Formal Methods and Tools for Distributed Systems

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Microsoft

http://research.microsoft.com/~tball

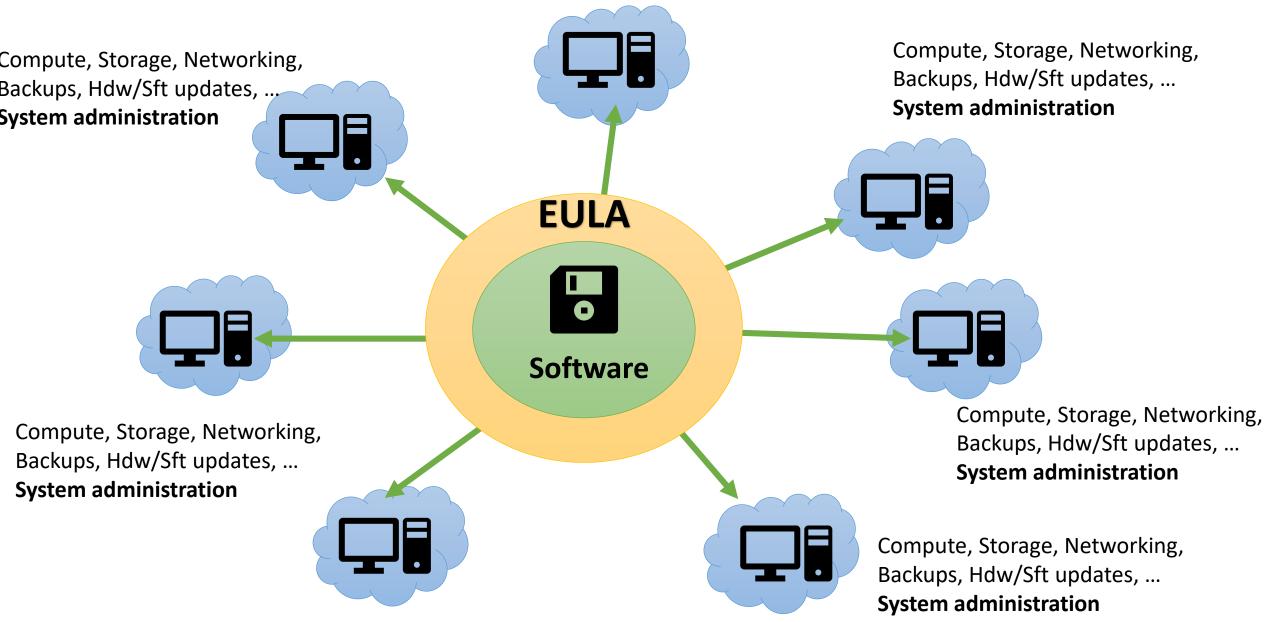
Outline

- 20 Years at Microsoft (1999-present)
- The great work of others at Microsoft

20 Years at Microsoft

From EULA to SLA From Bugs and Bounties to Cyberweapons From Spec to Spec+Check From Closed to Open

From EULA (1) to SLA



Microso

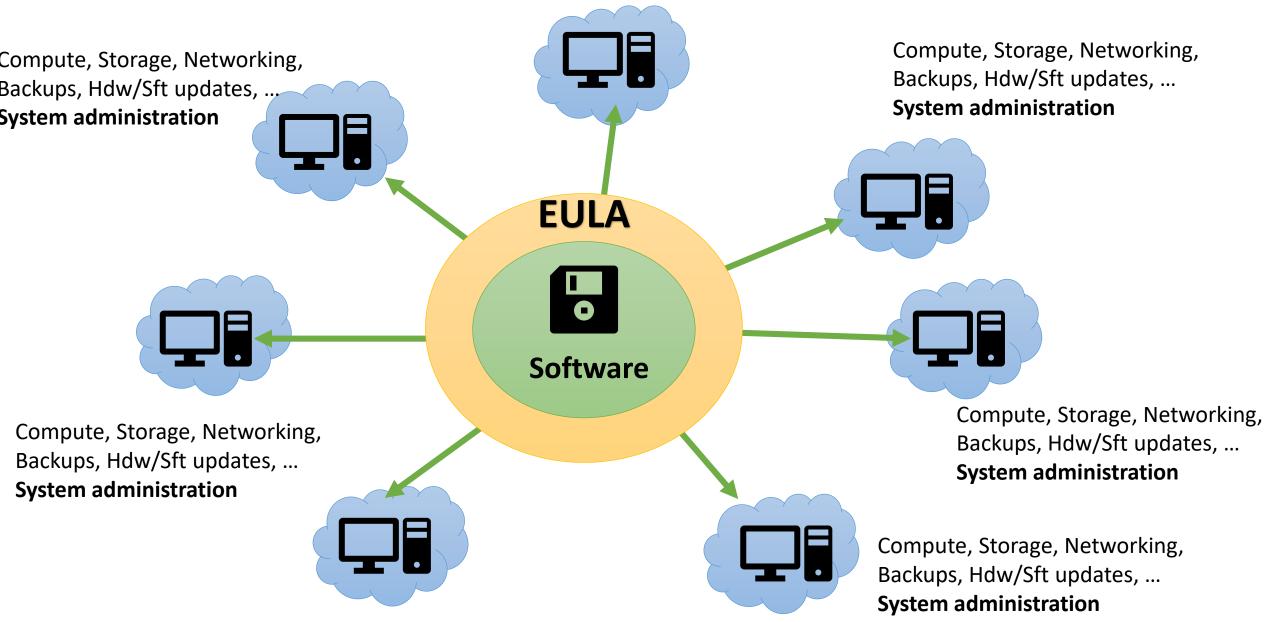
.

11. EXCLUSIC CERTAIN OT PERMITTED MICROSOFT SPECIAL, IN DAMAGES W DAMAGES E INFORMATIC INJURY, FOR DUTY INCLU FOR NEGLIC OTHER LOSS RELATED T SOFTWARE PROVIDE SU CONNECTIO THE EVENT STRICT LIAB WARRANTY MICROSOFT POSSIBILITY

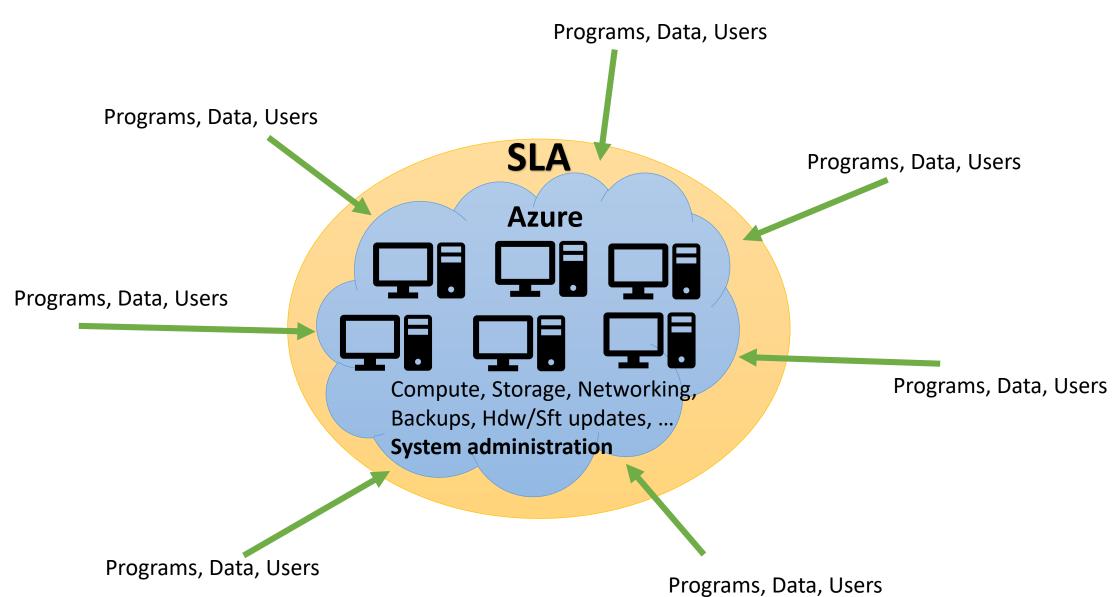
The GPL

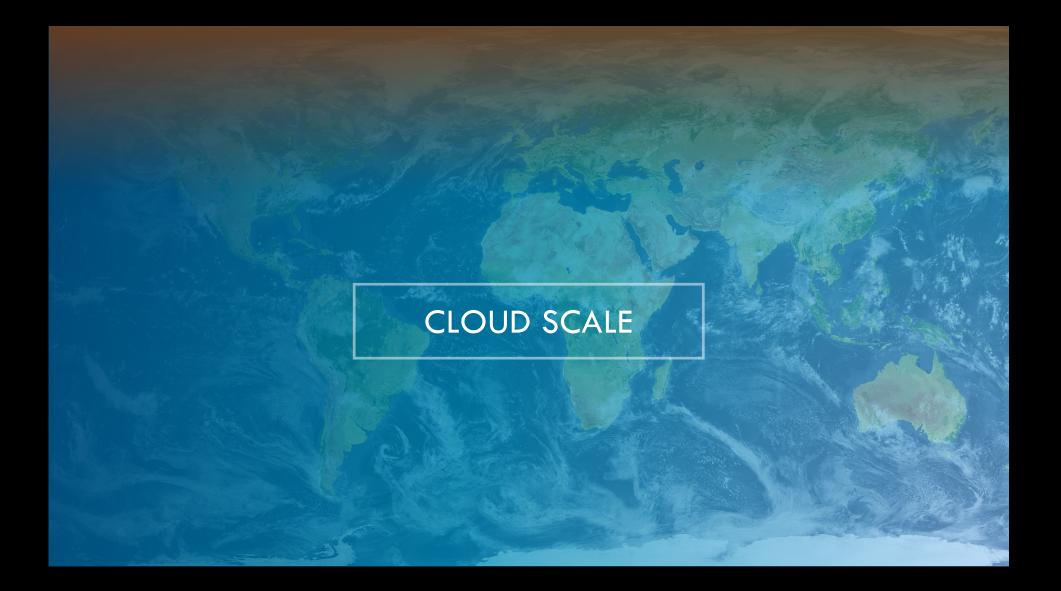
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From EULA (1) to SLA



