Security scorecards and ratings</li> <li>Active vendor management</li> <li>Insurance and other risk transfer</li> <li>Improved security metrics from</li> <li>More holistic combination of risk<br/>business continuity, crisis manage</li> <li>Software bill of materials</li> </ul>                                                                                                                                                                                          | r<br>cloud<br>k, cybersecurity, physical security,<br>gement                                                                                                                                                                                                                                                                                                                              | ৎ 🚭 ӣ Safe harbor provisions for sharin<br>ৎ 💩 National data breach notification                                                                                                                                                                                                                                                                                                                                                                                                                   | g<br>Iaw                                                                                                                                                                                                                                                        |
| PAST                            | <ul> <li>Automated updates (1990s)</li> <li>Built-in NAT firewalls (1990s)</li> <li>Adding security to s/w developmed</li> <li>Dev environment security (2000s)</li> <li>Security added to IETF standards (2010s)</li> <li>Ubiquitous, transparent encryption</li> <li>Cloud-based security at platform</li> <li>Ubiquitous, secure protocols (HTT)</li> <li>Automated testing (2010s)</li> </ul>        | ent lifecycle (2000s)<br>;)<br>process (2000s)<br>on (2010s)<br>companies (2010s)<br>TPS, TLS/SSL) (2010s)                                                                                                                                                                                                                                                             | <ul> <li>Physical protection, personnel s</li> <li>Creation of operators' groups (e</li> <li>Security certifications (1990s)</li> <li>Arresting malicious attackers (1)</li> <li>Volunteer groups for response (</li> <li>Volunteer groups for protection</li> <li>Rise of security industry and out</li> <li>Industry Associations (e.g., ICAS (2000s)</li> <li>Rise of DevOps (2000s)</li> <li>Institutionalized bug bounty pro</li> <li>Attribution methodologies (2010s)</li> </ul> | ecurity and operational security (1960s)<br>g., NANOG, RIPE) (1990s)<br>990s)<br>e.g., Conficker, NSP-SEC) (2000s)<br>(e.g., I Am the Cavalry) (2000s)<br>sourced monitoring (2000s)<br>5I, Cyber Threat Alliance, M3AAWG)<br>grams (2010s)<br>Ds)                                                                                                                                        | <ul> <li>Education: Cybersecurity Core C</li> <li>Budapest Convention (2000s)</li> <li>International capacity building (2</li> <li>International coordination (e.g., U (2010s))</li> <li>DMCA exemptions for security r</li> <li>Law enforcement attachés (2010</li> <li>Vulnerabilities Equities Process (</li> <li>Indictments, sanctions (2010s)</li> <li>New USG orgs (e.g., CS&amp;C, NCS0</li> <li>Scandinavian botnet policies and</li> <li>Australia ISP code of conduct (2010)</li> </ul> | urriculum, CAEs, NICE (1990s+)<br>2000s)<br>JN GGE, London and EWI processes)<br>esearchers (2010s)<br>ls)<br>2010s)<br>C, CTIIC) (2010s)<br>cleaning ecosystem (2010s)<br>010s)                                                                                |
| POTENTIAL FUTURE<br>INNOVATIONS | <ul> <li>Inexpensive formal methods, such</li> <li>Formal methods applied to standa</li> <li>Signed firmware</li> <li>Quantum encryption</li> <li>Blockchain</li> </ul>                                                                                                                                                                                                                                  | n as HACMS<br>ards, like HTTPS                                                                                                                                                                                                                                                                                                                                         | <ul> <li>Cyber Independent Testing Labs<br/>rating systems</li> <li>Continuous disruption of advers</li> <li>Continuous disruption organiz</li> <li>Independent attribution organiz</li> <li>Crowdsourcing IOCs for early de</li> </ul>                                                                                                                                                                                                                                                 | and other quantification and<br>ary operations<br>ation<br>stection                                                                                                                                                                                                                                                                                                                       | <ul> <li>Norms: rules of the road for cyber conflict</li> <li>"Naming and shaming," especially when norms are violated</li> <li>FCC action</li> <li>Regulatory emphasis on response, rather</li> </ul>                                                                                                                                                                                                                                                                                             | <ul> <li>Global governance structu<br/>G20+ICT20</li> <li>Shifts in liability, especiall<br/>for software and IoT</li> <li>Federal insurance backsto</li> <li>Improved security metrics<br/>to drive better policy</li> <li>WTO and trade restrictio</li> </ul> |





innovation? effect of the is pr









# **Central Question**



What cybersecurity innovations have given DEFENDERS the most advantage over ATTACKERS at greatest scale and least cost?

Extremely successful!

