#### Intrusion Recovery using Selective Re-execution

#### Taesoo Kim, Xi Wang, **Nickolai Zeldovich**, M. Frans Kaashoek

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## Attackers routinely compromise system integrity

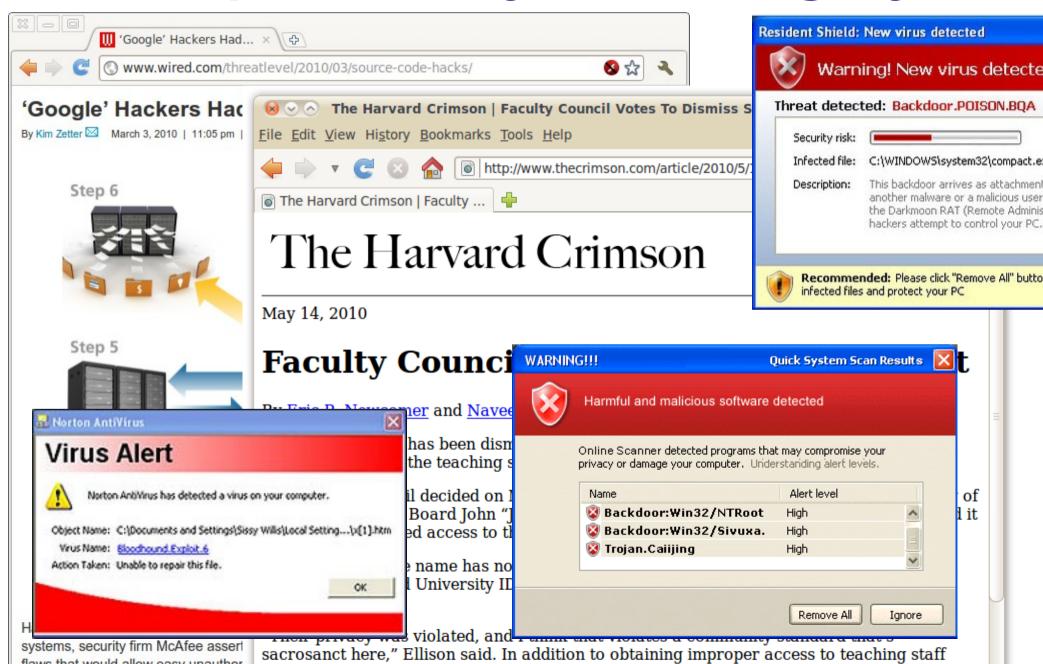


Hackers who breached Google and other companies in January targeted source-code management systems, security firm McAfee asserted Wednesday. They manipulated a little-known trove of security flows that would allow associate the intellectual property the system is meant to

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#### **Compromises inevitable**

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- Administrators mis-configure policies
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 Need both "proactive" security, and "reactive" recovery mechanisms

## Limited existing recovery tools

- Anti-virus tools
  - Only repair for predictable attacks
- Backup tools
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  - Only repair for predictable attacks
- Backup tools
  - Restoring from backup discards *all* changes
- Administrators spend days or weeks manually tracking down all effects of the attack
  - No guarantee if they found everything

# Challenge: disentangle changes by attacker and legitimate user

- Adversary could have modified many files directly
- Legitimate processes may have been affected
  - Users ran trojaned pdflatex or ls
  - SSH server read a modified /etc/passwd
- Those processes are now suspect as well

# Our approach: help users disentangle on one machine

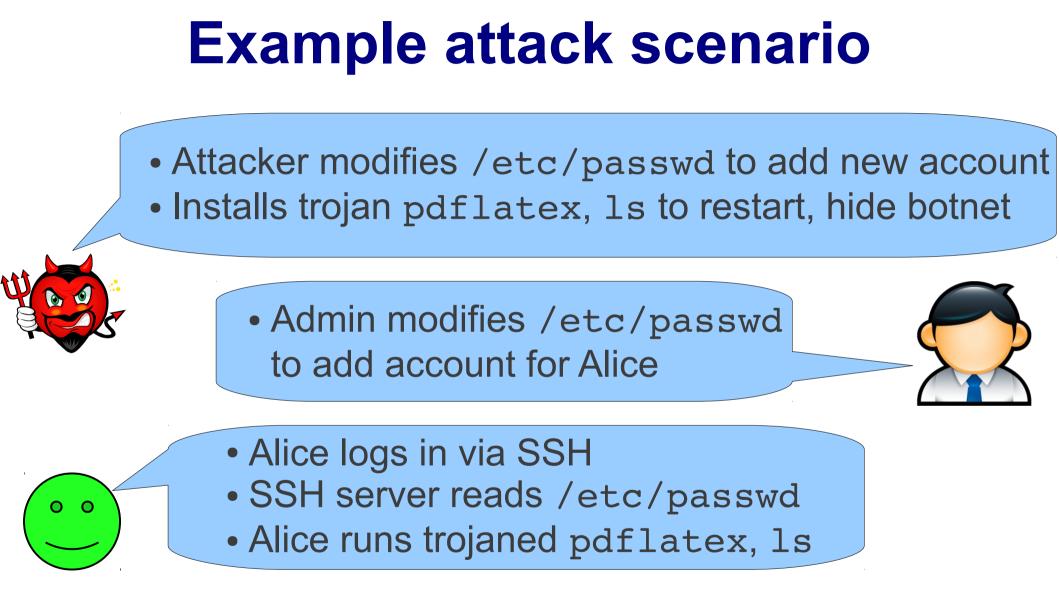
- Record history of all computations on machine
- After intrusion found, roll back affected objects
- Re-execute actions that were indirectly affected
- Minimize user input required to disentangle
  - User edited attacker's file with emacs
  - External effects outside of our control

### Contributions

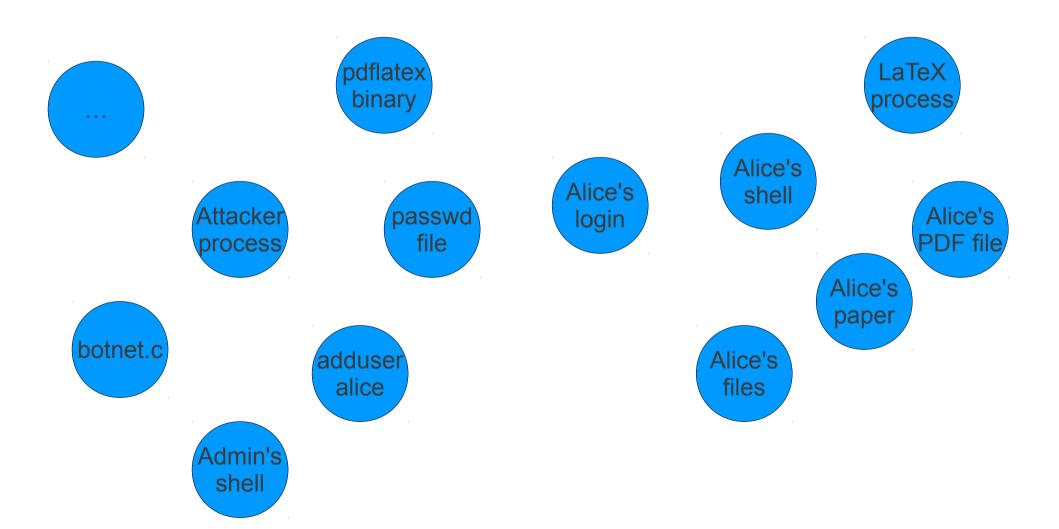
- New approach to system-wide intrusion recovery
  - Action history graph tracks computations and repairs
  - Techniques: re-execution, predicates, and refinement
- *Retro*: prototype recovery system for Linux
  - Recovers from 10 real-world and synthetic attacks
  - No user input required in most cases

### Contributions

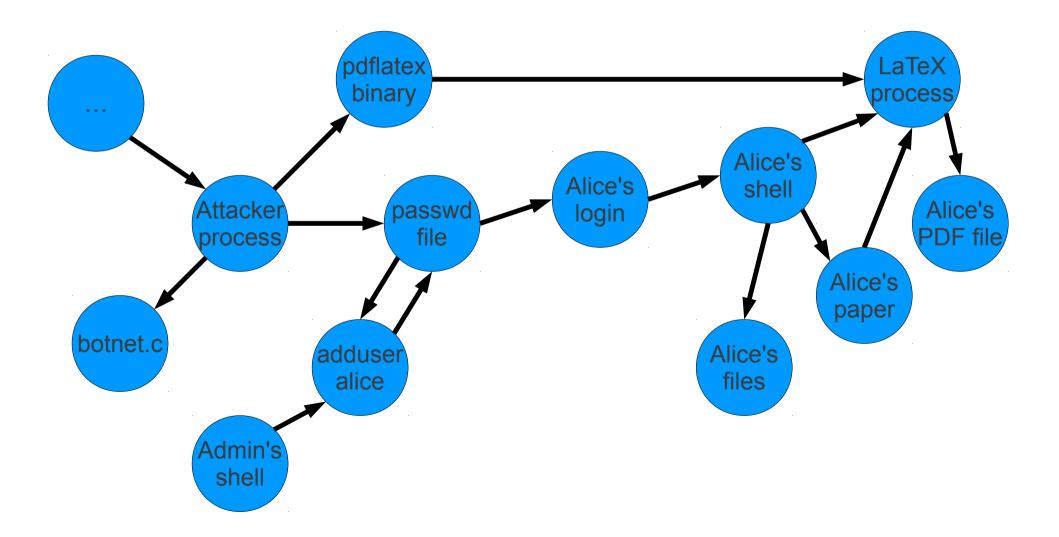
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  - Action history graph tracks computations and repairs
  - Techniques: re-execution, predicates, and refinement
- *Retro*: prototype recovery system for Linux
  - Recovers from 10 real-world and synthetic attacks
  - No user input required in most cases
- Instead of spending days on manual recovery, admin can use Retro to automatically recover, and ensure that *all* effects of attack are caught



