

# DefRec: Establishing Physical Function Virtualization to Disrupt Reconnaissance of Power Grids' Cyber-Physical Infrastructures

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## Ukraine Goes Dark: Russia-Attributed Hackers Take Down Power Grid

Riley Walters / January 13, 2016 / 1 comments

NATIONAL SECURITY

### Stuxnet Raises 'Blowback' Risk In Cyberwar

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**WSJ.com - U.S. regulator says knocking out nine key substations could cause nationwide blackout**

**Energy sector tops list of US industries under cyber attack, says Homeland Security report**

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### Researchers uncover holes that open power stations to hacking

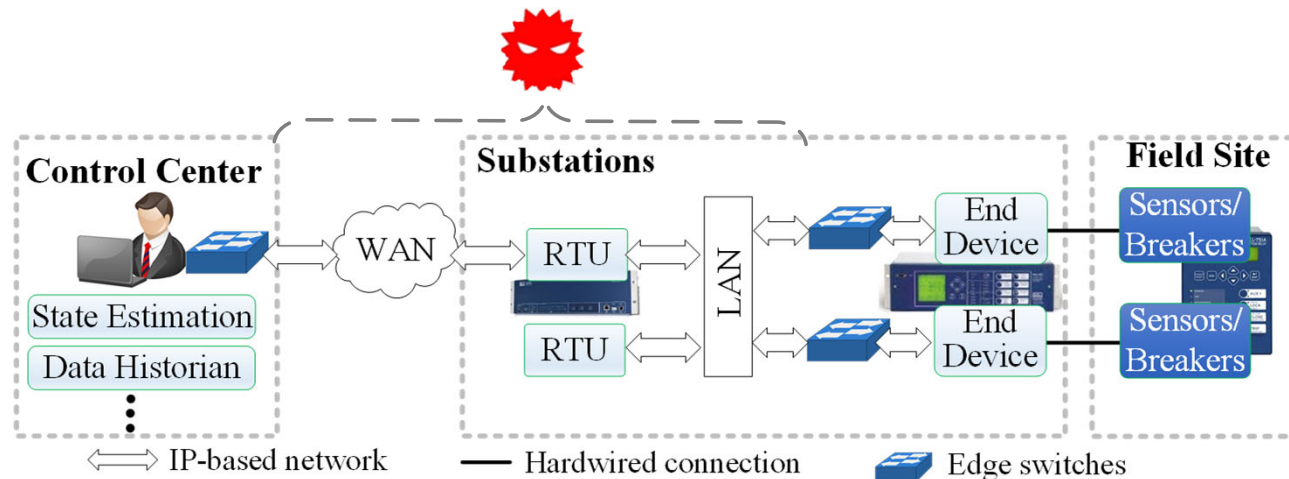
Hacks could cause power outages and don't need physical access to substations.

# From Passive Detection to Preemptive Prevention

- Preemptive approaches disrupting reconnaissance before an adversary starts to inflict physical damage are highly desirable
  - Preventing reconnaissance on a critical set of physical data can cover more attacks, including unknown ones
- Research gap to design practical and efficient **anti-reconnaissance** approaches
  - Mimicking system behaviors can be easily detected
  - Simulations (used in honeypots) are based on a static specification
    - E.g., inconsistent to proprietary implementation
  - No not model physical processes



# Threat Model

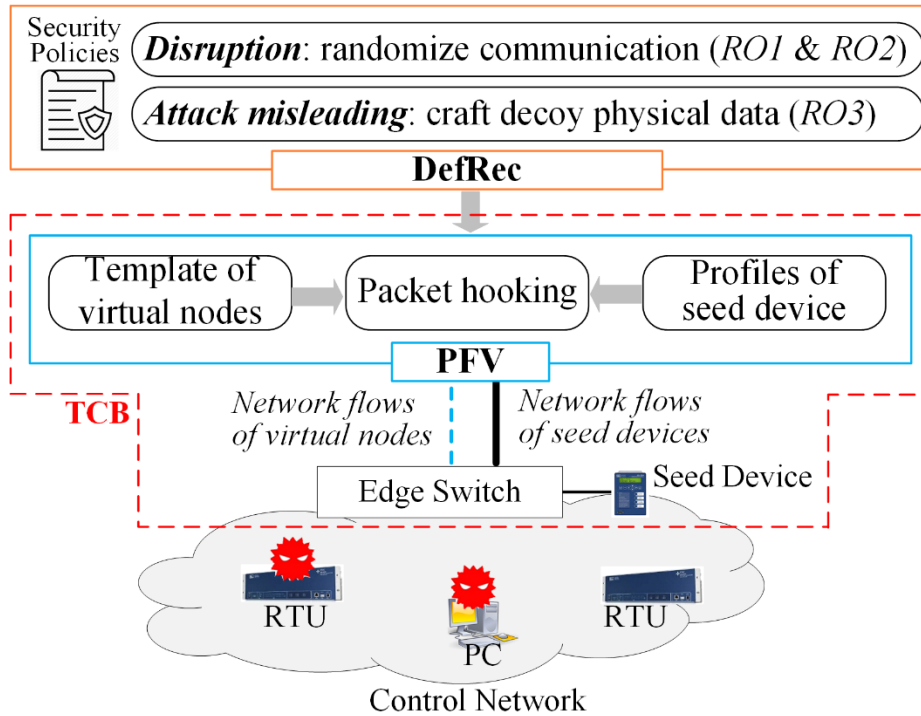


- We assume that adversaries can compromise any computing devices connected to the control network
  - **Passive attacks** monitor network traffic to obtain the knowledge of power grids' cyber-physical infrastructures
  - **Proactive attacks** achieve the same goal by using probing messages
  - **Active attacks** manipulate network traffic, including dropping, delaying, compromising existing network packets, or injecting new packets
- **Passive** and **proactive** attacks are common techniques used in **reconnaissance**, while **active** attacks are used to issue attack-concept operations and cause physical damage