But what if flip the perspective and not center on defensive innovations...

https://sipa.columbia.edu/sites/default/files/3668\_SIPA%20Defensible%20Cyberspace-WEB.PDF



# Let's Flip That Central Question

What cybersecurity innovations have given ATTACKERS the most advantage over DEFENDERS at greatest scale and least cost?

Thanks to our collaborators on this!

- Mike Klipstein (SIPA)
- Rob Sheldon (CrowdStrike)

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# **OFFENSIVE INNOVATIONS**

TWO KINDS: DRIVEN BY OFFENSE, DRIVE BY DEFENSE





|                                                      | 기계 전에 지니 이제 지나 있습니?                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   | Type of innovation                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                      |                                                                                                                                                                                                                                                                        |
|------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| ant Z - N                                            | Technology                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            | Operations                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              | Policy                                                                                                                                                                                                                                                                 |
| Innovations<br>Benefiting or<br>Driven By<br>Offense | Whistle for 2600Hz tone (1960s)<br>Mass scanning, eg NMAP (1990s)<br>Password cracking tools: John the<br>Ripper, Rainbow Tables, hydra<br>(1990s)<br>Point-and-click worm and virus kits<br>(1990s)<br>Interactive reversing tools: IDA Pro,<br>Binary Ninja, Ghidra, etc (1990s)<br>Malware obfuscation (2000s)<br>Inexpensive rootkits, eg BO2K<br>(2000s)<br>Metasploit (2000s)<br>Botnet and effective command &<br>control (2000s)<br>Exploit writing aides: Pwntools,<br>mona, ROP chain finders (i.e.,<br>Ropper, RopGadget), Cain & Abel<br>Fuzzers: Peach, BURP Suite, AFL, | <ul> <li>Hacktivism organizations (1990s)</li> <li>Information exchanges: Hacker<br/>conferences, YouTube videos, CTF<br/>competitions (1990s)</li> <li>Carder markets (2000s)</li> <li>4chan instigation and organization of<br/>attacks operations (2000s)</li> <li>Rent-a-DDoS or rent-a-botnet<br/>services (2000s)</li> <li>Bulletproof hosting</li> <li>Arrangements with banks for large-<br/>scale monetization</li> <li>Cybercrime-as-a-service (2010s)</li> <li>Bitcoin and other anonymized<br/>payment methods (2010s)</li> <li>Snowden, Vault7, Shadow Broker<br/>leaks (2010s)</li> </ul> | <ul> <li>National sanctuaries for cyber criminals<br/>if they don't attack host nation</li> <li>States using proxy groups and ignoring<br/>criminal side jobs</li> <li>Deliberately weak financial controls to<br/>abet corruption and criminal enterprises</li> </ul> |

Pineapple, Rubber Duckie, ProxMark, etc. (2010s)

- Many innovations helped defenders as well as attackers.
- Inclusion here doesn't imply they were mistakes or helped attackers more then defenders
- Dates are when innovations first started to gain mass. In many cases, they've continued to the present day

### Important Offensive Innovations of the Past 50 Years Technological Innovations



# Technology

- Whistle for 2600Hz tone (1960s)
- Mass scanning, eg NMAP (1990s)
- Password cracking tools: John the Ripper, Rainbow Tables, hydra (1990s)
- Point-and-click worm and virus kits (1990s)
- Interactive reversing tools: IDA Pro, Binary Ninja, Ghidra, etc (1990s)
- Malware obfuscation (2000s)
- Inexpensive rootkits, eg BO2K (2000s)
- Metasploit (2000s)
- Botnet and effective command & control (2000s)
- Exploit writing aides: Pwntools, mona, ROP chain finders (i.e., Ropper, RopGadget), Cain & Abel
- Fuzzers: Peach, BURP Suite, AFL, etc.
- Shodan for IoT scanning (2010s)
- Low-cost COTS offensive security capabilities: Pwnie Express, Wifi Pineapple, Rubber Duckie, ProxMark, etc. (2010s)

- Inexpensive rootkits, eg BO2K (2000s)
- Botnet and effective command & control (2000s)

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Innovations Benefiting or Driven By Offense

Innovation originated with hackers, security researchers or other non-defenders

# Important Offensive Innovations of the Past 50 Years Operational Innovations



### Operations

- Hacktivism organizations (1990s)
- Information exchanges: Hacker conferences, YouTube videos, CTF competitions (1990s)
- Carder markets (2000s)
- 4chan instigation and organization of attacks operations (2000s)
- Rent-a-DDoS or rent-a-botnet services (2000s)
- Bulletproof hosting
- Arrangements with banks for large-scale monetization
- Cybercrime-as-a-service (2010s)
- Bitcoin and other anonymized payment methods (2010s)
- Snowden, Vault7, Shadow Broker leaks (2010s)