From EULA to SLA (2)





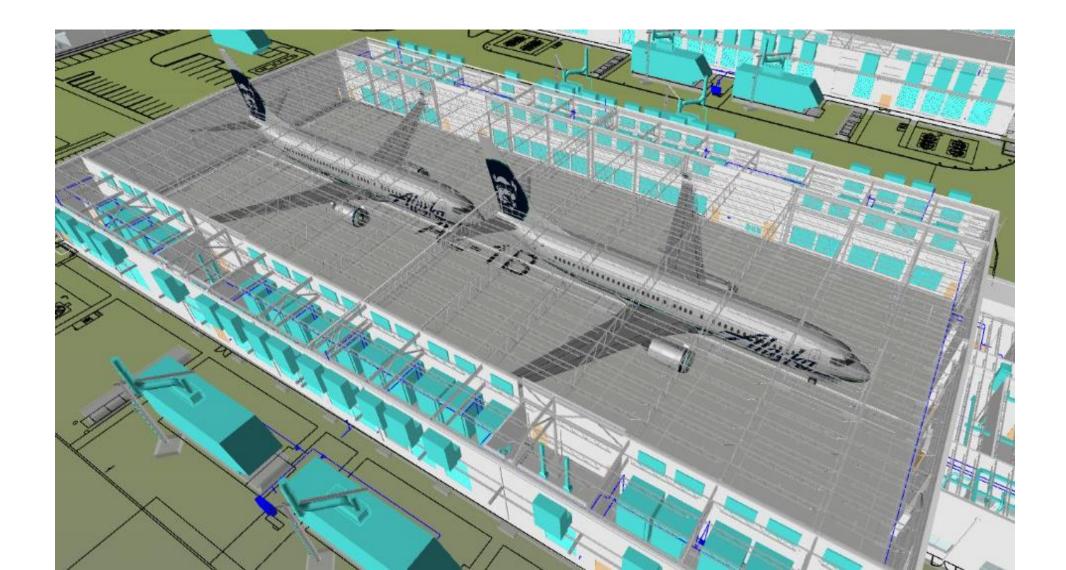




Cloud Scale..



Cloud Scale....



Service Level Agreement (SLA)

"For all Virtual Machines that have two or more instances deployed in the same Availability Set, we guarantee you will have Virtual Machine Connectivity to at least one instance at least 99.95% of the time."

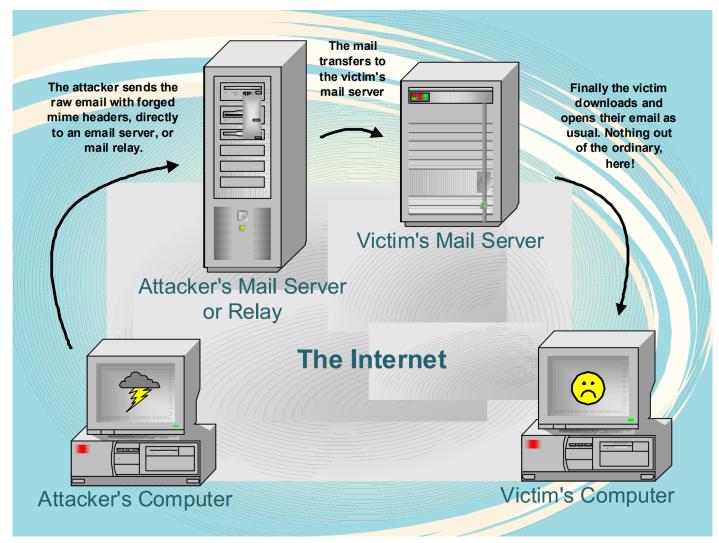
MONTHLY UPTIME PERCENTAGE	SERVICE CREDIT
< 99.95%	10%
< 99%	25%
< 95%	100%

https://azure.microsoft.com/support/legal/sla/virtual-machines/v1_8/

From Bugs and Bounties to Cyberweapons

Bugs... because there are so many more ways for things to go wrong than there are for them to go right.

Bugs (2001): Nimda



https://en.wikipedia.org/wiki/Nimda https://www.zdnet.com/article/nimd a-rampage-starts-to-slow/ https://www.cnet.com/news/microsoftattempts-to-allay-security-fears/ https://digitalguardian.com/about/secu rity-change-agents/code-red-andnimda-worms

https://pen-testing.sans.org/resources/papers/gcih/automated-execution-arbitrary-code-forged-mime-headers-microsoft-inte



Bill Gates' Trustworthy Computing Memo

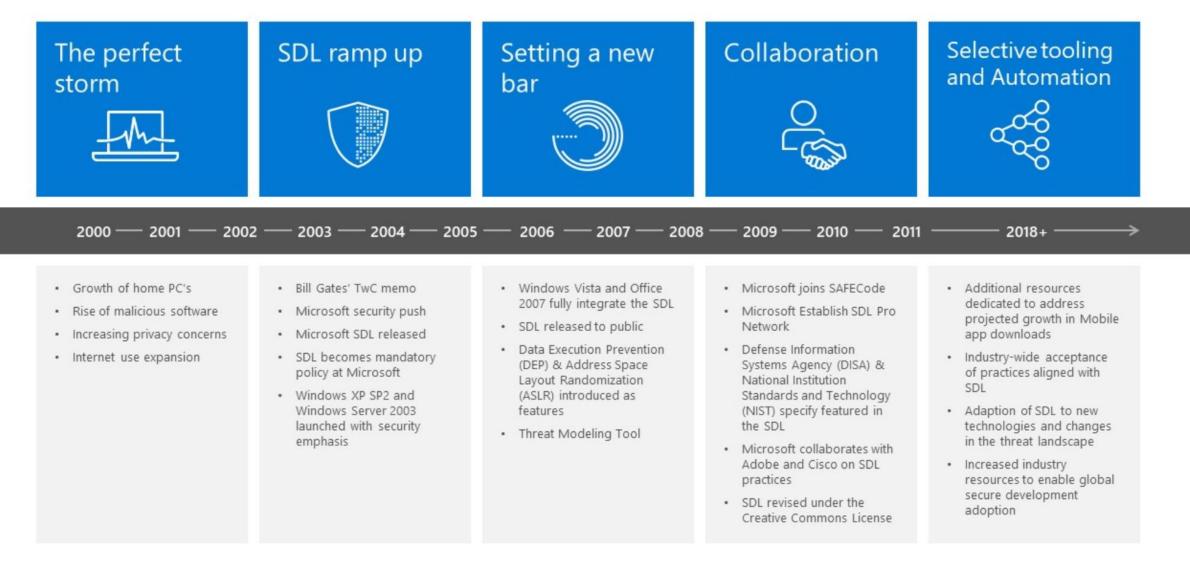
Availability: Our products should always be available when our customers need them. System outages should become a thing of the past because of a software architecture that supports redundancy and automatic recovery. ...

Security: The data our software and services store on behalf of our customers should be protected from harm and used or modified only in appropriate ways. ...

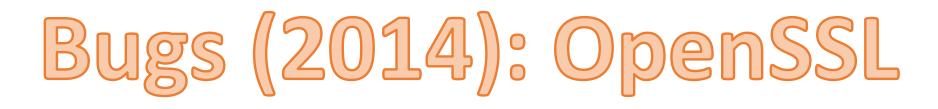
Privacy: Users should be in control of how their data is used. Policies for information use should be clear to the user. Users should be in control of when and if they receive information to make best use of their time. ...

https://www.wired.com/2002/01/bill-gates-trustworthy-computing/

SDL Timeline



https://www.microsoft.com/en-us/securityengineering/sdl/about



"These produce wrong results. The first example does so only on 32 bit, the other three also on 64 bit."