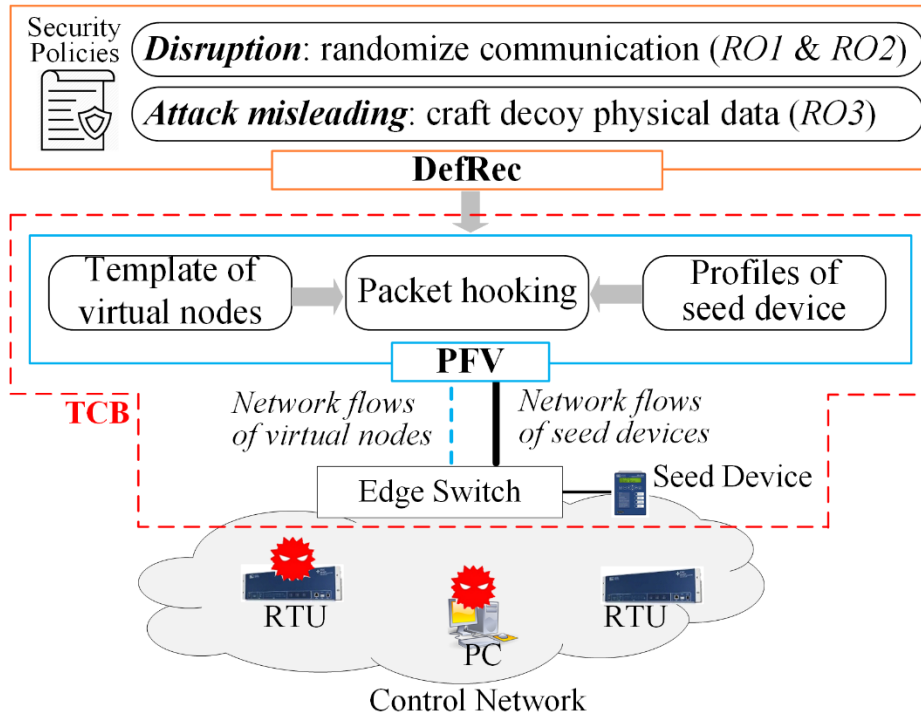
# Design Objective

- Disrupt and mislead attackers' **reconnaissance** based on ***passive*** and ***proactive*** attacks, such that their ***active*** attacks become ineffective
  - RO1 & RO2: significantly delay passive and proactive attacks for obtaining the knowledge of the control network
  - RO3: leverage intelligently crafted decoy data to mislead adversaries into designing ineffective attacks

# Design Overview of DefRec based on PFV



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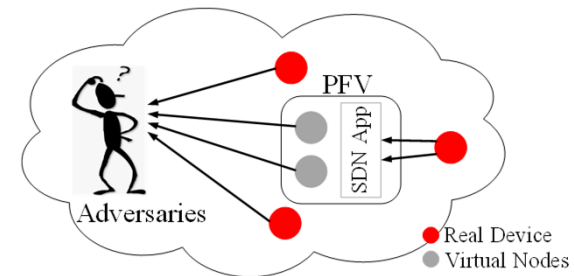


PFV (physical function virtualization): construct virtual nodes that follow the **actual** implementation of real devices

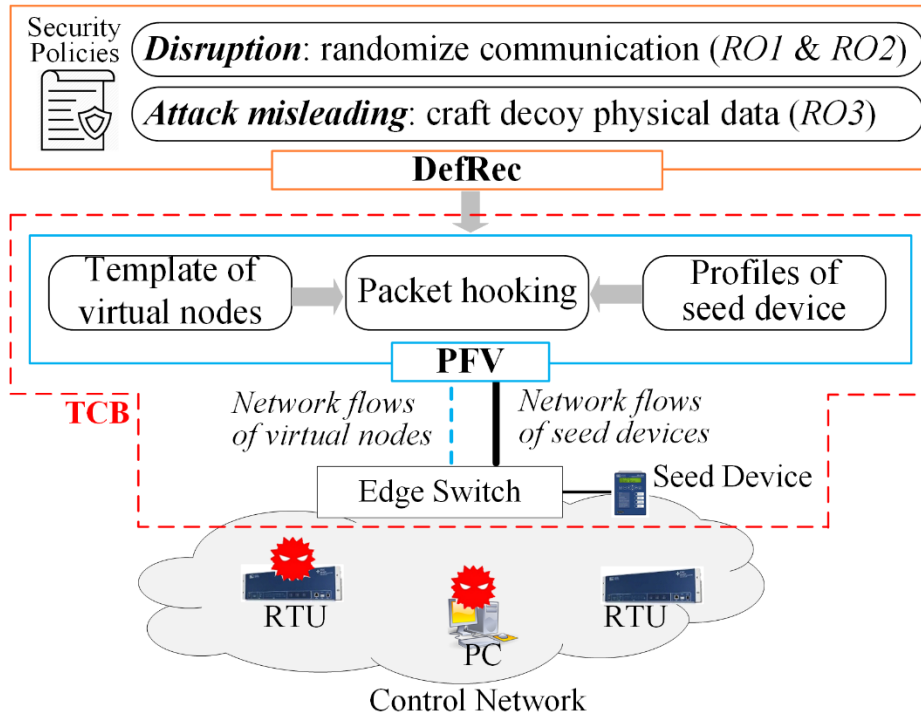
- Complementary to existing security approaches