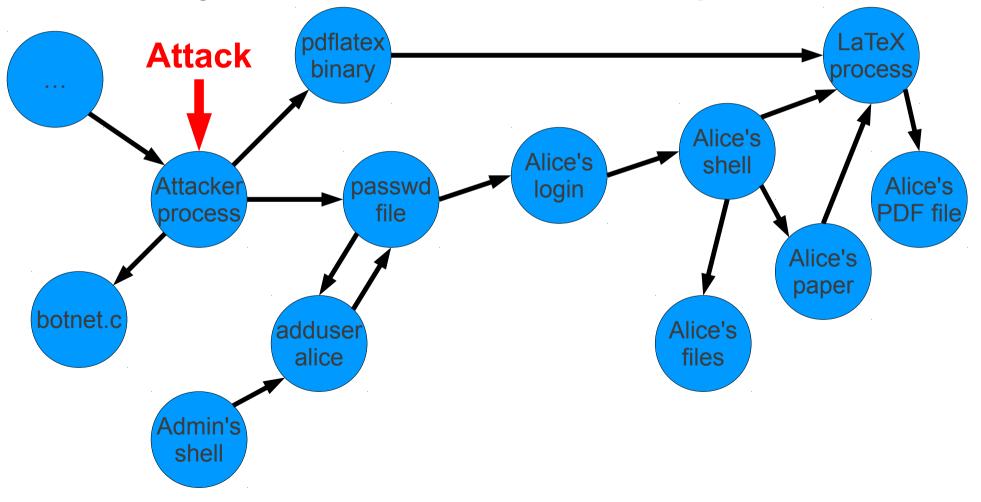
• Attacker not targeting Alice, wants to run botnet



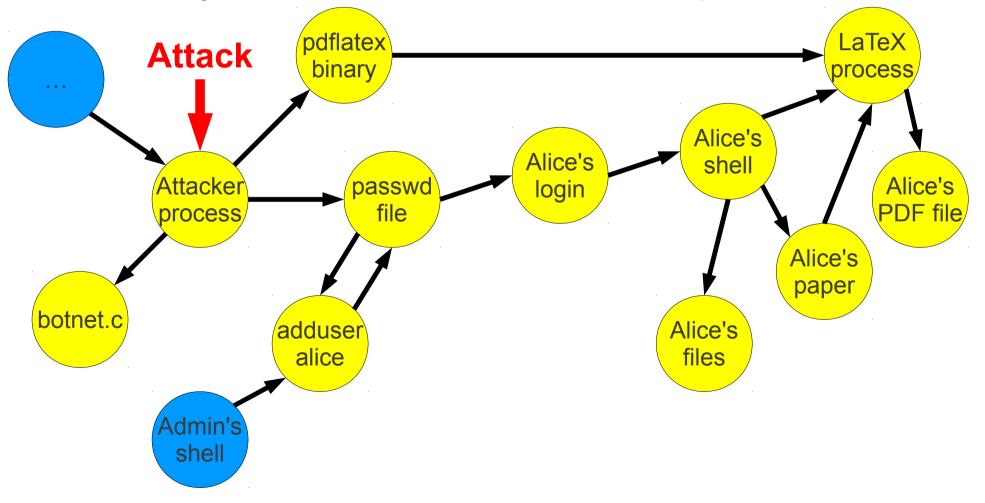
• Log all OS-level dependencies in system



• Given attack, track down all affected files, and restore just those files from backup

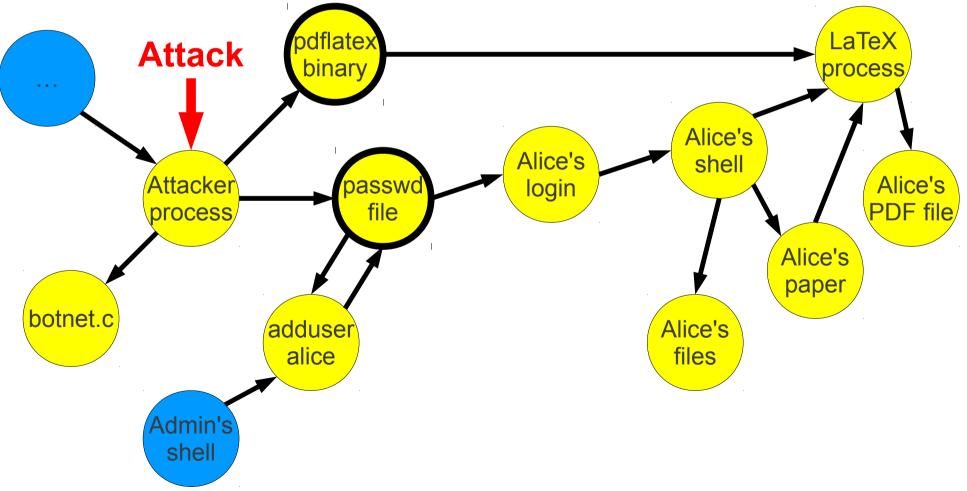


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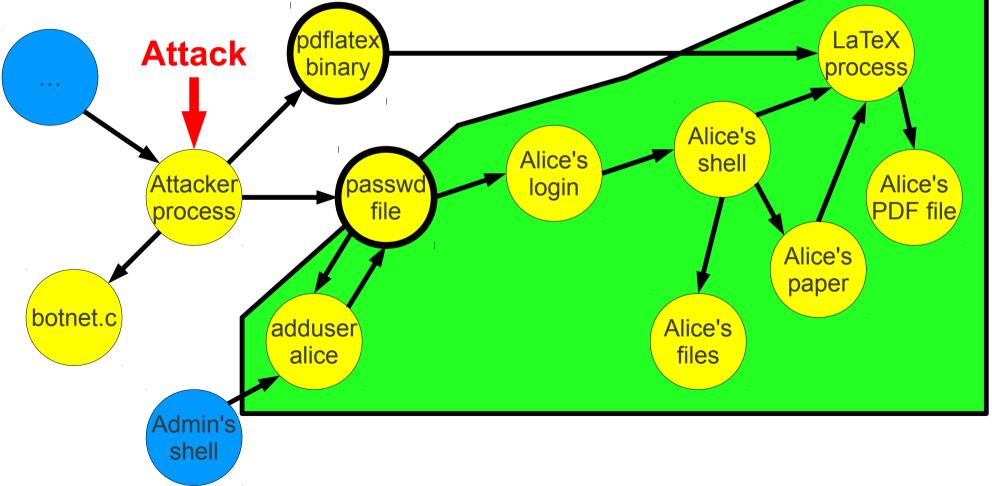
#### Problem with taint tracking: false positives