"I believe this affects both the SSE2 and AVX2 code. It does seem to be dependent on this input pattern."

"I'm probably going to write something to generate random inputs and stress all your other poly1305 code paths against a reference implementation."

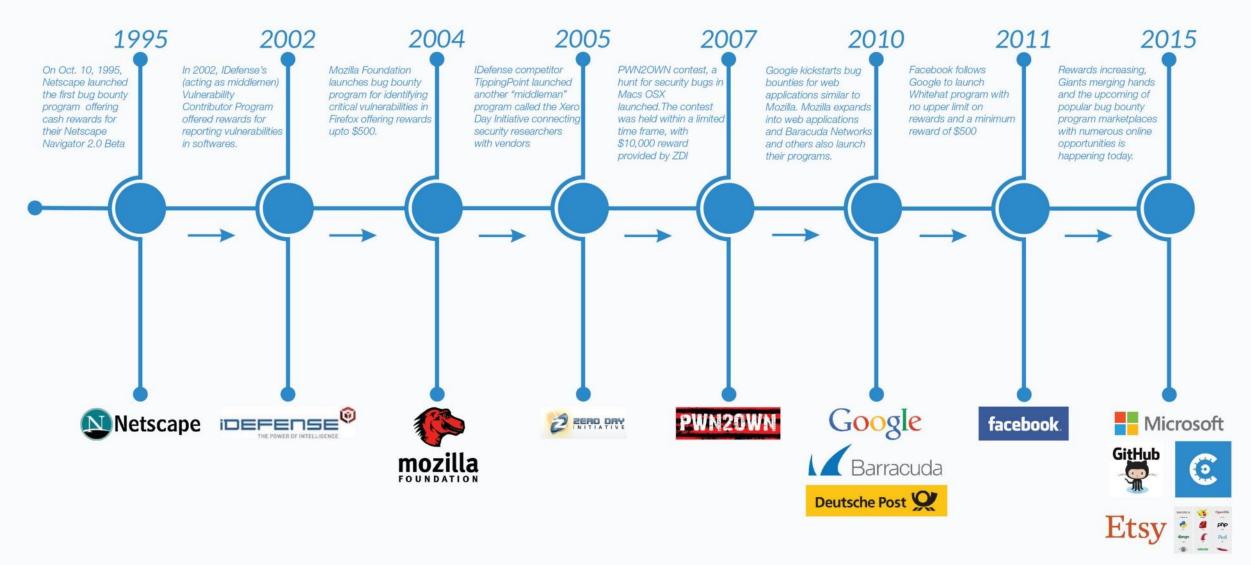
Poly1305 functions of openssi.	Hi folks,
These produce wrong results. The first exam	nple de You know the drill. See the attached poly1305_test2.c.
the other three also on 64 bit.	<pre>\$ OPENSSL_ia32cap=0 ./poly1305_test2</pre>
	PASS
	\$./poly1305_test2
	Poly1305 test failed.
	got: 2637408fe03086ea73f971e3425e2820
	expected: 2637408fe13086ea73f971e3425e2820
	I believe this affects both the SSE2 and AVX2 code. It does seem to be
	dependent on this input pattern.
	This was found because a run of our SSL tests happened to find a
	problematic input. I've trimmed it down to the first block where they

The Impact of One Bug

"The Heartbleed Bug is a serious vulnerability in the popular OpenSSL cryptographic software library. This weakness allows stealing the information protected, under normal conditions, by the SSL/TLS encryption <u>used to secure the Internet</u>."

http://heartbleed.com/

Bounties



https://blog.cobalt.io/the-history-of-bug-bounty-programs-50def4dcaab3



"**Stuxnet** is a <u>malicious computer worm</u>, first uncovered in 2010. Thought to have been in development since at least 2005, Stuxnet targets <u>SCADA</u> systems and is believed to be responsible for causing substantial damage to <u>Iran's nuclear program</u>."

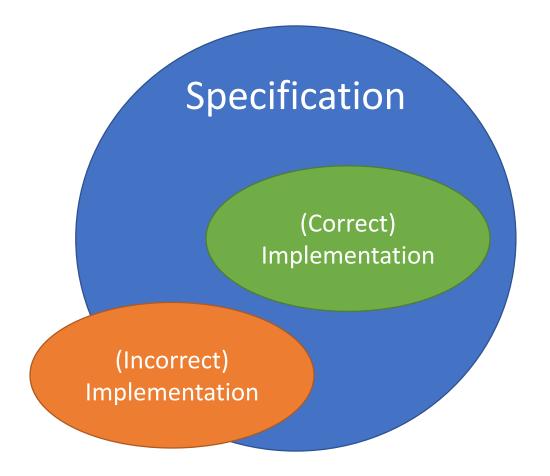
"Stuxnet attacked Windows systems using an unprecedented four <u>zero-day</u> <u>attacks</u> (...)... The number of zero-day exploits used is unusual, as they are highly valued and <u>malware creators</u> do not typically make use of (and thus simultaneously make visible) four different zero-day exploits in the same worm."

https://en.wikipedia.org/wiki/Stuxnet

From Spec to Spec+Check

Formal Methods

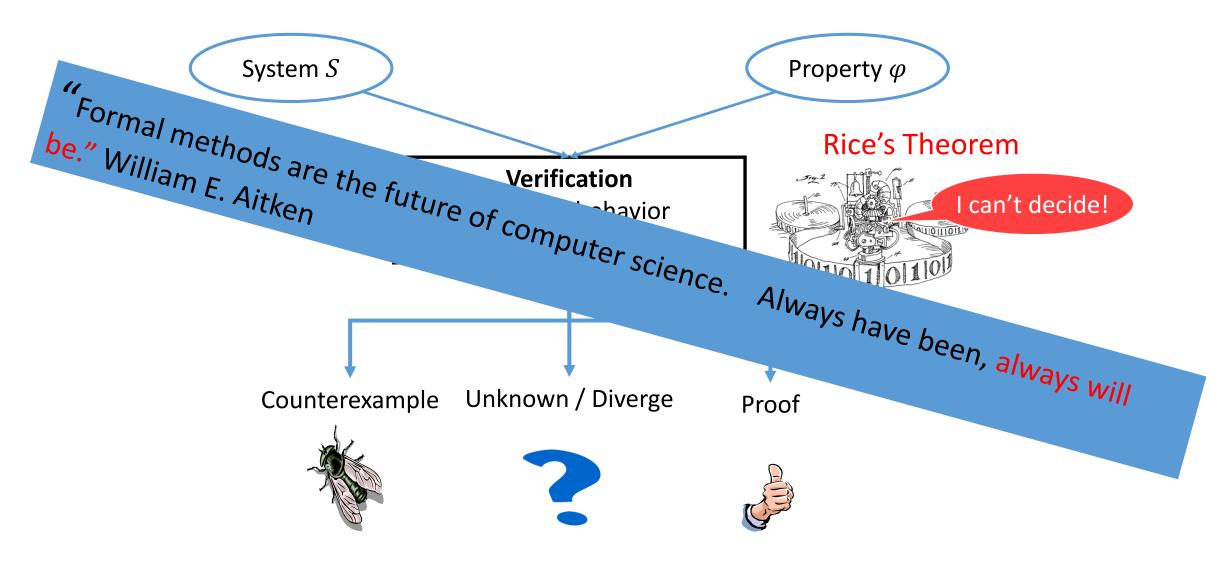
- Mathematical/logical <u>specification</u> of desired (correct) behavior
- Automated/interactive <u>checking</u> of implementation against specification



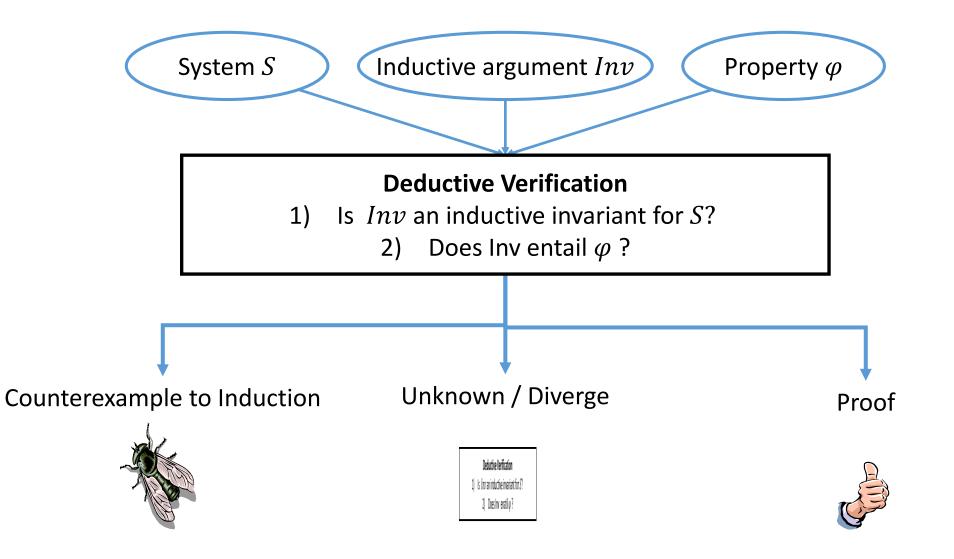
Correctness Properties

- Memory safety
- No buffer overruns
- Functional correctness
- Termination
- Minimize side-channel leaks
- Cryptographic security
- •