Trusted computing base (TCB):

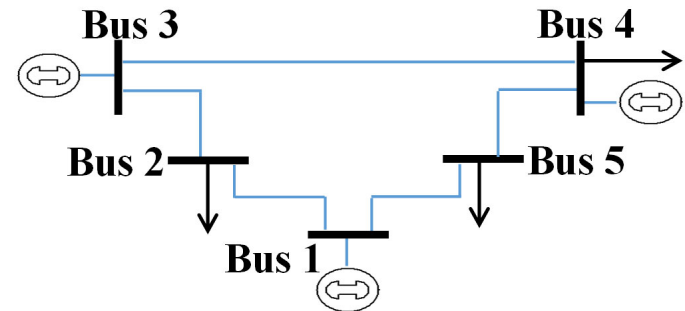
- Network controller application
- Edge switches
- A few end devices (used as seed devices)
- Communication channels connecting them



# Design Overview of DefRec based on PFV



DefRec: specify security policies to disrupt reconnaissance

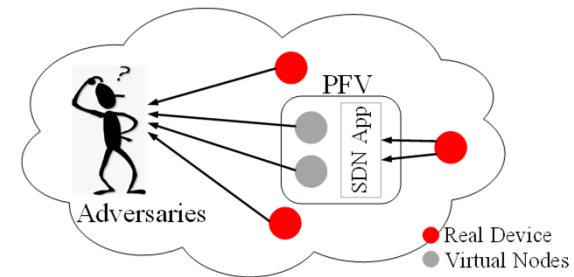


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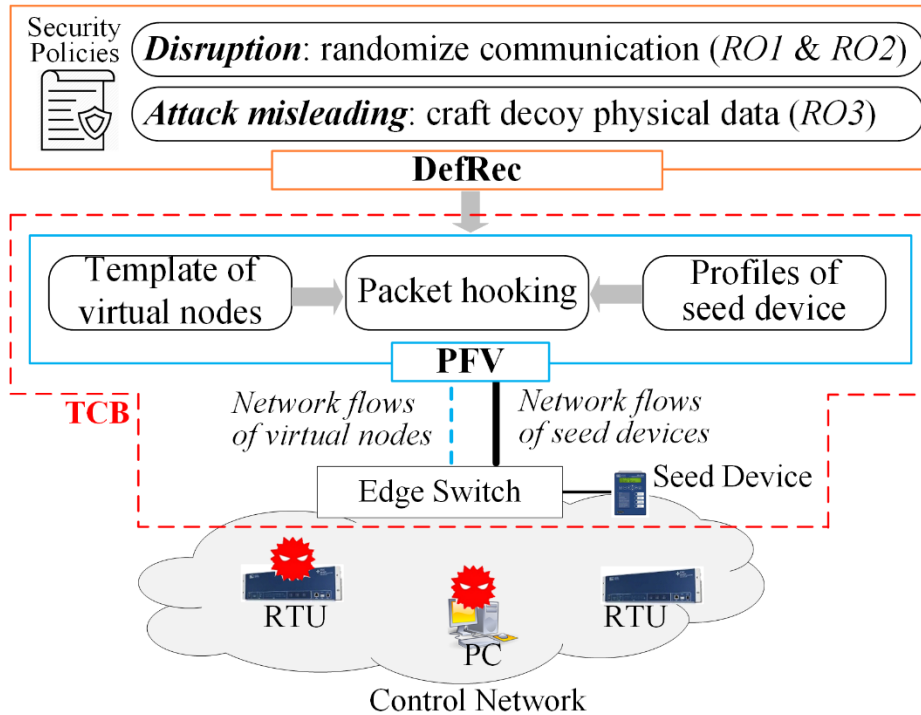
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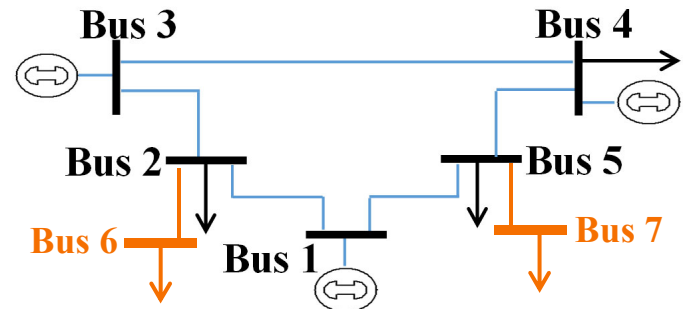
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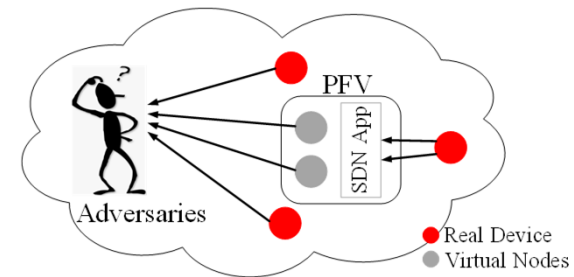
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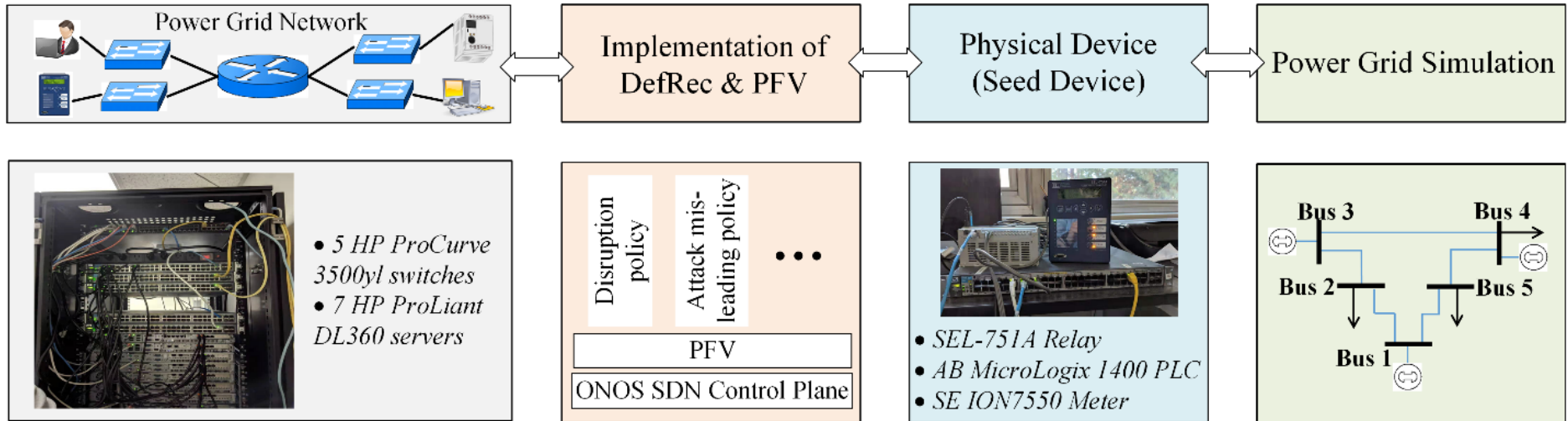