Taint tracking conservatively propagates
 everywhere through shared files

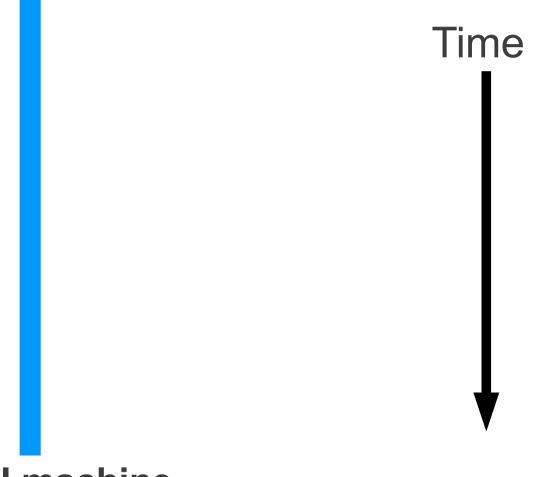


#### Problem with taint tracking: false positives Alice's account and files are lost!

 Taint tracking conservatively propagates everywhere through shared files

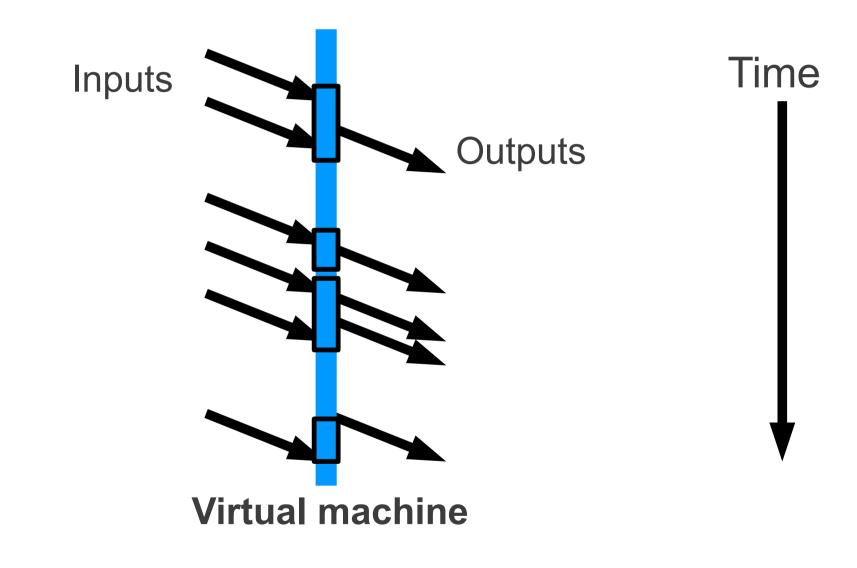


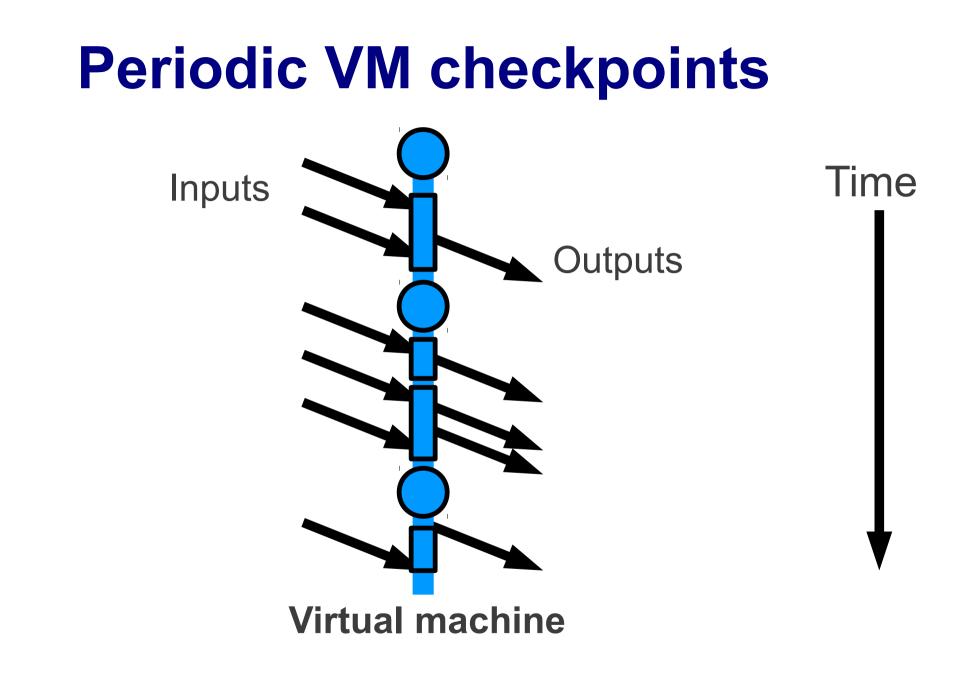
#### Strawman 2: VM

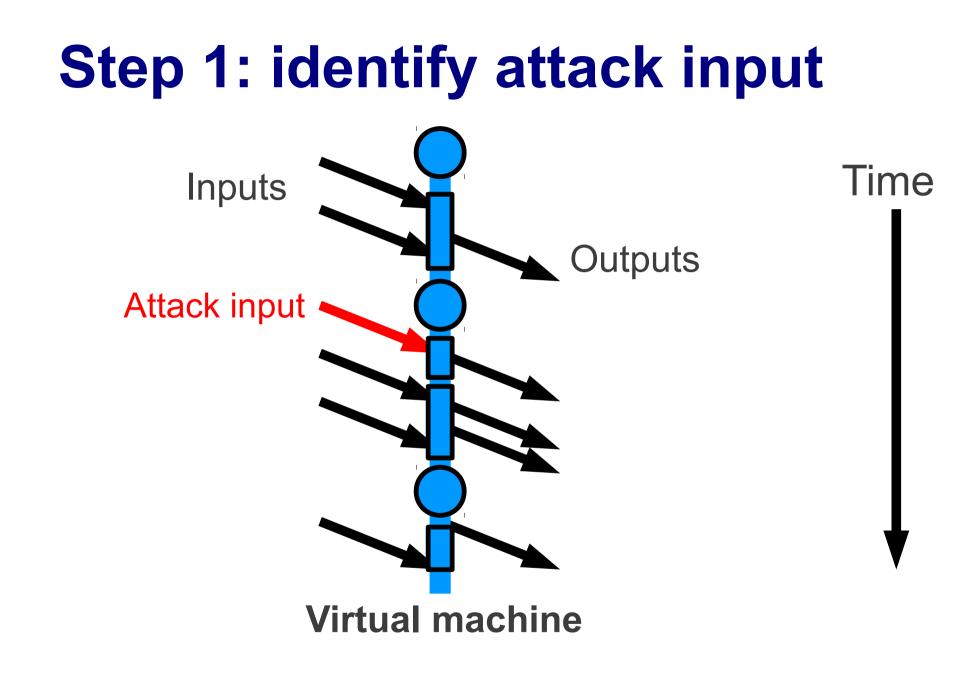


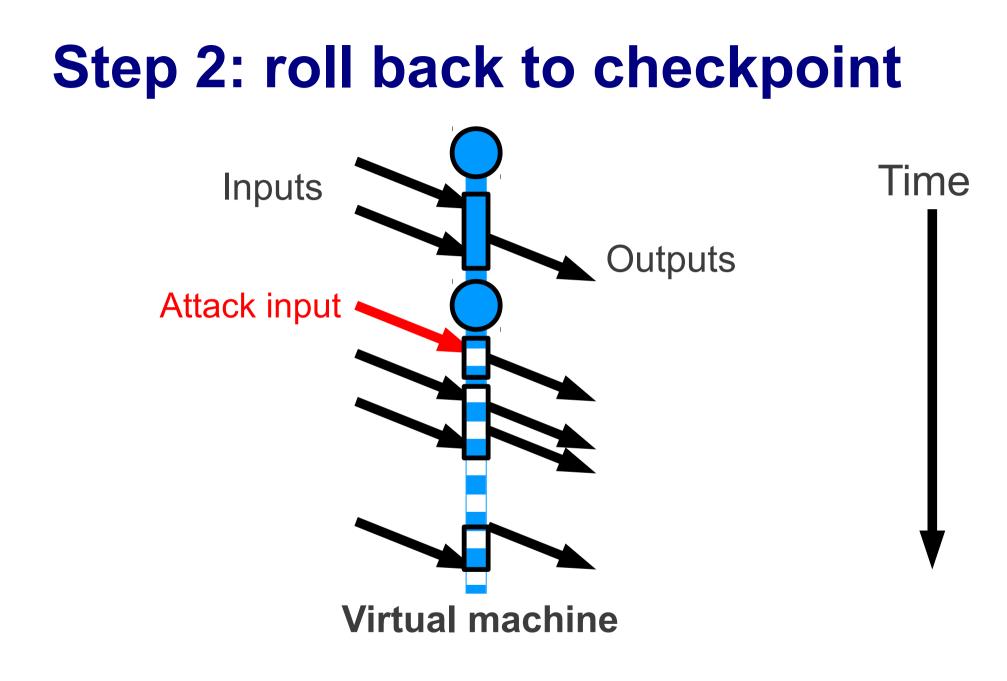
#### **Virtual machine**

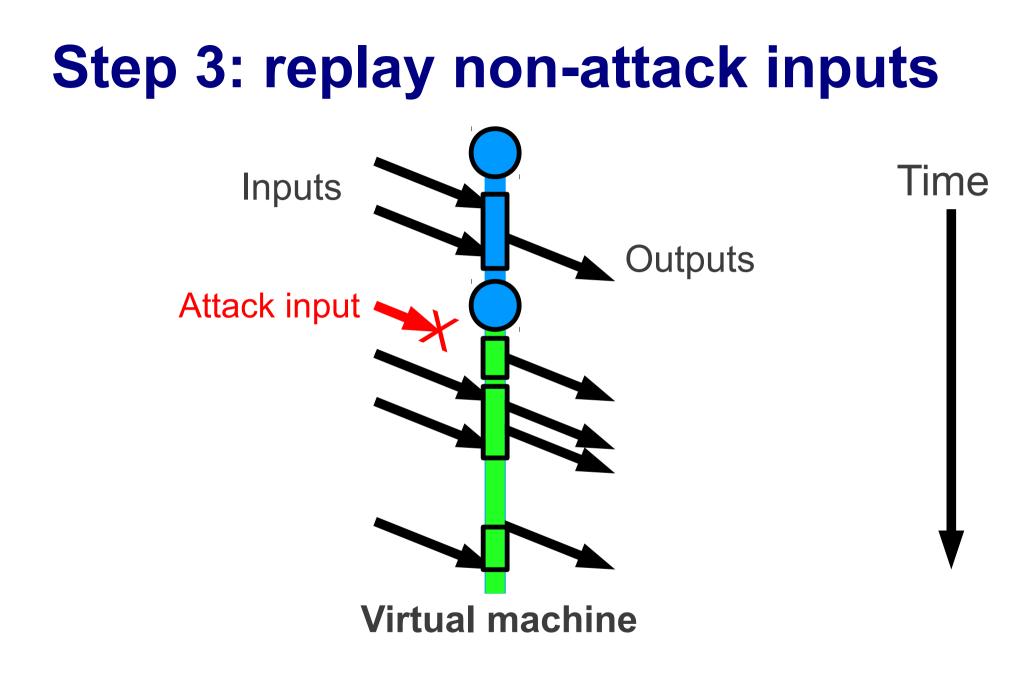
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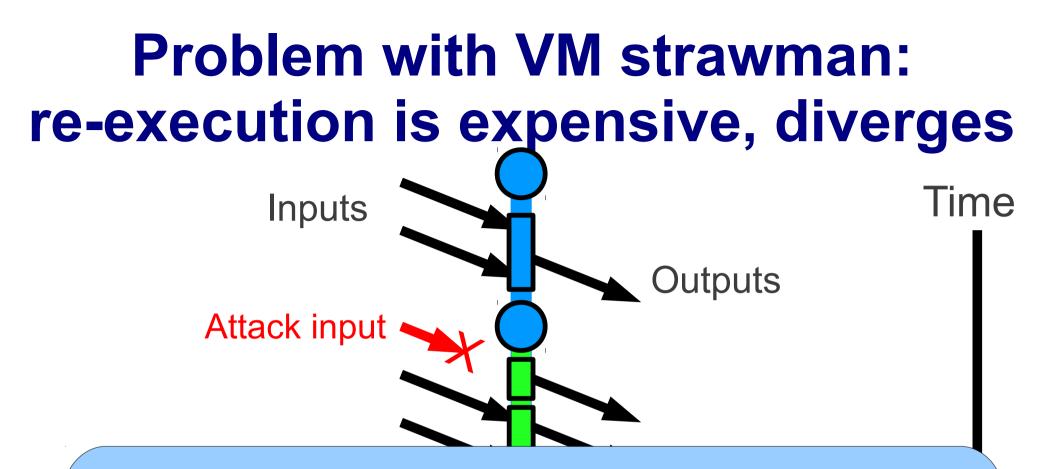