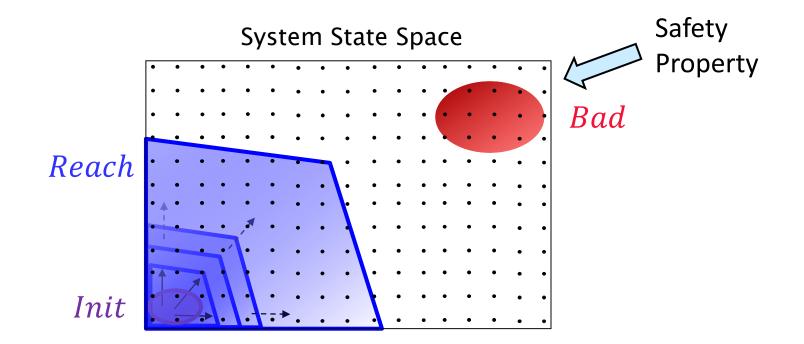
Automatic verification of infinite-state systems



Deductive verification

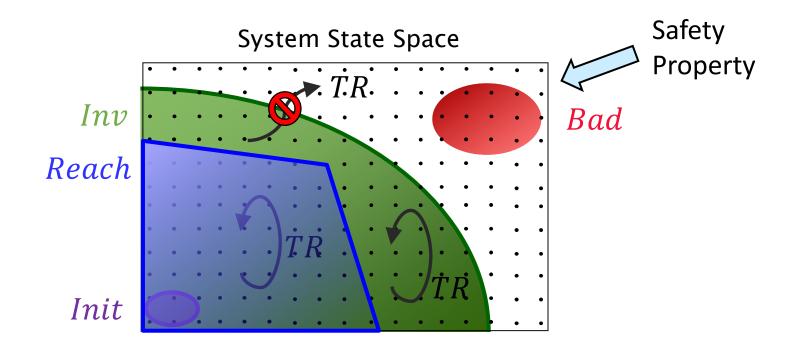


Inductive invariants



System S is safe if all the reachable states satisfy the property $\varphi = \neg Bad$

Inductive invariants



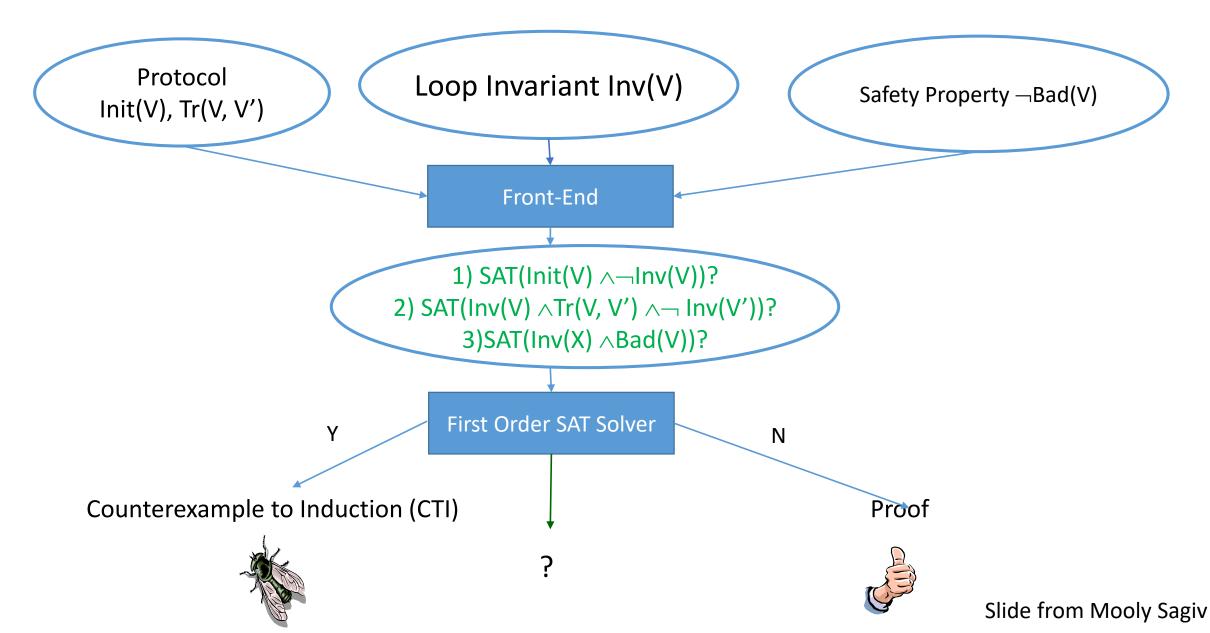
System *S* is **safe** if all the reachable states satisfy the property $\varphi = \neg Bad$ System *S* is safe iff there exists an **inductive invariant** Inv:

Init \subseteq *Inv* (Initiation) if $\sigma \in$ *Inv* and $\sigma \rightarrow \sigma'$ then $\sigma' \in$ *Inv* (Consecution) *Inv* \cap *Bad* = \emptyset (Safety)

Logic-based deductive verification

- Represent Init, \rightarrow , Bad, Inv by logical formulas
 - Formula ⇔ Set of states
- Automated solvers for logical satisfiability made huge progress
 - Propositional logic (SAT) industrial impact for hardware verification
 - First-order theorem provers
 - Satisfiability modulo theories (SMT) major trend in software verification

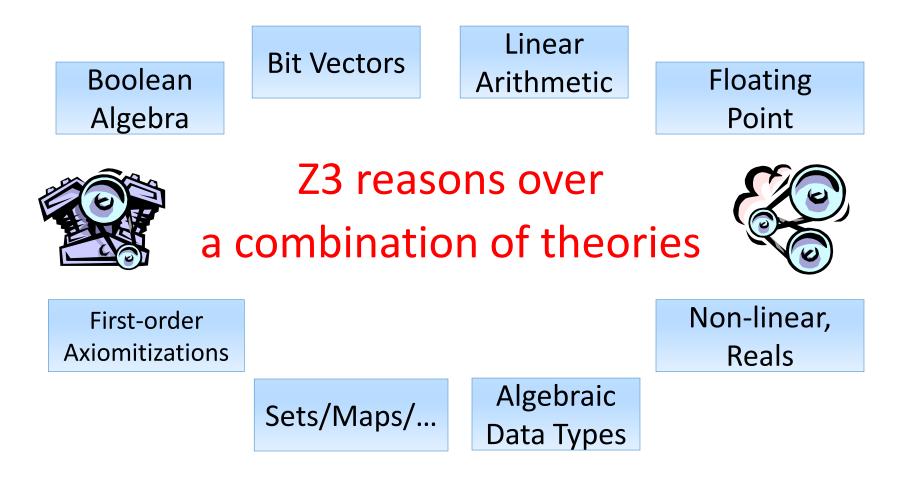
Deductive verification by reductions to First Order Logic





Automated Theorem Prover

Open Source (MIT License) https://github.com/z3prover/z3 https://rise4fun.com/Z3/tutorial Leonardo de Moura, Nikolaj Bjorner, Christoph Wintersteiger, ...