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- Complementary to existing security approaches



# Implementation



- **Communication networks**
- **Implementation of PFV & DefRec**
- **Physical device**
- **Power grid simulation**

# Implementation – Communication Network

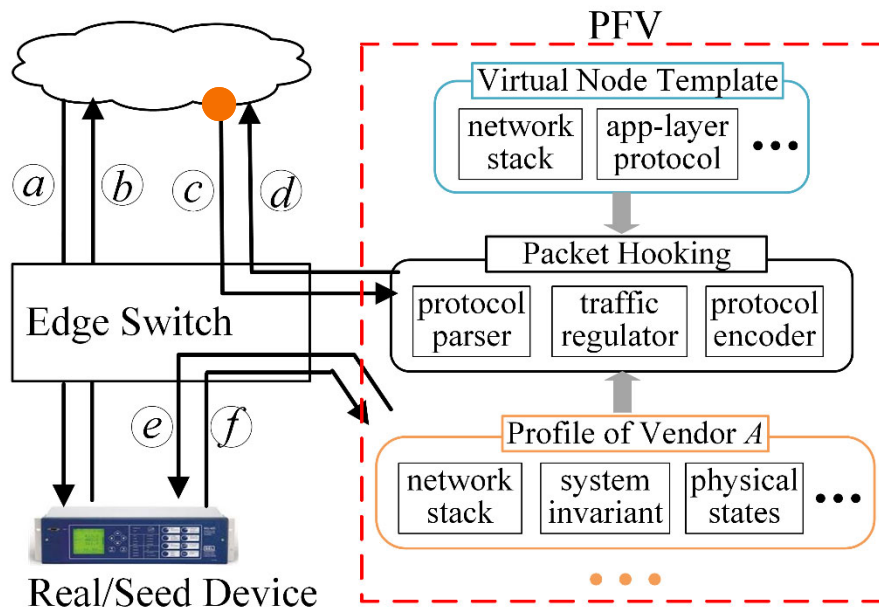
- Follow implementation presented in a NSDI paper [1]
  - Obtained the logical topology of six different communication networks from TopologyZoo dataset
  - Implemented each network in five HP SDN-compatible switches
  - In each switch, we grouped physical ports into VLANs (virtual local area network), each of which represents a logical switch; connect VLANs by Ethernet cables
  - Built Docker instances in seven HP servers as end hosts
    - Need to enhance each server with Ethernet ports
  - Implemented DNP3 master and slaves based on opendnp3 library
- Alternative approach: use cloud infrastructure, e.g., NSF Geni testbed
  - Need to configure virtual switches manually
  - The number of hardware switches are very limited

[1] W. Zhou et al., “Enforcing customizable consistency properties in software-defined networks,” in 12th USENIX NSDI, 2015.