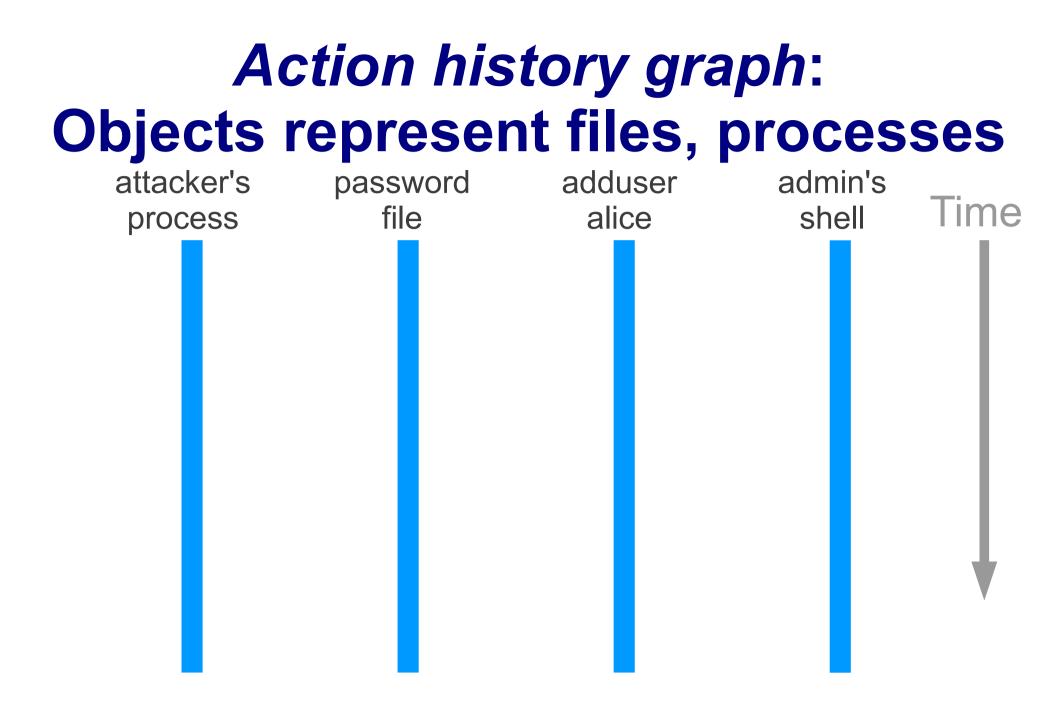




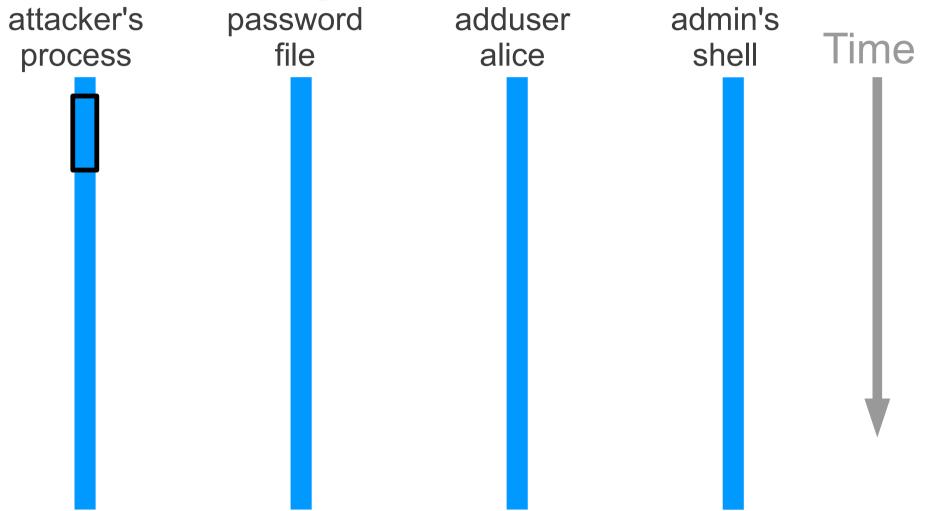
- May take one week to re-execute for a week-old attack
- Original VM inputs may be meaningless for new system
  - Non-determinism: new SSH crypto keys, inode #s, app state, ...
  - Can't do deterministic re-execution, since some inputs changed

# *Retro*'s approach: selective re-execution

- Record fine-grained action history graph
  - Includes system call arguments, function calls, ...
  - Assume tamper-proof kernel, storage
- Roll back objects directly affected by attack
  - Avoid the false positives of taint tracking
- *Re-execute* actions indirectly affected by attack
  - Avoid expense, non-determinism of whole-VM re-exec.

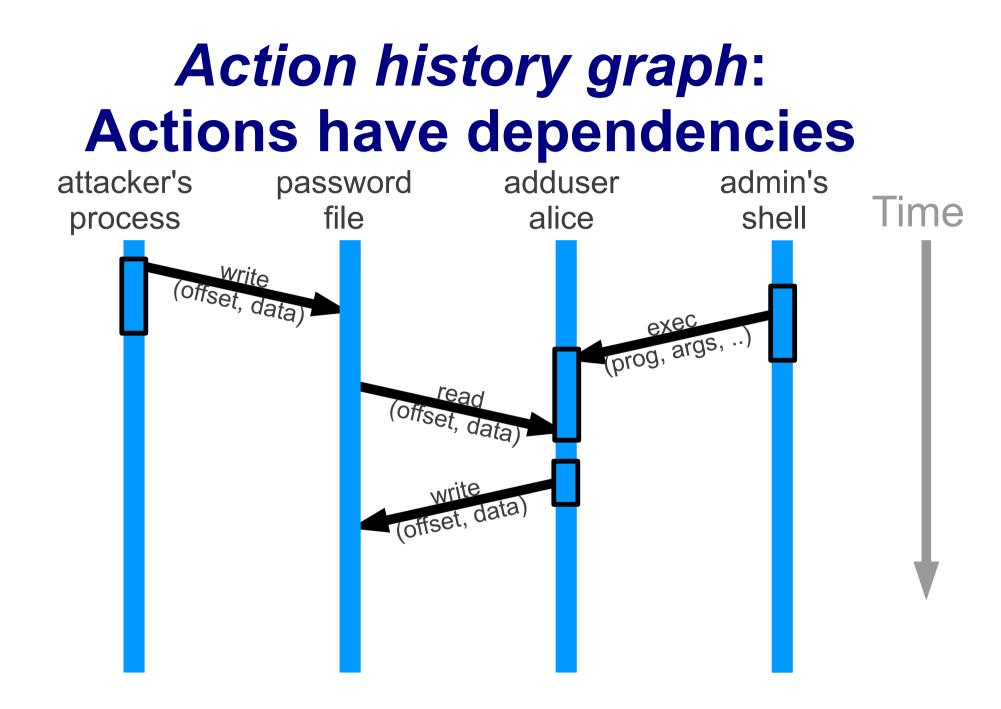


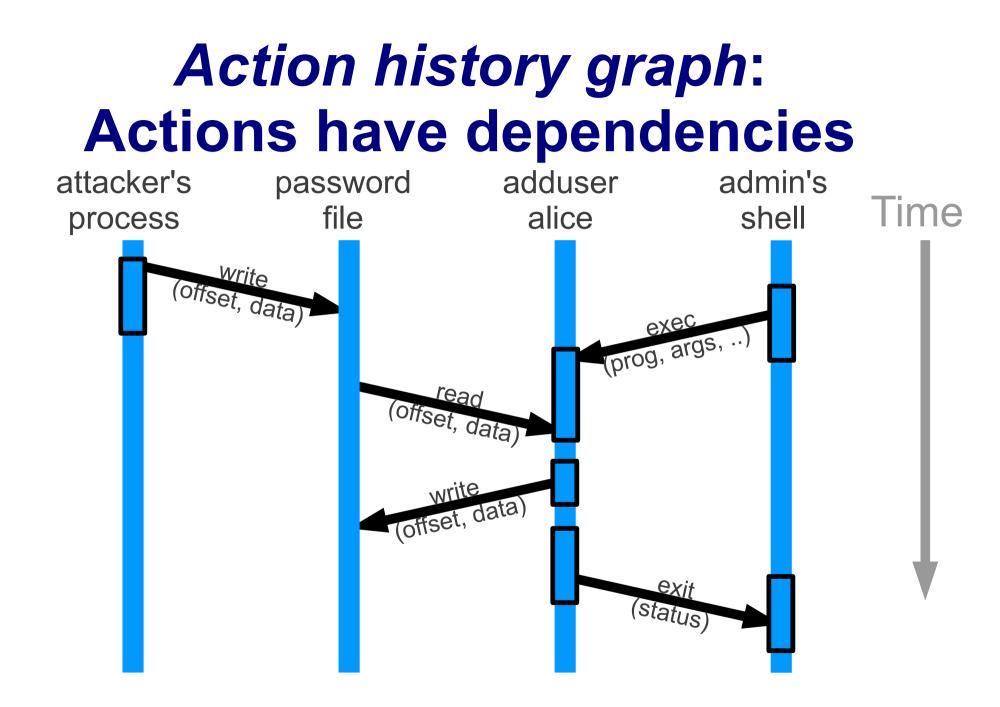
#### Action history graph: Actions represent execution

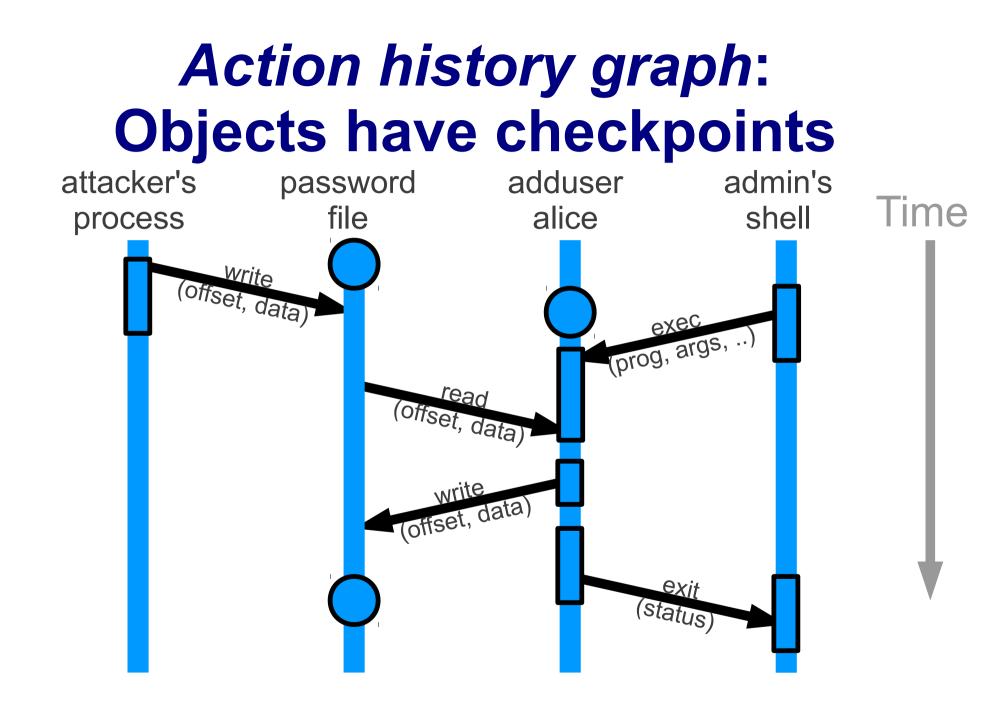


#### Action history graph: **Actions have dependencies** attacker's password adduser admin's Time file alice shell process offset, data)