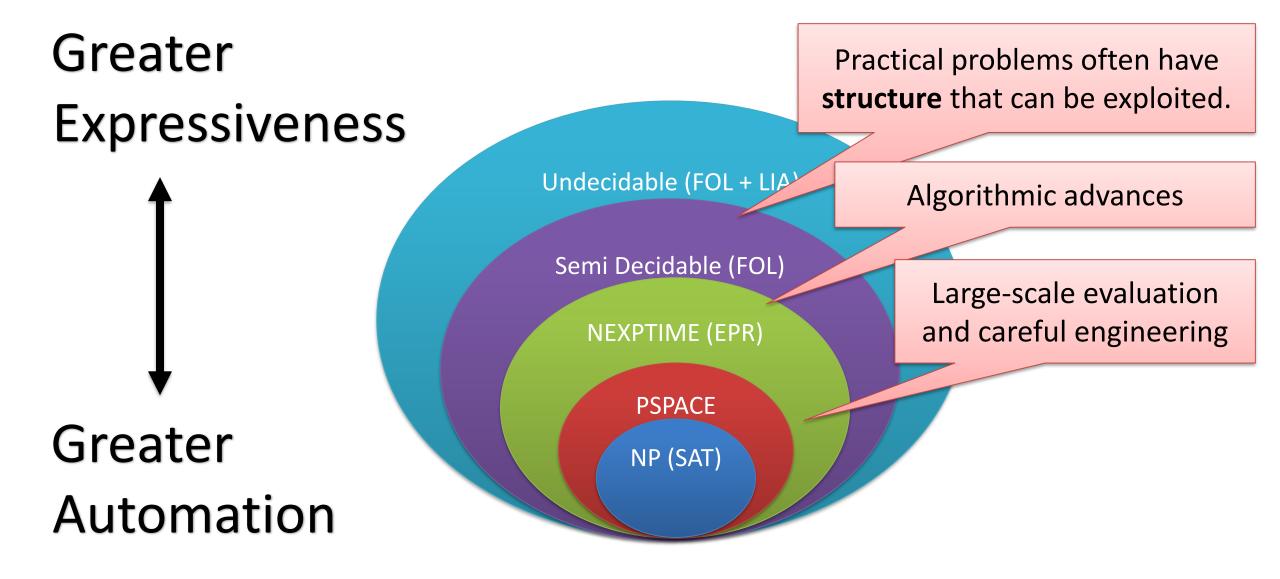


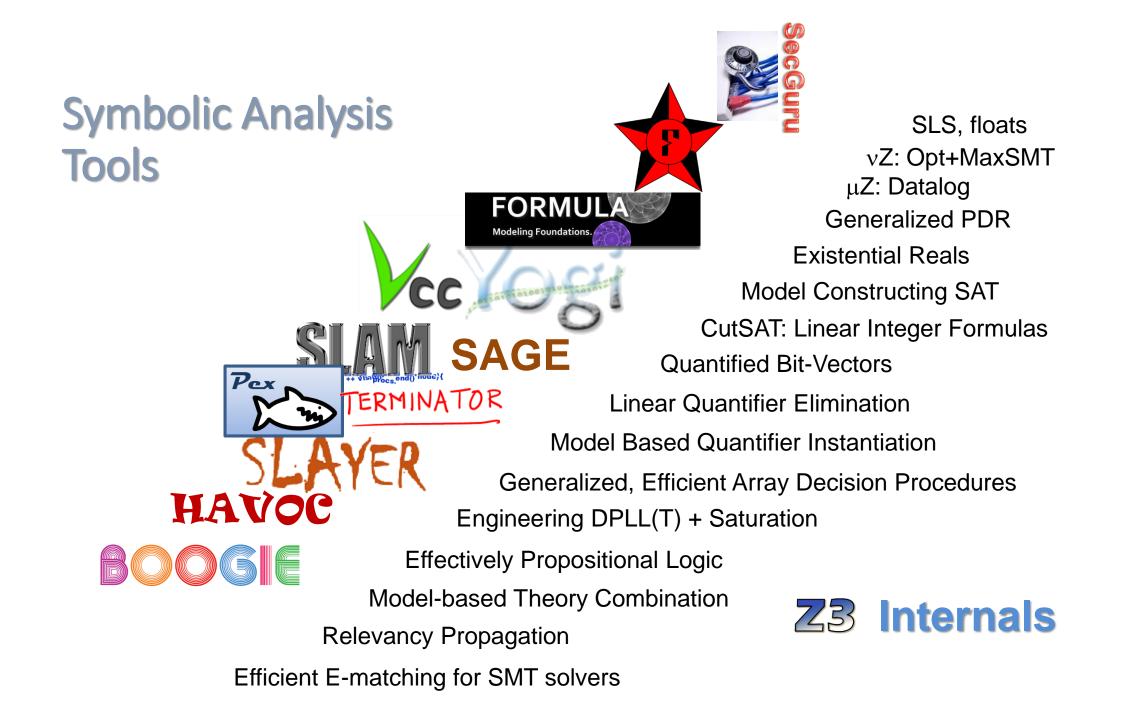
Reduction to Logic

```
int Puzzle(int x)
{
    int res = x;
    res = res + (res << 10);
    res = res ^ (res >> 6);
    if (x > 0 && res == x + 1)
        throw new Exception("bug");
    return res;
}
```



Logic/Complexity Classes





Formal Methods: Substantial Progress

Better Tools

Application to Real Systems

- Automated + Interactive Theorem Provers
- Model Checking
- Program Analysis

- **<u>Static Driver Verifier</u>** (Windows drivers)
- <u>http://compcert.inria.fr/</u> (C compiler)
- <u>https://sel4.systems/</u> (OS)

From Spec to Spec+Check

. . .

Open Source: Times have changed!

"We will move to a Chromium-compatible web platform for Microsoft Edge on the desktop" <u>https://blogs.windows.com/</u>

• Microsoft actively contributes to and use open source

• The tools presented in this talk are open source, or have open source equivalents

20 Years at Microsoft

From EULA to SLA From Bugs and Bounties to Cyberweapons From Spec to Spec+Check From Closed to Open

Formal Methods and Tools



High-level Specification (TLA+)

Correctness of Cryptography and Protocols (F*, Ivy, P#)

Bug Finding and Verification for C/C++ (SAGE, Corral)

> Network Verification (SecGuru)

thinking programming testing verifying

Formal Methods and Tools



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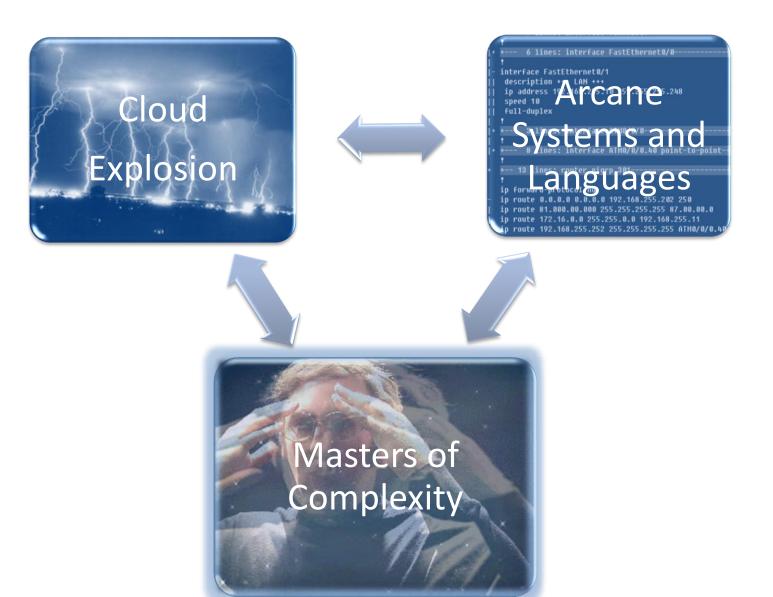
> Network Verification (SecGuru)

thinking programming testing verifying



Nikolaj Bjørner, Karthick Jayaraman

A Cloud run by Masters of Complexity



A Cloud Harnessed by Logic/SE



Network Policies: Complexity, Challenge and Opportunity

Several devices, vendors, formats

- Net filters
- Firewalls
- Routers

Challenge in the field

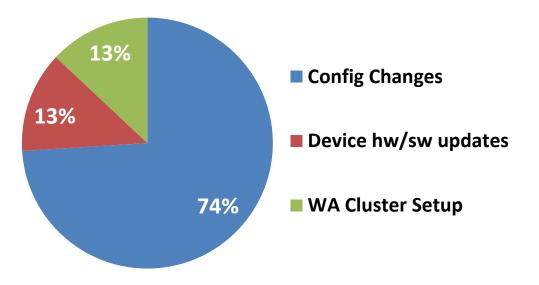
- Do devices enforce policy?
- Ripple effect of policy changes

Arcane

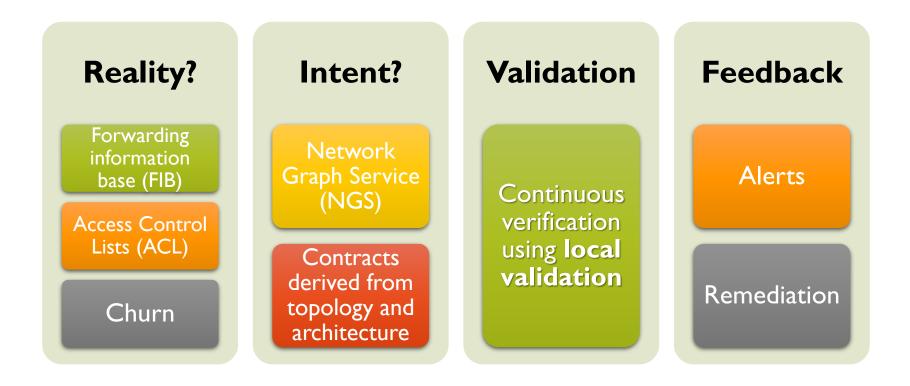
- Low-level configuration files
- Mostly manual effort
- Kept working by *"Masters of Complexity"*

Human errors > 4 x DOS attacks

Human Errors by Activity



Intent = Reality?