# Implementation – PFV

- PFV: use interaction of real devices to build virtual nodes
  - Virtual node template
  - Profile of seed devices
  - Packet hooking component

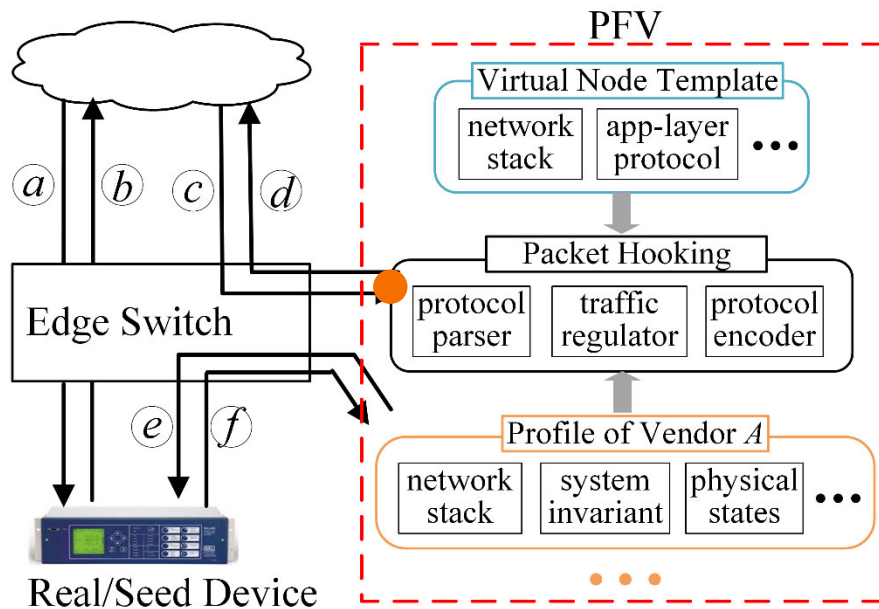
- Virtual node template
  - Static configuration of target network
- Profile of physical devices
  - Dynamic behavior at network-layer
- Packet hooking component
  - Construct the outbound packets of virtual nodes
  - Follow the probabilistic behavior of real devices



- (a) (b) request/response to/from real devices
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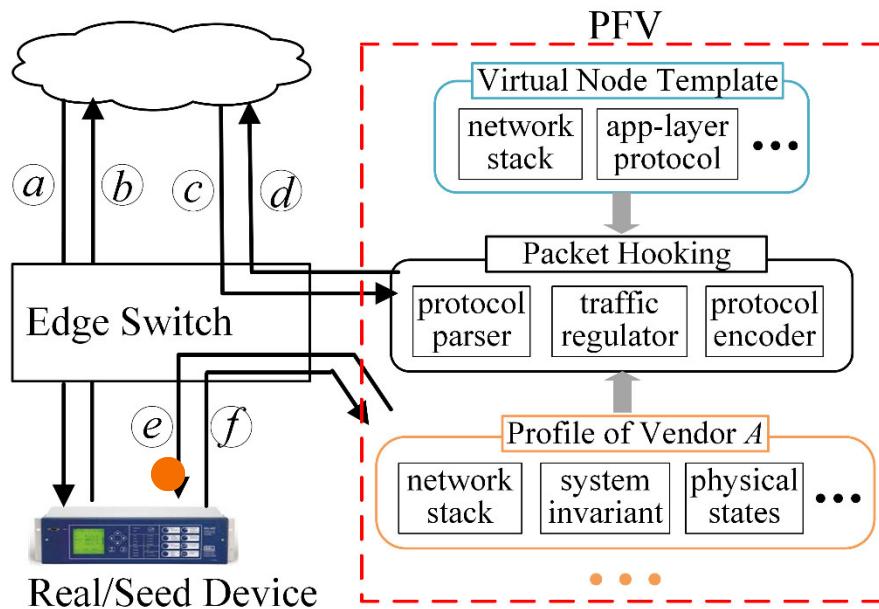


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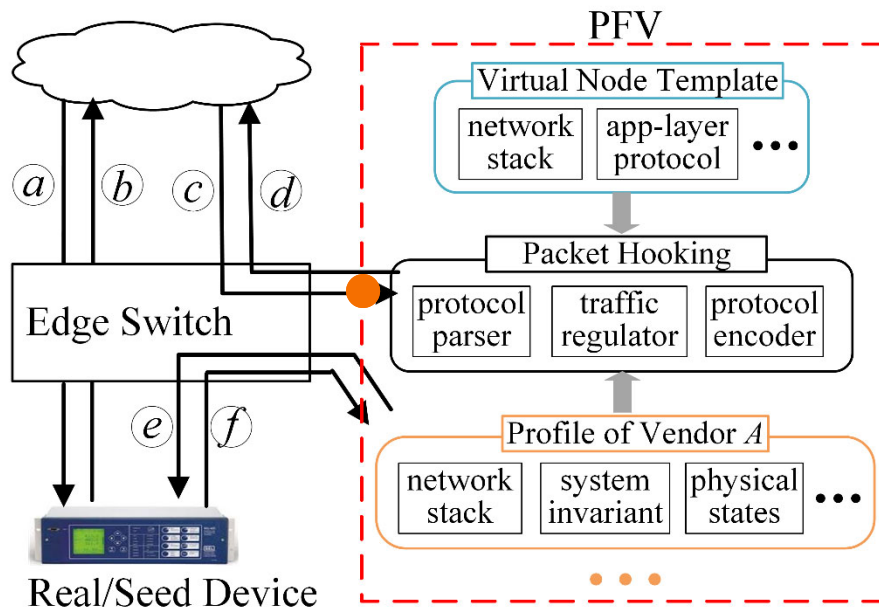
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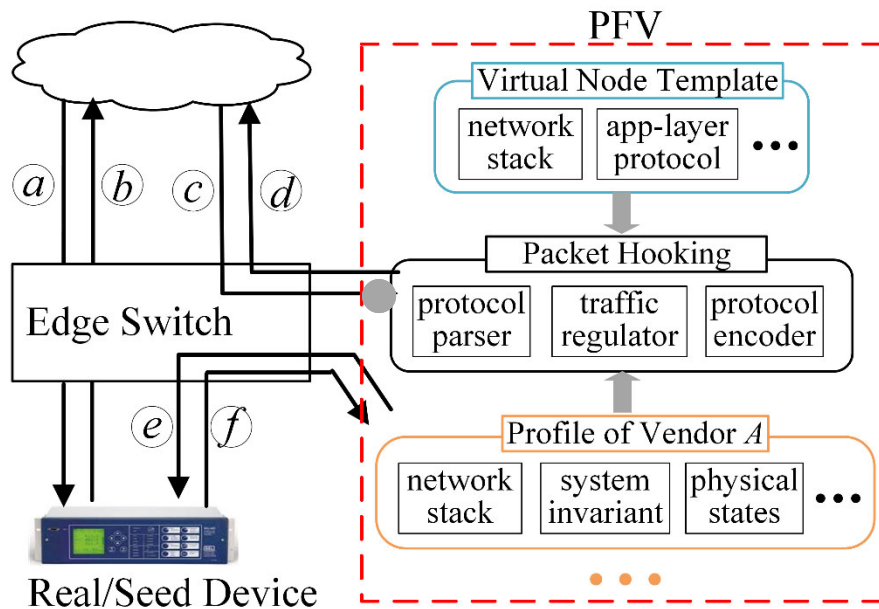