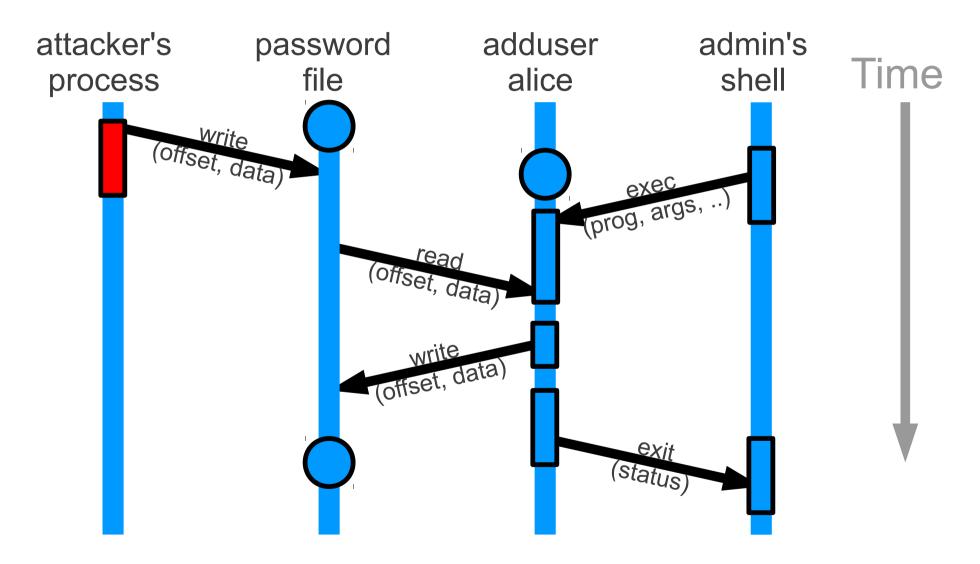
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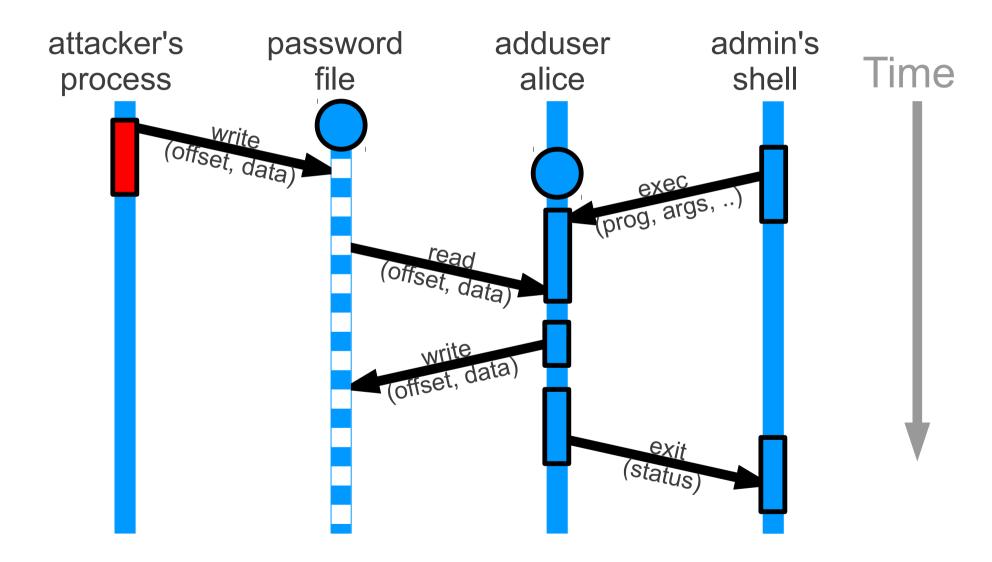