Access Control

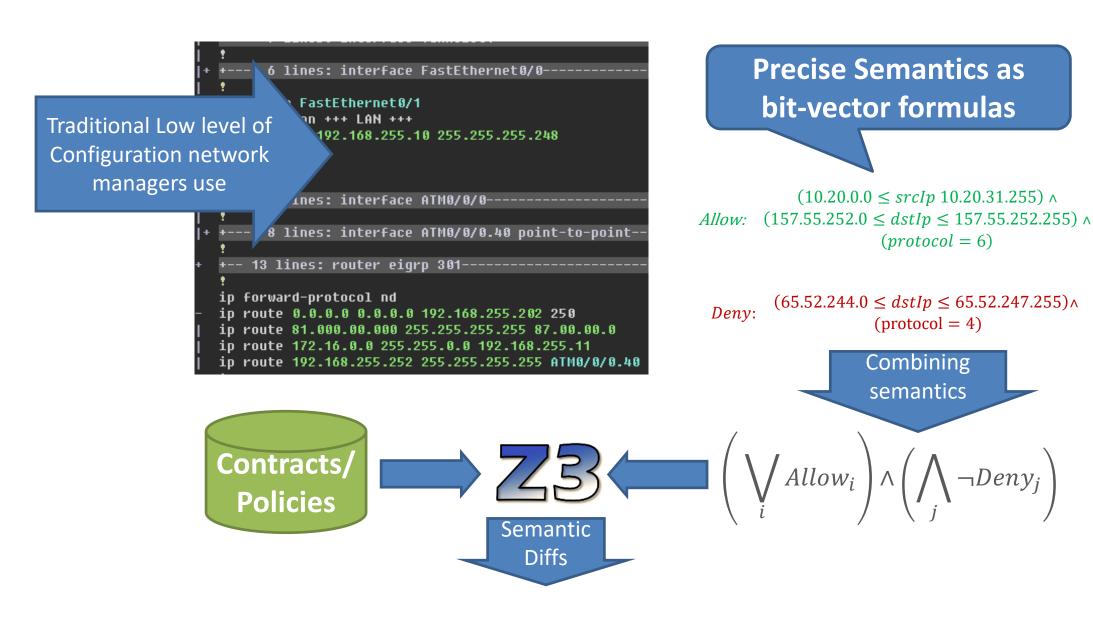
Contract:

DNS ports on DNS servers are **accessible** from tenant devices over both TCP and UDP.

Contract:

The SSH ports on management devices are **inaccessible** from tenant devices.

Policies as Logical Formulas



Beyond Z3: a *new* idea to go from one violation to all violations



srcIp = 10.20.0.0/16, 10.22.0.0/16dstIp = 157.55.252.000/24, 157.56.252.000/24port = 80,443

Representing solutions

- $-2 * 2^{16} * 2 * 2^8 * 2 = 2^{27}$ single solutions, or
- 8 products of contiguous ranges, or
- A single product of ranges

SecGuru contains optimized algorithm for turning single solutions into all (product of ranges)

SecGuru in WANetmon

Cluster dc/dm/cluster/dm1prdstr08

Network ACL Validation Alerts for the cluster

40,000 ACL checks per month Each check 50-200ms 20 bugs/month (mostly for build-out)

This check validates the correctness of all the network ACLs in the devices in the cluster

	Devic	e ¢		Timestamp		≎ Resu	lt o			
~	dm1-x3hl-	cis-15-01	Sat Sep 14 2013	3 11:27:41 GMT-0700 (Pacific	DI!L	т: г.:l				
	ACL Name	IP Add	ress Range	Error				ster/dm1prdstr01		
	mgmt-only	10.143	.197.208/28	Partially b				of all the network ACLs in the devices in the	cluste	r
	mgmt-only	10.143	.197.224/27	Partially	This clice	Device 0		Timestamp	0	Result 0
	mgmt-only	10.143	.198.0/26	Partially blocked		- 1-03	ep	p 14 2013 11:27:41 GMT-0700 (Pacific Dayligh p 14 2013 11:27:41 GMT-0700 (Pacific Dayligh	t Time)	Success
	mgmt-only	10.143	.198.64/27	Partially blocked		dm1-x3hl-cis		o 14 2013 09:18:00 GMT-0700 (Pacific Dayligh 14 2013 11:27:41 GMT-0700 (Pacific Dayligh o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh	t Time)	Success
	mgmt-only	10.143	.198.96/28	Partially blocked	∧ ∨ ∧ ∨		Sat Sep	p 14 2013 11:27:41 GMT-0700 (Pacific Dayligh p 14 2013 11:27:41 GMT-0700 (Pacific Dayligh	t Time)	Success
	ssh-only	10.143	.197.208/28	Blocked	~ V	dm1-x3hl-cis-1-11	Sat Sep	o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh	t Time)	Success
	ssh-only	10.143	.197.224/27	Blocked 3 11:27:41 GMT-0700 (Pacifi		dm1-x3hl-cis-1-13	Sat Sep	o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh	t Time)	Success
^				3 11:27:41 GMT-0700 (Pacifie 3 11:27:41 GMT-0700 (Pacifie		dm1-x3hl-cis-1-15	Sat Sep	o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh o 14 2013 09:18:00 GMT-0700 (Pacific Dayligh o 14 2013 11:27:41 GMT-0700 (Pacific Dayligh	t Time)	Success

Self-contained Windows Firewall Checker

GitHub, Inc. [US] https://github.com/Z3Prover/firewallchecker

Two minimal tab-separated example firewall rule files are as follows (see Examples directory):

Firewall 1:

Name Enabled Action Local Port Remote Address Remote Port Protocol Foo1 Allow 100 10.3.141.0 100 UDP Yes Bar1 Yes Allow 200 10.3.141.0 200 TCP

Firewall 2:

Name	Enabled	Action	Local P	ort	Remote	Address	Remote Port	Protocol
Foo2	Yes	Allow	100	10.3.14	1.0	100	UDP	
Bar2	Yes	Allow	200	10.3.14	1.1	200	TCP	

This generates the following output from FirewallEquivalenceCheckerCmd.exe :

Microsoft.FirewallEquivalenceCheckerCmd.exe --firewall1 .\firewall1.txt --firewall2 .\firewall2.txt
Parsing first firewall...
Parsing second firewall...
Running equivalence check...
Firewalls are NOT equivalent.

Inconsistently-handled packets:

-	 	 																	-
I	PIC		Sr	с	Ad	dre	ss	I	Src	Por	t	Dest	Port	I	Protocol	L	Allowed	Ву	I
-	 	 																	-
ī	0		1	0	2	1 4 1	0	Т		20			200	1	тср	1	E i a	-+	r.

I	ΤI	10.3.141.1	200	200	TCP	Second
1	1	10.3.141.1	200	200	TCD	Second
	0	10.3.141.0	200	200	TCP	First

Firewall rules matching inconsistently-handled packets:

		-					 					-						 	 	 	 -	 	 	 -	 	 	
I	PIC)	Fi	rew	al]	L	Ac	ti	.or	n	L	R	ul	e	Na	me	9										I
							 					-						 	 	 	 -	 	 	 -	 -	 	
T	e)		Fi	rst		Α	11	.ov	V	L	B	ar	1													I



By Andrew Helwer, Azure

https://github.com/Z3Prover/FirewallChecker

Formal Methods and Tools



High-level Specification (TLA+)

Correctness of Cryptography and Protocols (F*, Ivy, P#)

Bug Finding and Verification for C/C++ (SAGE, Corral)

> Network Verification (SecGuru)

thinking programming testing verifying

Microsoft Security Risk Detection

https://www.microsoft.com/en-us/security-risk-detection/

Security Basics

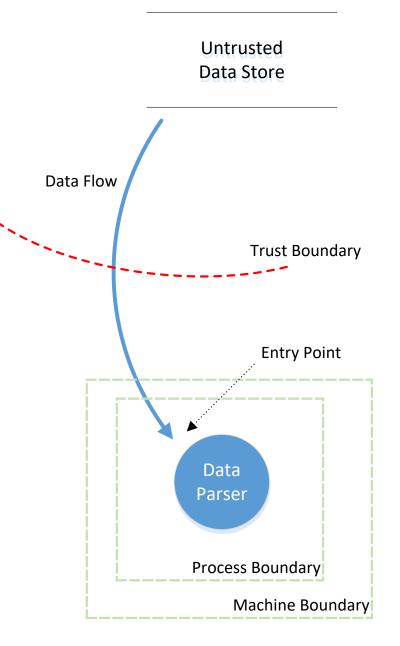
An important step in software security is identifying high-risk targets...