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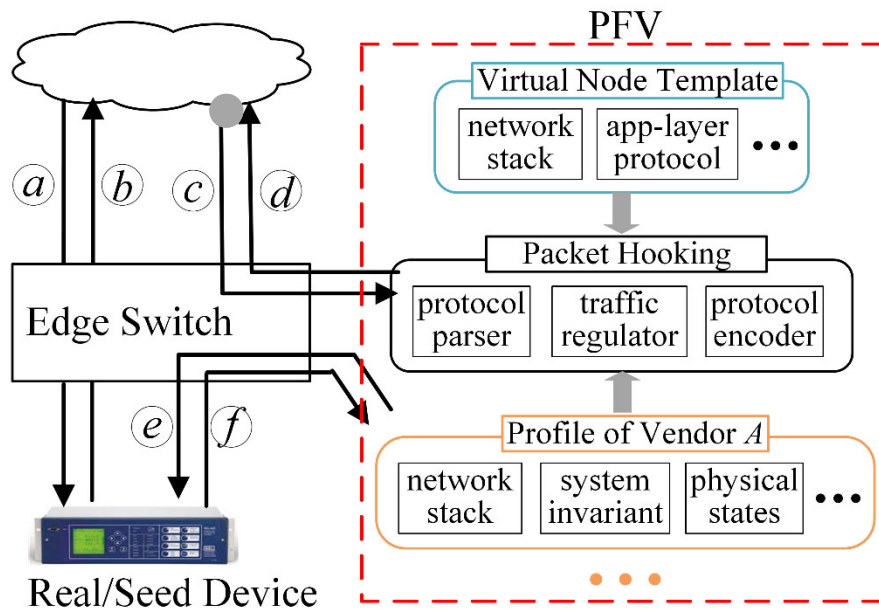
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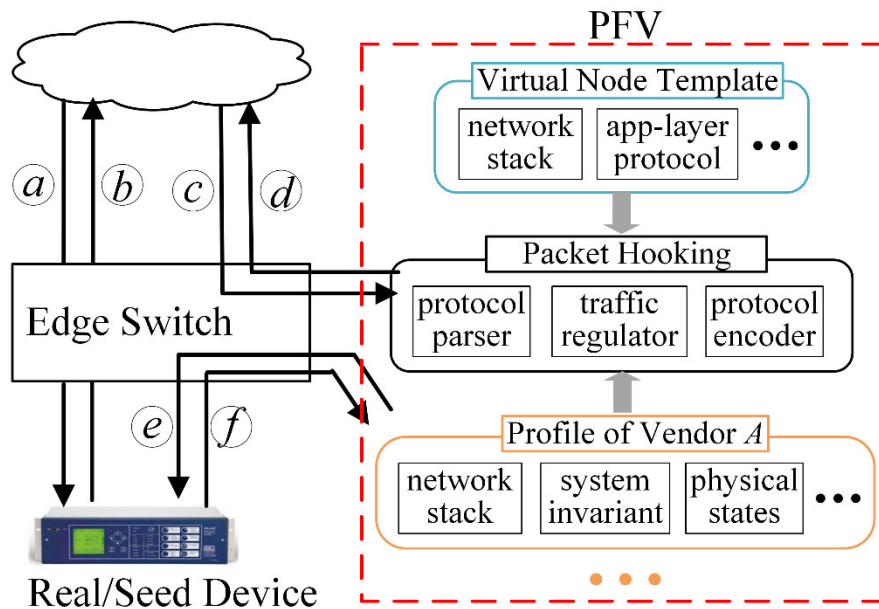


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# Implementation – PFV

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- Implemented based on SDN (software-defined networking)
  - Follow implementation found in both security and network communities
  - ONOS, open source network operating system used in commercial networks
  - Implemented an encoder/decoder of DNP3 in ONOS core services
  - Implemented software modules loaded by ONOS core services



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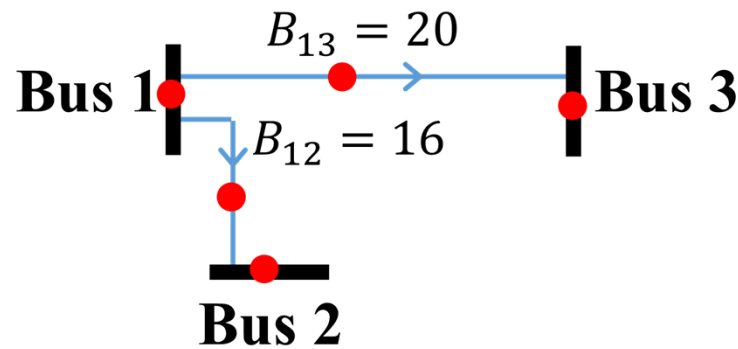
# Attack Misleading Policy for Physical Infrastructure