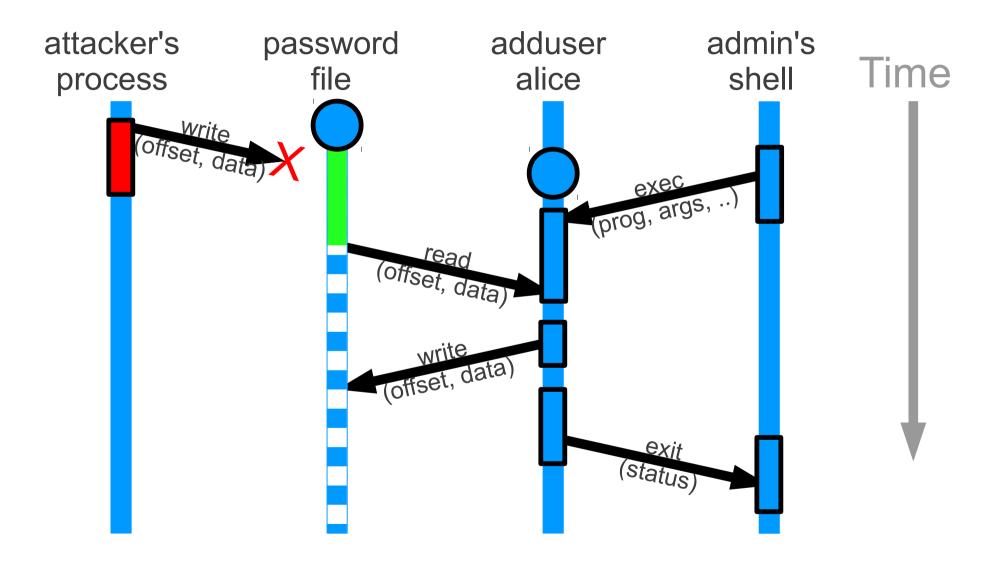
#### Step 1: find attack action



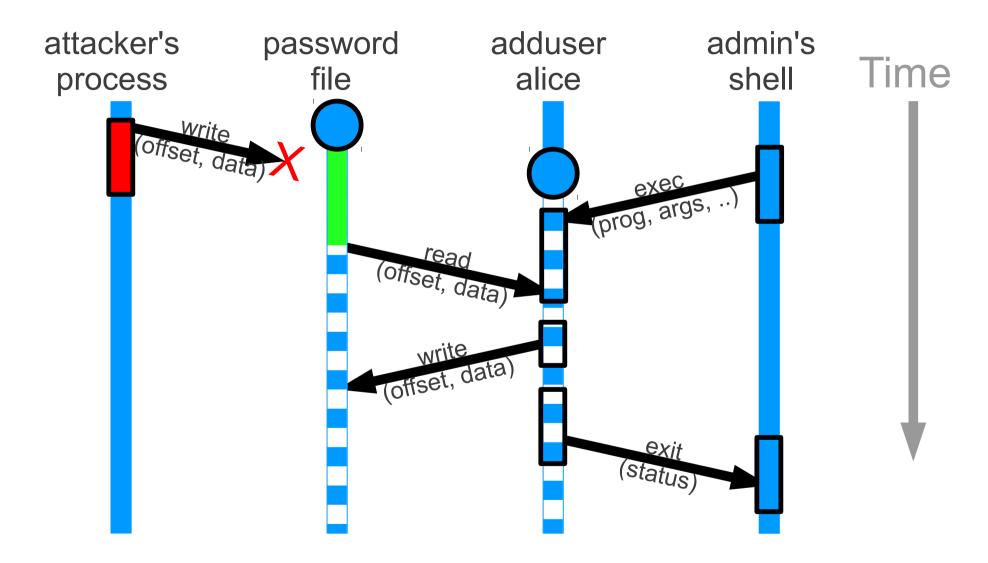
### Step 2: roll back affected objects



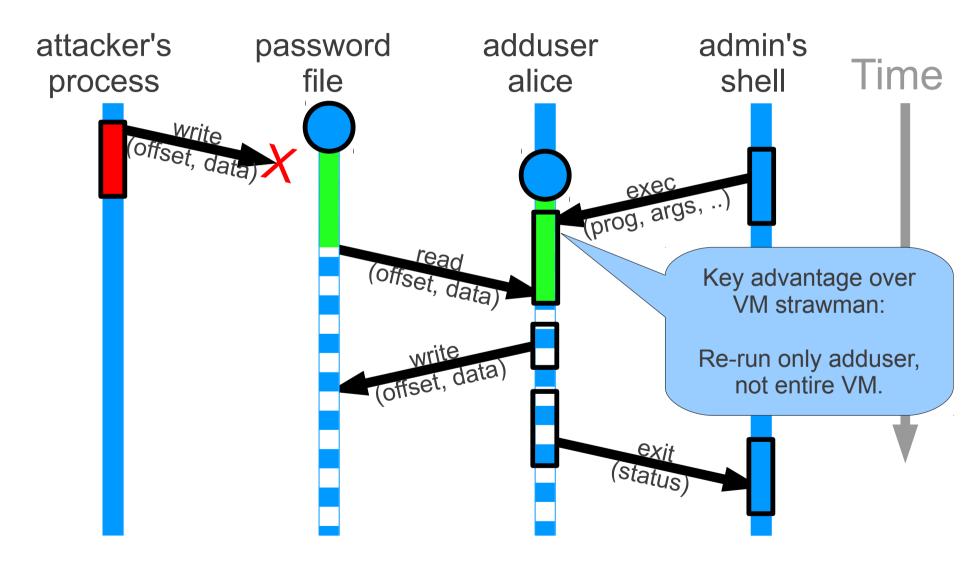
### Step 3: redo non-attack actions



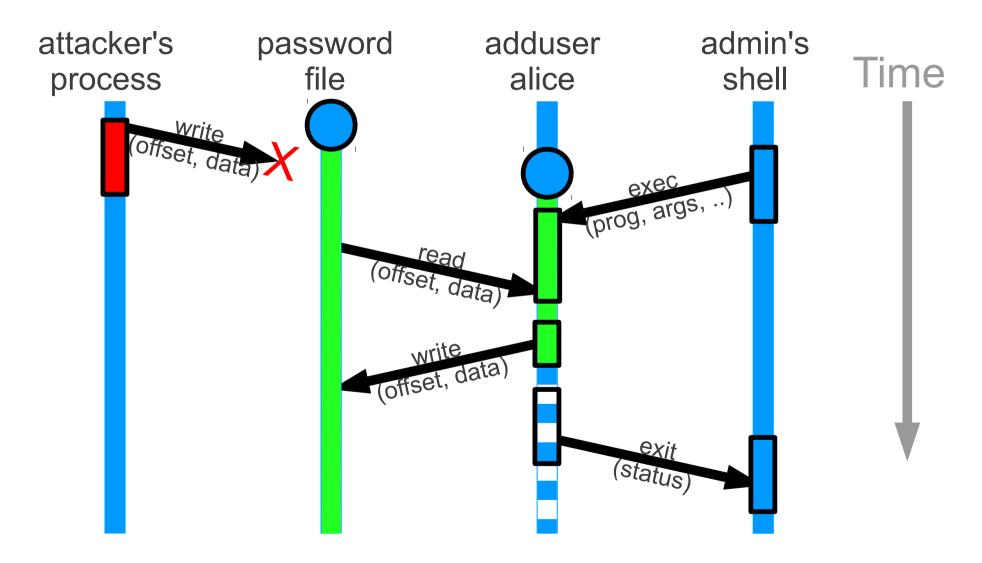
### Repeat step 2: roll back objects



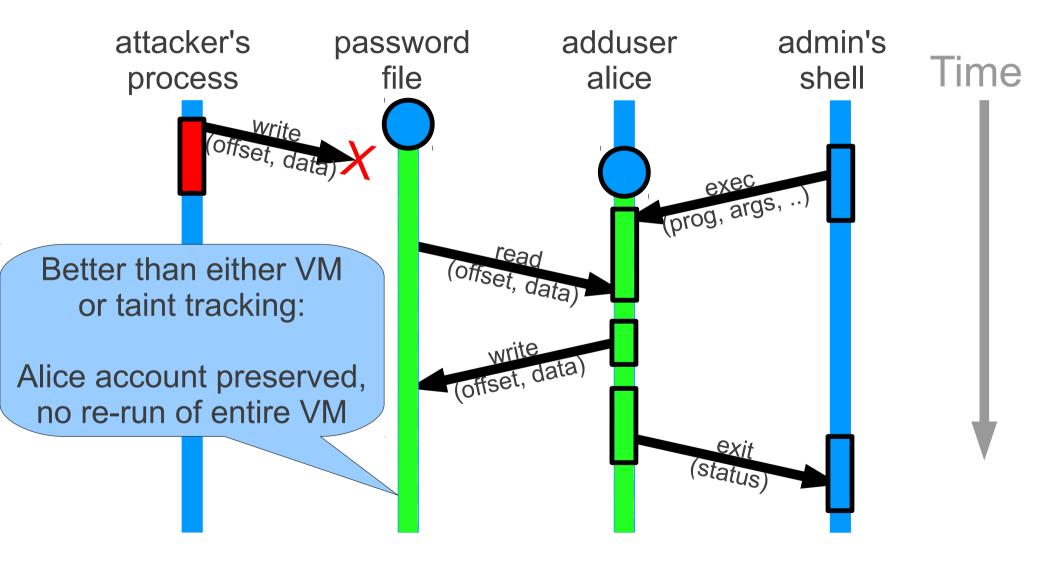
#### **Repeat step 3: redo actions**

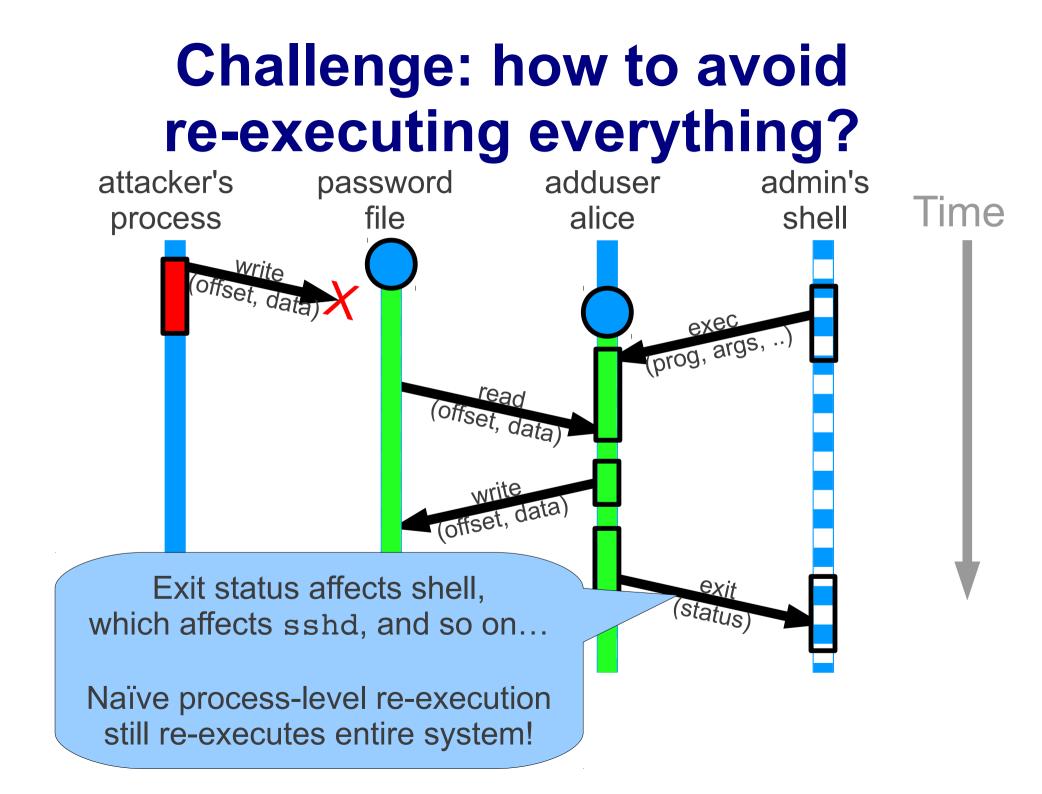


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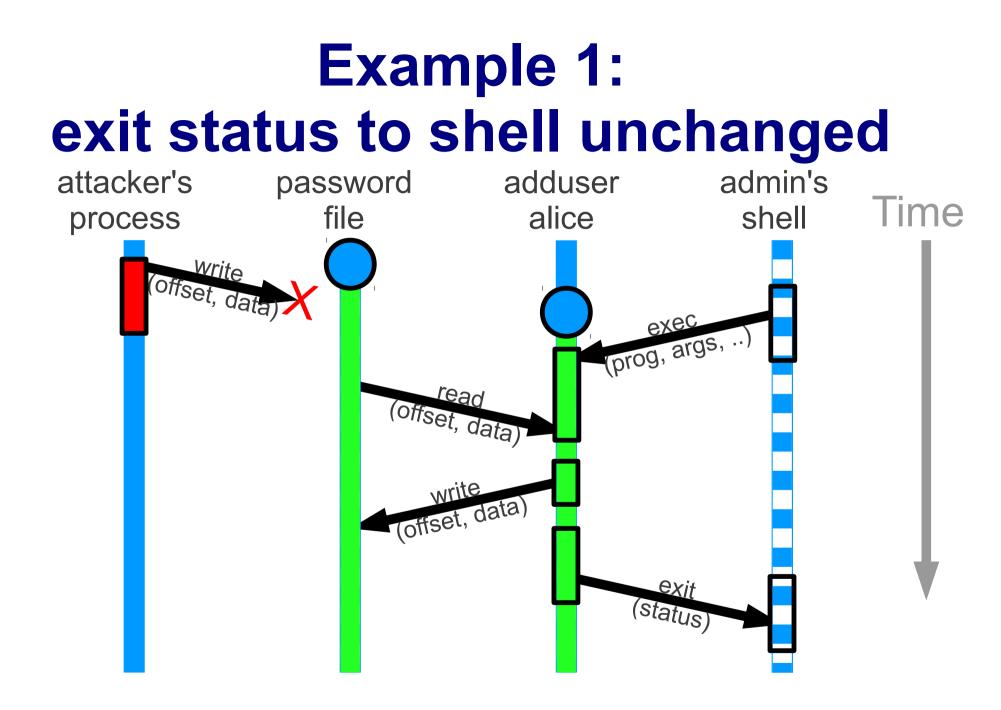
# **Observation: many suspect computations are not affected**

- Attacker adds 1 account to password file
  - Alice's sshd reads password file, but looks up Alice's account instead of attacker's
- Attacker adds 1 line to pdflatex to restart botnet
  - Alice's pdflatex process may restart botnet, but otherwise does legitimate work
- Significant changes  $\rightarrow$  can detect attack earlier

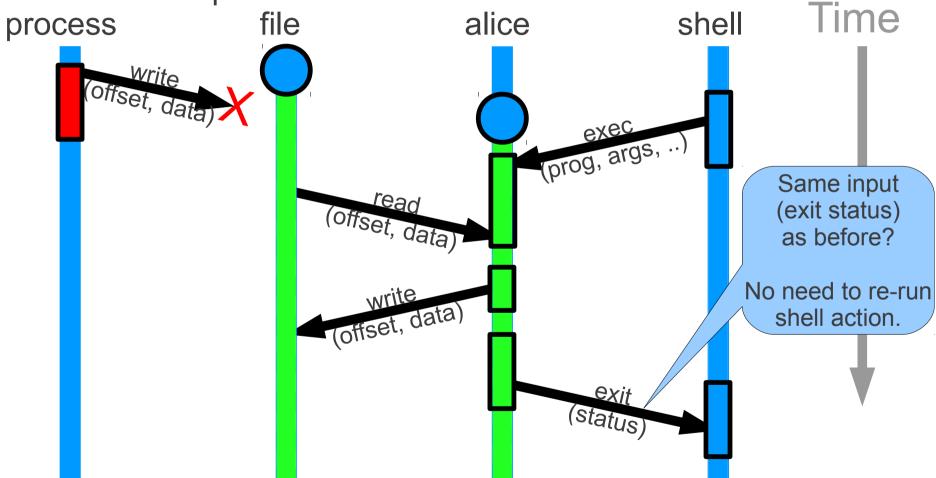
# **Approach: minimize re-execution**

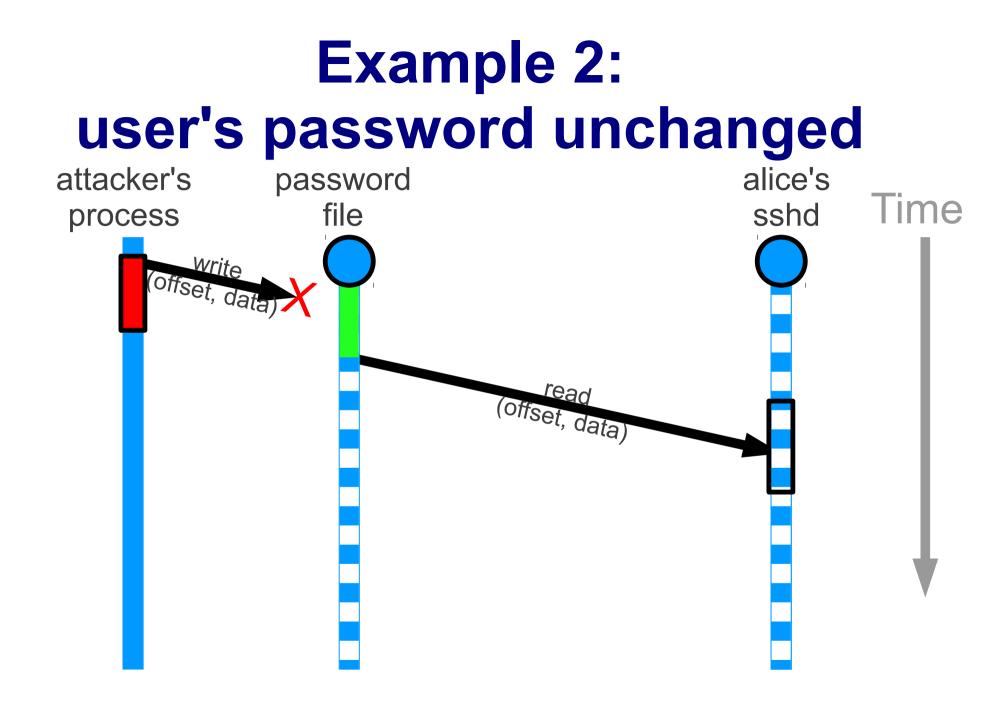
- **Predicates:** Retro skips equivalent computations
  - Predicate checks whether inputs are the same
  - If so, assume original result OK, avoid re-execution