Dataflow, movement of bits between two network entities

Entry Point, where external data enters an entity

Trust Boundary, a dividing line across which data flows

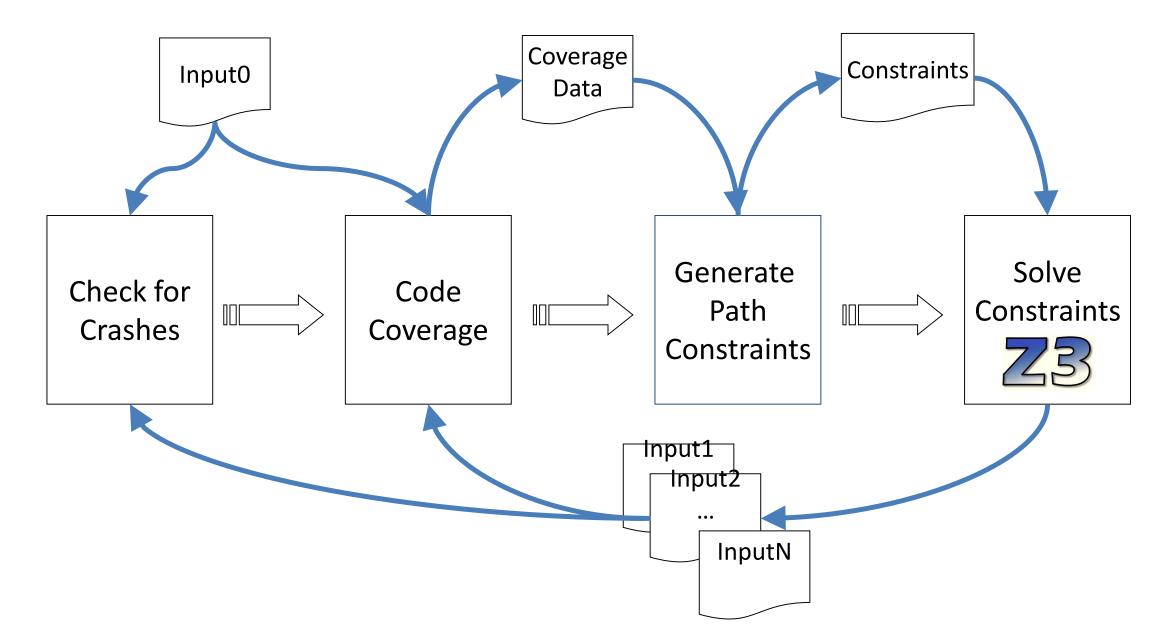
Security Bug, any regular code or design bug



White Box Input Fuzzing

```
void top(char input[4])
                                       input = "bodd"
                                                                        Gen 2 Gen 3 Gen 4
{
                                                              Gen 1
                                 Path constraint:
   int cnt = 0;
   if (input[0] == 'b') cnt++; I_0!='b' \rightarrow I_0='b'
   if (input[1] == 'a') cnt++; I_1!='a' \rightarrow I_1='a'
   if (input[2] == 'd') cnt++; I_2!='d' \rightarrow I_2='d'
                                                                                             ....
   if (input[3] == '!') cnt++; I<sub>3</sub>!='!' →
                                                                                            bad!
   if (cnt >= 4) crash();
                                 Theorem prover
                                                  723 good
                                 10+ years of
}
                                 sustained investment
```

White Box Fuzzing (SAGE)



Security Risk Detection and the SDL

SAGE used internally at Microsoft to meet SDL verification requirements

SDL Process: Verification

This phase involves a comprehensive effort to ensure that the code meets the security and privacy tenets established in the previous phases.

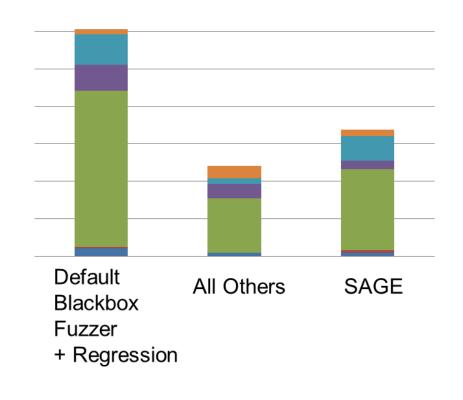
Training	Requirements	Design		Verification	Release	Response
	2. Establish Security Requirements	5. Establish Design Requirements	8. Use Approved Tools	11. Perform Dynamic Analysis	14. Create an Incident Response Plan	
 Core Security Training 	3. Create Quality Gates/Bug Bars	6. Perform Attack Surface Analysis/ Reduction	9. Deprecate Unsafe Functions	12. Perform Fuzz Testing	15. Conduct Final Security Review	Execute Incident Response Plan
	4. Perform Security and Privacy Risk Assessments	7. Use Threat Modeling	10. Perform Static Analysis	13. Conduct Attack Surface Review	16. Certify Release and Archive	

White Box Fuzzing (SAGE) Results

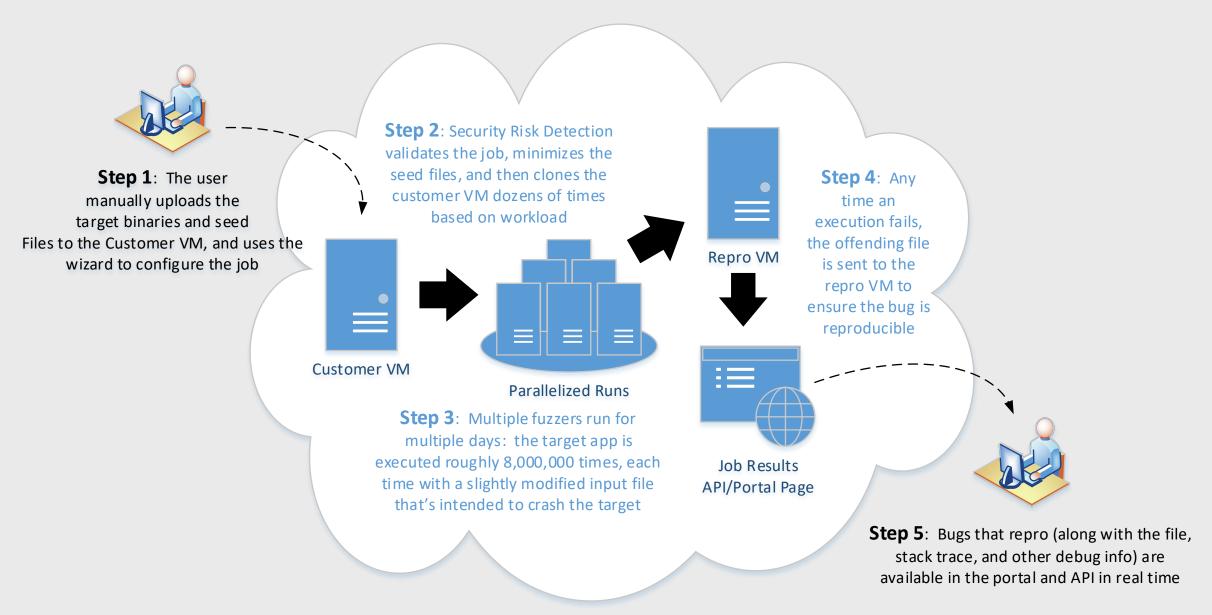
Since 2007: many new security bugs found

- Apps: decoders, media players, document processors, ...
- Bugs: Write A/Vs, Read A/Vs, Crashes, ...
- Many triaged as "security critical, severity 1, priority 1"
- 100s of apps, 100s of bugs
 - Bug fixes shipped quietly (no MSRCs) to 1 Billion+ PCs
 - Millions of dollars saved (for Microsoft and the world)
- "Practical Verification"
 - <5 security bulletins in SAGE-cleaned parsers since 2009

How fuzzing bugs found (2006-2009) :



Job – Cloud Workflow



More on Dynamic Symbolic Execution

For real programs, compiled through LLVM

<u>https://klee.github.io/</u>

For a small subset of Python, using Z3

• https://github.com/thomasjball/PyExZ3

Hot off the press

REST-ler: Automatic Intelligent REST API Fuzzing

- Vaggelis Atlidakis, Patrice Godefroid, Marina Polishchuk
- <u>https://arxiv.org/abs/1806.09739</u>

Formal Methods and Tools



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Correctness of <u>Cryptography</u> and Protocols (<u>F*</u>, Ivy, P#)

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> Network Verification (SecGuru)

thinking

programming

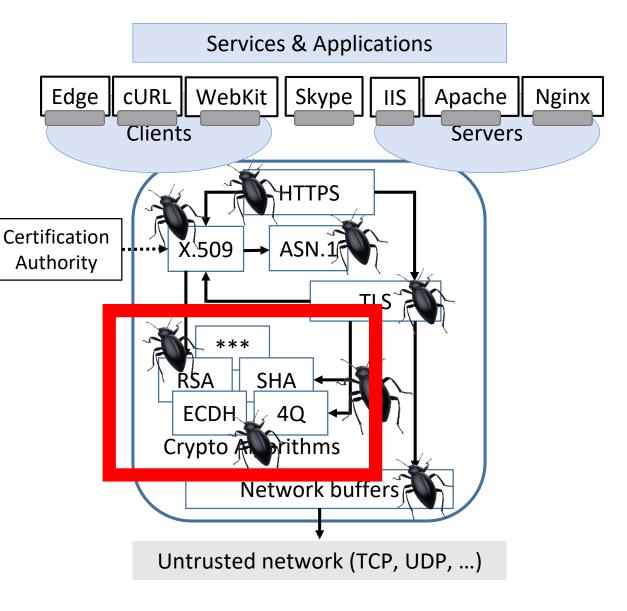
testing

verifying

MSR's Project Everest

- **Goal**: verified HTTPS replacement **Challenges**:
- scalability of verification
- performance
- usable tool chain





https://project-everest.github.io/

Subgoal: Verified low-level crypto

Efficient crypto requires customizations

- Poly1305: Uses the prime field with $p = 2^{130} 5$
 - Need 130 bits to represent a number
 - Efficient implementations require custom bignum libraries to delay carries
 - On X86: use 5 32-bit words, but using only **26 bits in each word**
 - On X64: use 3 64-bit words, but using only **44 bits in each word**
- Curve25519: Uses the prime field with $p = 2^{255} 19$
 - On X64: use 5 64-bit words, but using only **51 bits per word**
- OpenSSL has <u>12 unverified bignum</u> libraries optimized for each case