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# Important Offensive Innovations of the Past 50 Years Policy Innovations



### Policy

Innovations Benefiting or Driven By Offense

Innovation originated with hackers, security researchers or other non-defenders

- National sanctuaries for cyber criminals if they don't attack host nation (2000s)
- States using proxy groups and ignoring criminal side jobs (2010s)
- Deliberately weak financial controls to abet corruption and criminal enterprises (1500s)

- National sanctuaries for cyber criminals
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### Important Offensive Innovations of the Past 50 Years Sometimes We Do It to Ourselves



#### "Mistakes" Driven by Defenders • Insecure TCP/UDP, • Insecure WiFi, Zigb

Innovation resulted from actions taken by defenders, consumers or other non-attackers

### Technology

- Insecure fundamental protocols: BGP, TCP/UDP, DNS, IP v4/v6
- Insecure wireless protocols: BlueTooth, WiFi, Zigbee, etc
- Use of weak, hard-coded, or default passwords
- Hyper vulnerable, interactive web languages and client-side applications: Java Script, nodeJS, ActiveX, PHP, VBScript
- Deployment of insecure software
- Market incentives which reward rushing insecure software to market
- Mass deployment of insecure IoT
- Untrackable shadow IT
- Ubiquitous encryption across the boundary (e.g. SSL) obfuscating exfiltration of info

#### What kind of innovation is it? Operations

#### • Limited trust, reluctant information

- sharing, poor corporate governance
- Patch diffing for vulnerabilities

### Policy

- Decreasing global trust and governance
- New top-level domains
- Weak cybersecurity laws
- Few, weak global cyber norms
- Lack of deterrent for 'grey area' operations
- Liability concerns driving secrecy
- Lack of sensible regulations that can drive accountability

# Important Offensive Innovations of the Past 50 Years Sometimes We Do It to Ourselves



"Mistakes" Driven by Defenders

Innovation resulted from actions taken by defenders, consumers or other non-attackers

#### Technology

 Insecure fundamental protocols: BGP, TCP/UDP, DNS, IP v4/v6

 Market incentives which reward rushing insecure software to market

 Mass deployment of insecure IoT

# Operations

What kind of innovation is it?

 Patch diffing for vulnerabilities

#### Policy

•Few, weak global cyber norms

• Lack of deterrent for 'grey area' operations

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# **LESSONS AND RECOMMENDATIONS**





# **Commonalities and Differences**

- Hard to argue that the ecosystem overall is improving despite individual successes
- Limited attacker innovation
- Many offensive innovations are 'self-inflicted'

# **About Offensive Security**



- OFFSEC does of course aid both attackers and defenders
- On balance, have tools advantaged attackers over defenders:
  - Far less less about equal more far more?
  - Needs analysis based on measurements not anecdotes or inertia

# • Critical questions:

- Which characteristics of OFFSEC tools preferentially helps malicious use over defensive use? Under which circumstances?
- How can we shift the balance to maximize defensive advantage while minimizing malicious?

# **Potential Areas for Disruption**



- Tech may only offer a few options for disruption at scale
  - Botnet disruption has not scaled
  - New US strategy of persistent engagement based on imposing friction. Success may hinge on whether defensive disruptive operations can cheaply scale
- Possibly higher chances in operations and policy
  - Botnet disruption has not scaled
  - Indictments have mixed results: more impact on Chinese actors than Iranians and Russians
  - Disrupt adversary *trust* networks (USCYBER versus IRA)
  - Promise for disruption of payment systems for monetization

# **Disrupting Offensive Innovations at Scale** Example: Disrupting Cashing Out



#### Click Trajectories: End-to-End Analysis of the Spam Value Chain

Kirill Levchenko<sup>\*</sup> Andreas Pitsillidis<sup>\*</sup> Neha Chachra<sup>\*</sup> Brandon Enright<sup>\*</sup> Márk Félegyházi<sup>‡</sup> Chris Grier<sup>†</sup> Tristan Halvorson<sup>\*</sup> Chris Kanich<sup>\*</sup> Christian Kreibich<sup>†</sup>o<sup>†</sup> He Liu<sup>\*</sup> Damon McCoy<sup>\*</sup> Nicholas Weaver<sup>†</sup> Vern Paxson<sup>†</sup>o<sup>†</sup> Geoffrey M. Voelker<sup>\*</sup> Stefan Savage<sup>\*</sup>

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Engineering <sup>T</sup>Computer Science Division Niego University of California, Berkeley <sup>‡</sup>Laboratory of Cryptography and System Security (CrySyS)

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aboratory of Cryptography and System Security (CrySyS) Budapest University of Technology and Economics