- *Refinement:* Retro re-executes fine-grained actions
  - Avoid re-executing entire process or login session, when only a small part of it was affected

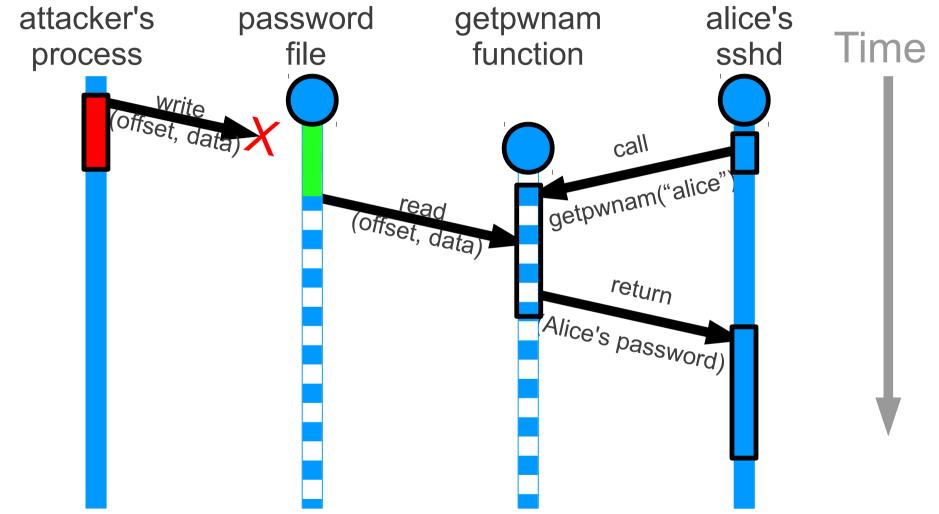


# Predicates:avoid equivalent re-executionattacker'sprocessfilealiceshell

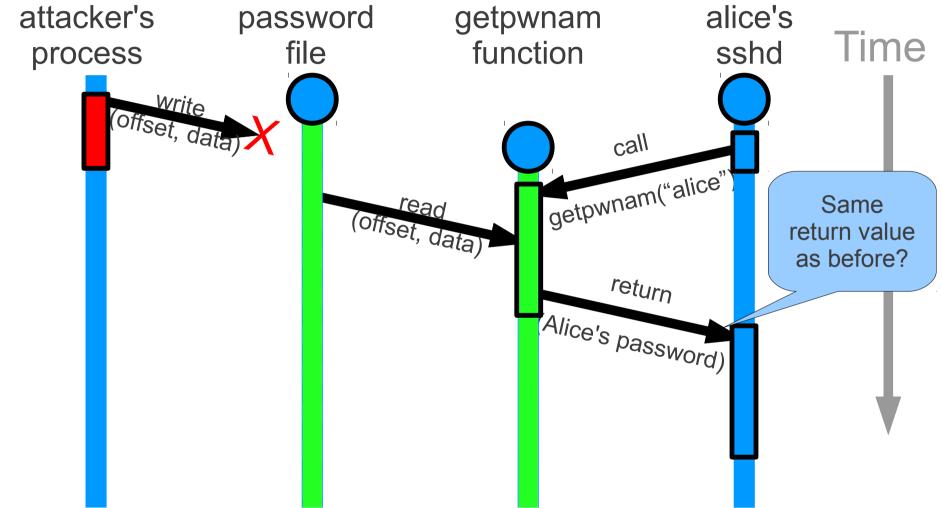




#### **Refinement:** re-execute individual functions



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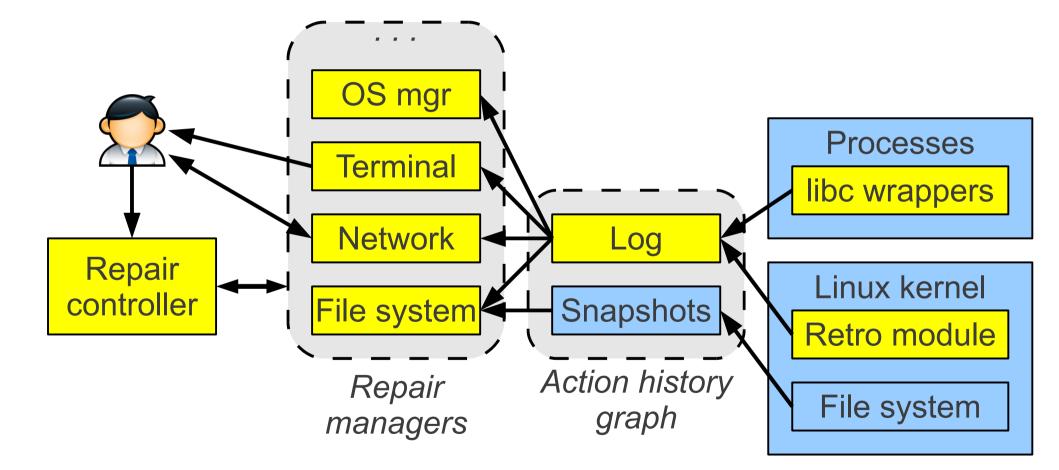


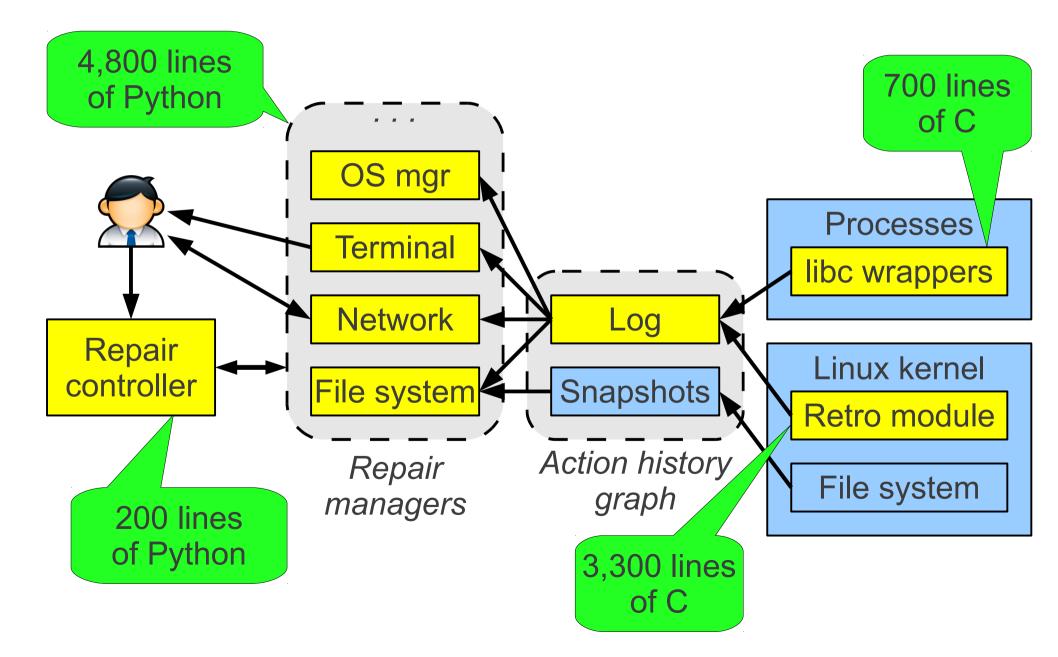
# Remaining challenge: external dependencies

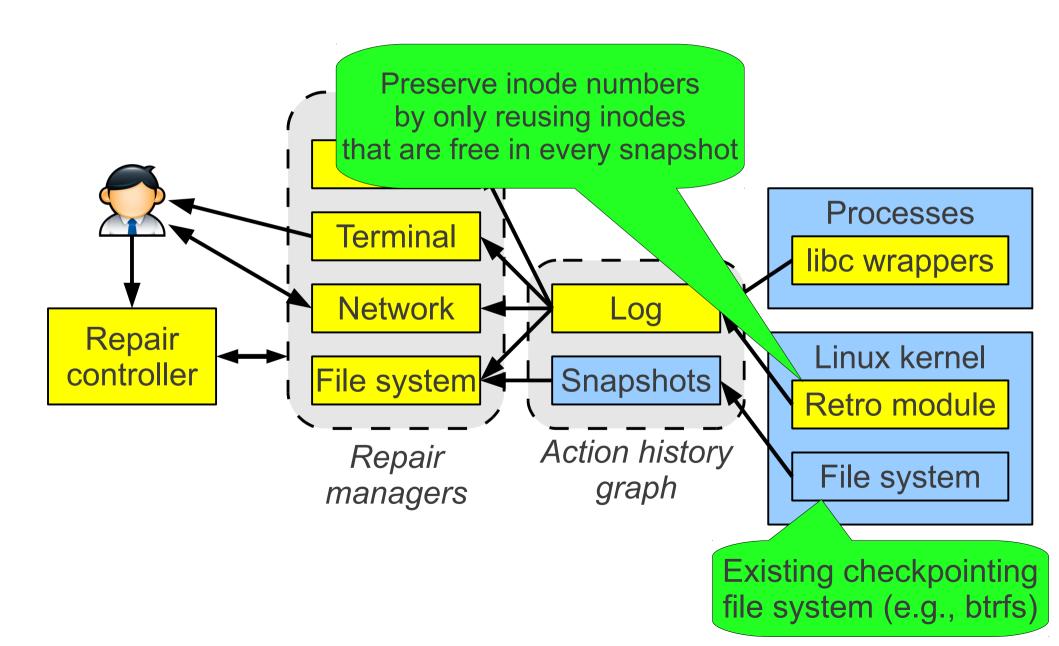
- What if the attack was externally-visible?
  - Attacker sent spam, or user saw wrong output from 1s
- Cannot solve general case (spam already sent)
  - Will need to pause repair and ask for user input
- Can do compensating actions in some cases