Everest subgoal: generic, efficient bignum libraries

A generic bignum library

Bignum code can be **shared** between Curve25519, Ed25519 and Poly1305, which all use different fields

Only modulo is specific to the field (optimized)

Consequently:

- write once
- verify once
- extract three times

module Hacl.Bignum.Curve25519.Constants
let prime = pow₂ 255 - 19
let word_size = 64
let len = 5
let limb_size = 51

```
module Hacl.Bignum.Poly1305.Constants
let prime = pow2 130 - 5
let word_size = 64
let len = 3
let limb_size = 44
```

Prove correct in F*, extract to efficient C

Mathematical spec in F*

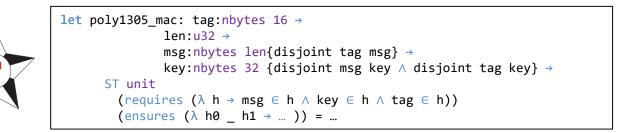
poly1305_mac: (1) computes a
polynomial in GF(2¹³⁰-5),
(2) stores the result in tag,
(3) does not modify anything else

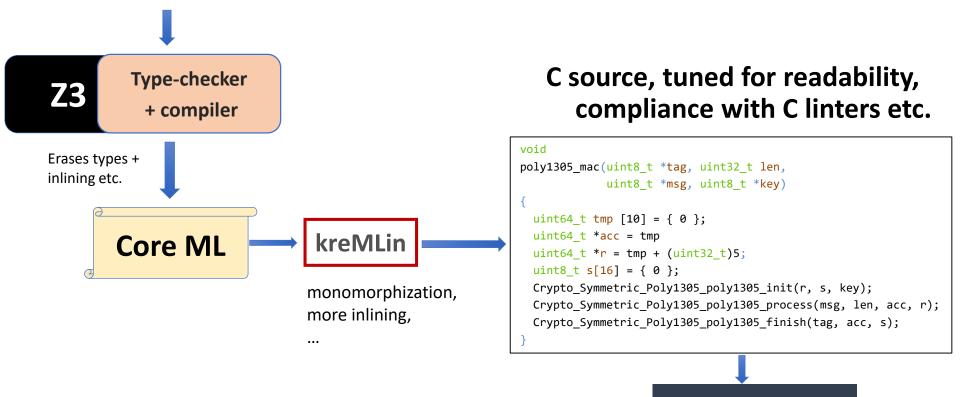
void
poly1305_mac(uint8_t *tag, uint32_t len, uint8_t *msg, uint8_t *key)
{
 uint64_t tmp [10] = { 0 };
 uint64_t *acc = tmp
 uint64_t *r = tmp + (uint32_t)5;
 uint8_t s[16] = { 0 };
 Crypto_Symmetric_Poly1305_poly1305_init(r, s, key);
 Crypto_Symmetric_Poly1305_poly1305_process(msg, len, acc, r);
 Crypto_Symmetric_Poly1305_poly1305_finish(tag, acc, s);
}

Efficient C implementation Verification imposes no runtime performance overhead

Sample code Poly1305 MAC

F* source: core-ML with dependent types and effects





clang, gcc, msvc, CompCert, •••

Performance of Everest's High Assurance Crypto Library (HACL*)

Algorithm	Spec	Code+Proofs	C Code	Verification		
	(F [*] loc)	(Low [*] loc)	(C loc)	(s)		
Salsa20	70	651	372	280		
Chacha20	70	691	243	336		
Chacha20-Vec	100	1656	355	614		
SHA-256	96	622	313	798		
SHA-512	120	737	357	1565		
HMAC	38		(
Bignum-lib	-	Verification e		U	π	
Poly1305	45	multiplicatio	ns, witho	ut fear of		
X25519-lib	-	getting it wro	ong			
Curve25519	73	1901	798	246		
Ed25519	148	7219	2479	2118		
AEAD	41	309	100	606		
SecretBox	-	171	132	62		
Box	-	188	270	43		
Total	801	22,926	7,225	9127		

Table 1: HACL* code size and verification times

- Several complete TLS ciphersuites
- Verification can scale up!

			r
Algorithm	HACL*	OpenSSL	
SHA-256	13.43	16.11	-
SHA-512	8.09	10.34	
Salsa20	6.26	-	
ChaCha20	6.37 (ref)	7.84	
	2.87 (vec)		
Poly1305	2.19	2.16	
Curve25519	154,580	358,764	cycles/ECDH
Ed25519 sign	63.80	-	
Ed25519 verify	57.42	-	
AEAD	8.56 (ref)	8.55	-
	5.05 (vec)		

• With performance as good as or better than hand-written C

https://blog.mozilla.org/security/2017/09/13/ verified-cryptography-firefox-57/

> "Mozilla has partnered with <u>INRIA</u> and <u>Project</u> <u>Everest</u> (Microsoft Research, CMU, INRIA) to bring components from their formally verified <u>HACL*</u> <u>cryptographic library</u> into <u>NSS</u>, the security engine which powers Firefox.

Project Everest: Open Source

- <u>https://www.github.com/FStarLang/FStar</u>
- <u>https://www.github.com/FStarLang/kremlin</u>
- <u>https://www.github.com/mitls/mitls-fstar</u>
- https://www.github.com/mitls/hacl-star
- <u>https://www.github.com/project-everest/vale</u>

Formal Methods and Tools



High-level Specification
(TLA+)thinkingCorrectness of Cryptography and Protocols
(F*, Ivy, P#)program

Bug Finding and Verification for C/C++ (SAGE, Corral)

> Network Verification (SecGuru)

programming testing verifying

Engineers use TLA+ to prevent serious but subtle bugs from reaching production.

BY CHRIS NEWCOMBE, TIM RATH, FAN ZHANG, BOGDAN MUNTEANU MARC BROOKER, AND MICHAEL DEARDEUFF

How Amazon Web Services Uses Formal Methods

SINCE 2011, ENGINEERS at Amazon Web Services (AWS) have used formal specification and model checking to help solve difficult design problems in critical systems. Here, we describe our motivation and experience, what has worked well in our problem domain, and what has not. When discussing personal experience we refer to the authors by their initials.

At AWS we strive to build services that are simple for customers to use. External simplicity is built on a hidden substrate of complex distributed systems. Such complex internals are required to achieve high availability while running on cost-efficient infrastructure and cope with relentless business growth. As an example of this growth, in 2006, AWS launched S3, its Simple Storage Service. In the following six years, S3 grew to store one trillion objects.³ Less than a year later it had grown to two trillion objects and was regularly handling 1.1 million requests per second.⁴

Complexity increases the probability of human error in design, code, and operations. Errors in the core of the system could cause loss or corruption of data, or violate other interface contracts on which our customers depend. So, before launching a service, we need to reach extremely high confidence that the core of the system is correct. We have found the standard verification techniques in industry are necessary but not sufficient. We routinely use deep design reviews, code reviews, static code analysis, stress testing, and fault-injection testing but still find that subtle bugs can hide in complex concurrent fault-tolerant systems. One reason they do is that human intuition is poor at estimating the true probability of supposedly "extremely rare" combinations of events in systems operating at a scale of millions of requests per second.

» key insights

- Formal methods find bugs in system designs that cannot be found through any other technique we know of.
- Formal methods are surprisingly feasible for mainstream software development and give good return on investment.
- At Amazon, formal methods are routinely applied to the design of complex real-world software, including public cloud services.

TLA+ (Leslie Lamport)

- A language for high-level modelling of digital systems, especially concurrent and distributed systems
- Tools for checking the models (TLC)
- IDE for end-to-end experience (Toolbox)
- <u>https://github.com/tlaplus</u>

Chris Newcombe, AWS

- Formal methods find bugs in system designs that cannot be found through any other technique we know of
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Chris Newcombe, AWS

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"TLA+ is the most valuable thing that I've learned in my professional career. It has changed how I work, by giving me an immensely powerful tool to find subtle flaws in system designs. It has changed how I think, by giving me a framework for constructing new kinds of mental-models, by revealing the precise relationship between correctness properties and system designs, and by allowing me to move from *`plausible prose' to precise statements much earlier in* the software development process."

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Formal Methods and Tools



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