- RO3: craft decoy data as the application-layer payload of network packets from virtual nodes
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- We use the theoretical model of false data injection attack (FDIAs) as a case study

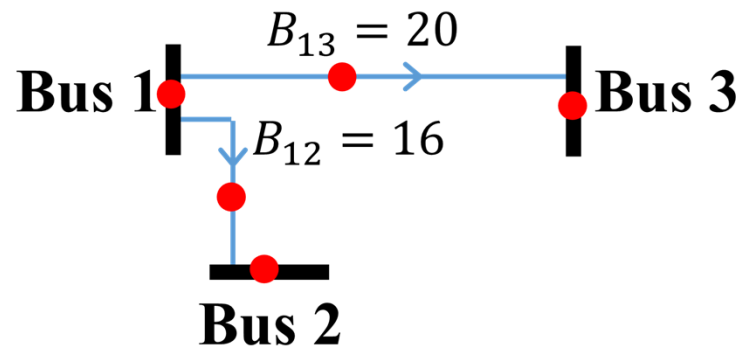
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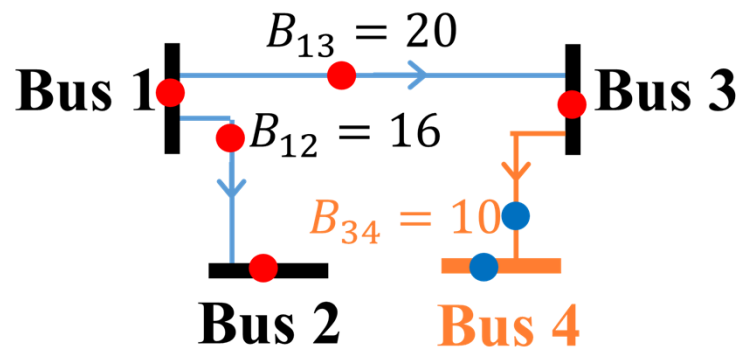
An example power grid

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  - With accurate knowledge of power grids' topology, **active** attacks can compromise measurements without raising alerts in state estimation
    - Measurement errors are less than a detection threshold

# Attack Misleading Policy for Physical Infrastructure



An example power grid



The power grid with decoy data observed by adversaries

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  - Mislead adversaries into designing ineffective attacks
  - Satisfy physical model of power grids
- We use the theoretical model of false data injection attack (FDIAs) as a case study
  - With accurate knowledge of power grids' topology, **active** attacks can compromise measurements without raising alerts in state estimation
    - Measurement errors are less than a detection threshold
  - With misleading knowledge of power grids' topology, **active** attacks raise alerts in state estimation
    - Measurement errors are 5,000 times of the detection threshold

# Implementation – DefRec

$$H = \begin{bmatrix} H_1 \\ H_2 \end{bmatrix} = \begin{bmatrix} 16 & -16 & 0 \\ 20 & 0 & -20 \\ 36 & -16 & -20 \\ -16 & 16 & 0 \\ -20 & 0 & 20 \end{bmatrix} \begin{array}{l} \text{line (1,2)} \\ \text{line (1,3)} \\ \text{bus 1} \\ \text{bus 2} \\ \text{bus 3} \end{array}$$

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- Followed the theoretical model presented in the first paper about FDIA [2] to “prove” the effectiveness of decoy data
  - The proof follows common procedure in literatures from IEEE Transactions on Smart Grid

[2] Y. Liu et al., “False data injection attacks against state estimation in electric power grids,” in 17th CCS, 2010.

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- Followed the theoretical model presented in the first paper about FDIA [2] to “prove” the effectiveness of decoy data
  - The proof follows common procedure in literatures from IEEE Transactions on Smart Grid
- Implemented in MATPOWER
  - The state-of-the-art power system analysis tools
  - Commonly used in both power engineering and security communities

[2] Y. Liu et al., “False data injection attacks against state estimation in electric power grids,” in 17th CCS, 2010.



# Implementation – Physical Devices

- Selecting devices that passed the conformance test of the DNP3 protocol
- Schweitzer Engineering Laboratories (SEL) 751A relay
  - Used in [3] to study fingerprinting methods for physical devices in power grids
- Allen Bradley (AB) MicroLogix 1400 PLC
  - Lower model of 17xx series used in [4]
  - Support wide control operations used in different cyber-physical systems
- Schneider Electric (SE) ION7550 power meters
  - Comparatively simple functionality
  - Purchased a refurbished device

[3] D. Formby et al., “Who’s in control of your control system? device fingerprinting for cyber-physical systems,” in 2016 NDSS.

[4] L. A. Garcia et al., “Hey, my malware knows physics! attacking PLCs with physical model aware rootkit,” in 2017 NDSS.