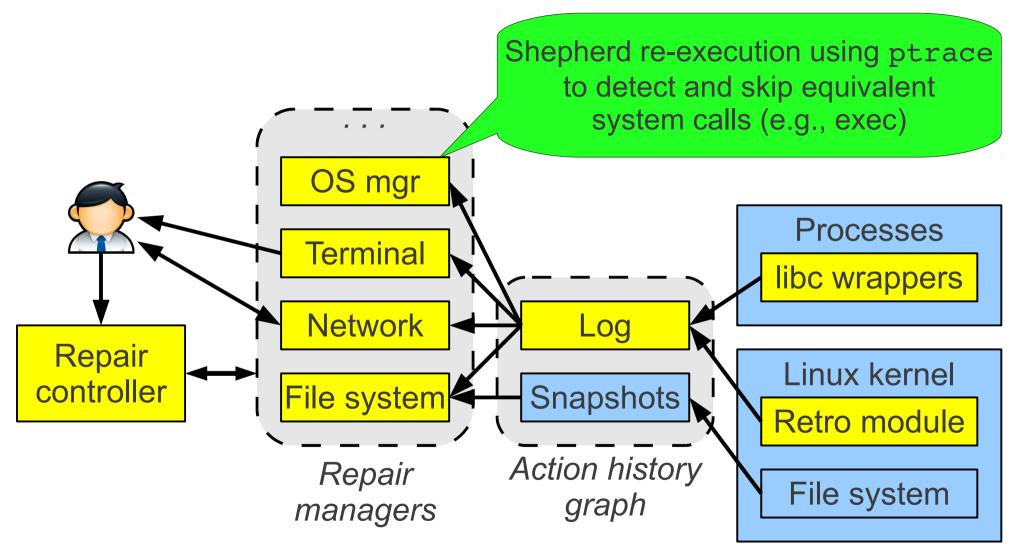
# Compensating action for terminals: email diff to user

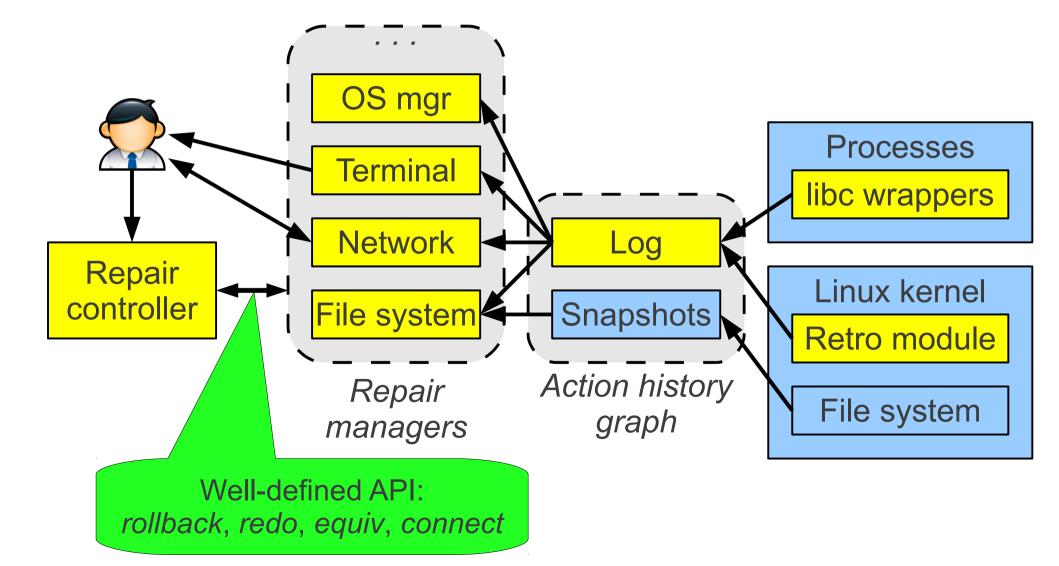
```
nickolai@karakum:~$ cd undosys/libundo
 nickolai@karakum:~/undosys/libundo$ ls -1
  -rw-r--r-- 1 nickolai nickolai 493 2010-05-13 09:46 Makefile
- -rw-r--r-- 1 nickolai nickolai 2124 2010-05-13 10:22 attack.c
 drwxr-xr-x 2 nickolai nickolai 4096 2010-05-13 09:46 bdb
  -rwxr-xr-x 1 nickolai nickolai 973 2010-05-13 09:46 mailserver.py
 drwxr-xr-x 2 nickolai nickolai 4096 2010-05-13 09:46 php
  -rw-r--r-- 1 nickolai nickolai 5221 2010-05-13 09:46 pwd.c
  -rw-r--r-- 1 nickolai nickolai 1424 2010-05-13 09:46 undo.py
+ -rw-r--r-- 1 nickolai nickolai 662 2010-05-13 09:46 undocall.c
+ -rw-r-r-- 1 nickolai nickolai 1340 2010-05-13 09:46 undocall.h
+ -rw-r--r-- 1 nickolai nickolai 755 2010-05-13 09:46 undotest.c
+ -rwxr-xr-x 1 nickolai nickolai 360 2010-05-13 09:46 undotest.py
  -rw-r--r-- 1 nickolai nickolai 6603 2010-05-13 09:46 undowrap.c
 nickolai@karakum:~/undosys/libundo$ du -ks .
- 84
+ 96
 nickolai@karakum:~/undosys/libundo$ cd ..
 nickolai@karakum:~/undosys$
```











#### **Evaluation questions**

• How much better is Retro than manual repair?

• What is Retro's cost during normal execution?

### **Evaluation setup**

- 2 real-world attacks from honeypot
  - Remove log entries, add accounts, run botnet
- 2 synthetic challenge attacks
  - Running example (LaTeX trojan) and sshd trojan
- 6 attacks from *Taser* recovery system [Goel'05]
  - File sharing, web servers, databases, desktop apps
  - Website backdoors, trojans in 1s, new accounts

### **Retro repairs from all attacks**

Attack	Retro	User input required				
Root pw change		Skip attacker's login attempt				
Log cleaning		_				
LaTeX trojan		—				
sshd trojan		Packet replay req'd – conflict!				
Illegal storage						
Content destruct.	$\bigcirc$	- (generates terminal diff)				
Unhappy student		- (generates terminal diff)				
Compromised DB	$\bigcirc$	—				
Browser plugin		Skip re-execution of browser				
Weak password		Skip attacker's login attempt				

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# 6/10 cases: no user input needed, automatic re-execution suffices

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# 2/10 cases: user input needed to skip attacker's SSH logins

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Log cleaning		—				
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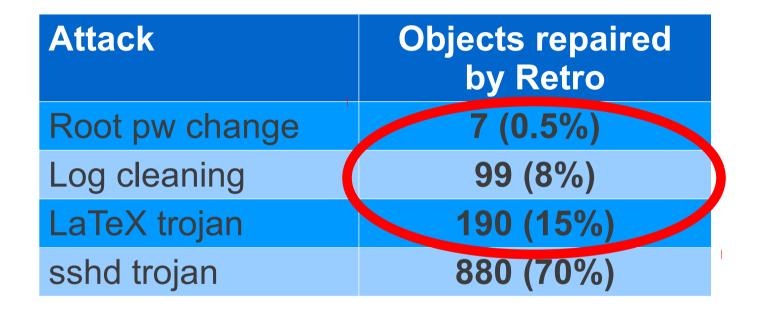
# 2/10 cases: user input needed to handle legitimate network I/O

Attack	Retro	User input required				
Root pw change		Skip attacker's login attempt				
Log cleaning		—				
LaTeX trojan		_				
sshd trojan	$\bigcirc$	Packet replay req'd – conflict!				
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Browser plugin		Skip re-execution of browser				
Weak password		Skip attacker's login attempt				

# Repair cost: *Retro* repairs few objects

Attack	Objects repaired by Retro			
Root pw change	7 (0.5%)			
Log cleaning	99 (8%)			
LaTeX trojan	190 (15%)			
sshd trojan	880 (70%)			

# Repair cost: *Retro* repairs few objects



• Repair cost proportional to extent of attack

# Repair time depends largely on # objects, not log size

Total size of Retro log (action history graph)	Repair time for 136 objects / 399 syscalls		
399 system calls	0.3 seconds		
5,699,149 system calls	4.7 seconds		

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Total size of Retro log (action history graph)	Repair time for 136 objects / 399 syscalls		
399 system calls	0.3 seconds		
5,699,149 system calls	4.7 seconds		

- 10,000X increase in workload leads to 10X increase in repair time
- Much more efficient than whole-VM re-execution

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Workload	CPU cost	Storage overhead
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Apache, small static files	127%	100GB / day		
Continuous kernel recompile	89%	150GB / day		

 Can store 2 weeks of logs on 2TB disk (\$100) even for worst-case extreme workloads

#### **Runtime overheads**

	T			
Workload	CPU	w/ 2 <sup>nd</sup>	S	torage overhead
	cos	core		
HotCRP conference web site	35%	2%		4GB / day
Apache, small static files	127%	33%		100GB / day
Continuous kernel recompile	89%	18%		150GB / day

- Can store 2 weeks of logs on 2TB disk (\$100) even for worst-case extreme workloads
- Can off-load CPU overhead to extra core

### **Related work**

- Tracking down intrusions
  - BackTracker [King'03], IntroVirt [Joshi'05]
- Taint tracking to find, revert affected files
  - Taser [Goel'05], Polygraph [Mahajan'09]
- Selective undo and re-execution
  - Undoable mail store [*Brown'03*] (fixing configuration errors in a single app)

### Conclusion

- Hard to recover from attacks *and* preserve legitimate user changes
- Retro repairs attacks, keeps legitimate changes
  - Key idea: *re-execution* of legitimate actions
  - Predicates and refinement minimize re-execution

#### **Additional slides follow**

### **Non-deterministic re-execution**

- Goal: an acceptable execution
  - An execution that could have happened in the absence of the attack
- What if program is non-deterministic?
  - Re-run may lead to another acceptable execution
  - Result will not be influenced by attack
  - If significant differences arise (e.g., new crypto keys), might need user input to re-execute