Abstract-Spam-based advertising is a business. While it has engendered both widespread antipathy and a multi-billion dollar anti-spam industry, it continues to exist because it fuels a profitable enterprise. We lack, however, a solid understanding of this enterprise's full structure, and thus most anti-spam interventions focus on only one facet of the overall spam value chain (e.g., spam filtering, URL blacklisting, site takedown). In this paper we present a holistic analysis that quantifies the full set of resources employed to monetize spam emailincluding naming, hosting, payment and fulfillment-using extensive measurements of three months of diverse spam data broad crawling of naming and hosting infrastructures, and over 100 purchases from spam-advertised sites. We relate these resources to the organizations who administer them and then use this data to characterize the relative prospects for defensive interventions at each link in the spam value chain. In particular, we provide the first strong evidence of payment bottlenecks in the spam value chain; 95% of spam-advertised pharmaceutical replica and software products are monetized using merchant services from just a handful of banks.

it is these very relationships that capture the structural dependencies—and hence the potential weaknesses—within the spam ecosystem's business processes. Indeed, each distinct path through this chain—registrar, name server, hosting, affiliate program, payment processing, fulfillment directly reflects an "entrepreneurial activity" by which the perpetrators muster capital investments and business relationships to create value. Today we lack insight into even the most basic characteristics of this activity. How many organizations are complicit in the spam ecosystem? Which points in their value chains do they share and which operate independently? How "wide" is the bottlencek at each stage of the value chain—do miscreants find alternatives plentiful and cheap. or scarce, requiring careful husbanding?

The desire to address these kinds of questions empirically—and thus guide decisions about the most effective mechanisms for addressing the spam problem—forms the core motivation of our work. In this paper we develop



"95% of spam-advertised pharmaceutical, replica and software products are monetized using merchant services from just a handful of banks"

# **Disrupting Offensive Innovations at Scale**

#### Priceless: The Role of Payments in Abuse-advertised Goods

Damon McCoy, Hitesh Dharmdasani George Mason University

Christian Kreibich University of California, San Diego and International Computer Science Institute

> Geoffrey M. Voelker and Stefan Savage University of California, San Diego

#### ABSTRACT

Large-scale abusive advertising is a profit-driven endeavor. Without consumers purchasing spam-advertised Viagra, search-advertised counterfeit software or malware-advertised fake anti-virus, these campaigns could not be economically justified. Thus, in addition to the numerous efforts focused on identifying and blocking individual abusive advertising mechanisms, a parallel research direction has emerged focused on undermining the associated mean of monetization: payment networks. In this paper we explain the complex role of payment processing in monetizing the modern af filiate program ecosystem and characterize the dynamics of these banking relationships over two years within the counterfeit pharmaceutical and software sectors. By opportunistically combining our own active nurchasing data with contemporary disruption efforts by brand-holders and payment card networks, we gather the first empirical dataset concerning this approach. We discuss how well such payment interventions work, how abusive merchants respond in kind and the role that the payments ecosystem is likely to play in the future.

individual mechanisms directly, an alternative research agenda revolves around undermining the conomics of the activity itself. In particular, as with all advertisers, the actors employing these abusive techniques are profit-secking and only participate due to the promise of compensation (e.g., a typical pharmaceutical spanmer is paid a 40% commission on the gross revenue of each safe they bring in). Thus, if these payments dried up, so too might the incentive to continue advertising.

In this paper we examine this question by focusing particularly on abusive advertising that is directly capatilated through consumer credit card payments (e.g., counterfeit goods such as pharmaceuticals) [11] and some frand scams such as fake anti-vinus [15]). We are motivated in part by our previous work documenting that a small number of banks are implicated in handling credit card payments for the vast majority of spam-advertised goods [10]. In that paper, we hypothesized that interrupting those banking relationships However, at the time we lacked the data to evaluate this "payment intervention" theory; to the best of our knowledge, few such concerted actions were even being attempted. Over the last year, however, there has been similicant advotion of this anroach and we

- For the few tens of dollars for a modest online purchase, our data shows that it is possible to identify a portion of the underlying payment infrastructure and, within weeks, cause it to be terminated.
- This termination cost is inevitably far higher— in fines, in lost holdback, in time and in opportunity cost—than the cost of the intervention itself.
- Relatively concentrated actions with key financial institutions can have outsized impacts.



Transactions



# **Parallel and Future Research**

### • Other efforts

- NYCTF2 on operational collaboration at scale
- Framework for defensive operational disruption and dataset
- SIPA student capstone on effects of operational disruption
- Possible Future efforts
  - Collaborate with those engaged in research & active disruption ops
  - Expand out charts of innovations
  - Structured analysis of which offensive innovations may be most vulnerable to disruption

# **THANK YOU**

# @Jason\_Healey @DAlperovitch