# Implementation – Power Grid Simulation

- Simulated six power grids, whose configurations are included in MATPOWER
  - The latter two systems represent the biggest two areas of Polish 400-, 220-, and 110-kV national transmission networks
  - Varied operational conditions according to real operational data

<i>Power Grid Simulation</i>	<i>Network</i>
IEEE 24-bus	DataX
IEEE 30-bus	Abilene
RTS96 73-bus	Hurricane
IEEE 118-bus	Chinanet
Poland 406-bus	Cesnet
Poland 1153-bus	Forthnet

- New cases
  - More cases are included in MATPOWER after paper submission
  - E.g., an 10,000-bus case to represent U.S. national grid

# Evaluation

- Security evaluation
  - Effectiveness of PFV
  - Effectiveness of attack-disruption policy
  - Effectiveness of attack-misleading policy
- Performance evaluation

# Effectiveness of PFV

**Objective:** evaluate whether virtual nodes can follow the runtime behavior of real devices

## Original Plan

- We applied fingerprinting methods proposed for CPSs [3] on both real physical devices and virtual nodes
  - Use the time that IEDs execute commands as a system invariant
- We compare the probability density functions (PDFs) of execution time measured for real devices and virtual nodes

## Experiment

- **Issue #1:** physical devices support different types of control operation
- **Solution:** measure two common operations
- **Issue #2:** proprietary implementation of TCP/IP stack
  - Some responses integrate ACK message
- **Solution:** use SDN controller to measure the round-trip time behind the switch

# Effectiveness of Disruption Policy

Objective: estimate how long we can delay passive and proactive attacks for obtaining network configuration

## Original Plan

- Info-theoretically estimate the probability that passive and proactive attacks can obtain the network configuration

## Experiment

- Issue #1: the results are difficult to be interpreted
  - E.g., some false negative rates are as low as  $10^{-10}$
- Solution: Use the delay time as evaluation metric
  - Assuming that an attacker can *passively* monitor up to 200 network packets every second
  - Assuming that adversaries can *probe* control networks with a throughput of 10 Gigabytes per second

[5] Y. Liu et al., “False data injection attacks against state estimation in electric power grids,” in 17th CCS, 2010.

# Effectiveness of Attack-Misleading Policies

- Redefine false positive/false negative for crafted decoy data
  - FN: FDIAs prepared based on decoy data are successful
    - Measurement errors are less than a detection threshold
  - FP: decoy data are not valid, meaning that the combination of decoy and real data does not follow the physical model of a power grid
- Evaluations are performed based on repeated simulation of FDIAs implemented in MATPOWER
  - 1,000 times for small scale power grids and 200 times for big scale power grids

# Performance Overhead of Spoofed Network Packets

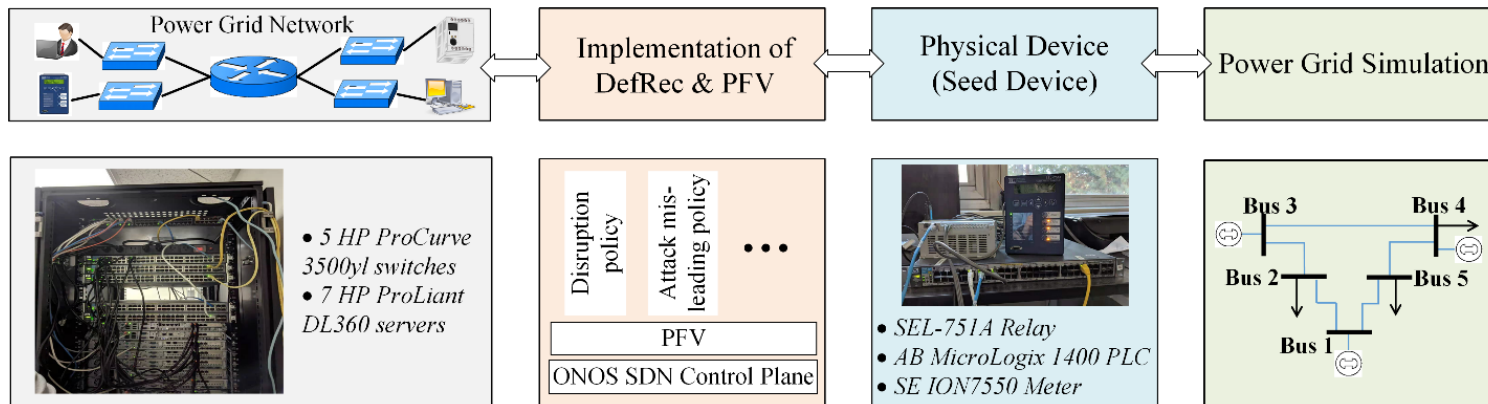
- **Objective:** measure the impact of spoofed network packets on the round-trip time of real network packets
- Unpublished experiments
  - Evaluate in Mininet, a network emulator in a single desktop
    - Results are affected by the bandwidth of Ethernet card of that desktop
  - Evaluate in NSF Geni testbed
    - Results are affected by limited bandwidth
    - Reserving resources for a large scale communication network (more than 100 switches) is very challenging

## Performance Overhead of Crafting Decoy Data

- **Objective:** measure the latency of crafting decoy data
- Unpublished experiments
  - The algorithm to craft decoy data is largely relied on the state estimation, a domain specific analysis method in power grids
  - Scales poorly with the size of power grids
- We adjusted the parameter of the algorithm to speed up
  - E.g., reduce the number of iteration of computation, borrowing experiences developed in our previous projects



# Discussions



- The experiment in DefRec is relied on a cyber-physical testbed
  - Communication network relies on hardware SDN-compatible switches
  - Power grids relies on state-of-the-art simulation
- Next step:
  - Upgrade switches to better configure “port-delay”
  - Integrate power grids with a large size
  - Integrate cyber and physical components to construct a hardware-in-the-loop testbed