

**(POSTER) An Empirical Comparative
Measurement on Real ICS Network
Traffic to Internet Traffic**

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Motivation

- **Cyber-Physical Systems = Industrial Control Systems (ICS)
+ Software & Network Systems**
- ICS : machines, physical operations are driving (not human)
- Network traffic, any characteristic?
- We may guess but no proper measurement! Let's measure!

Data Collection

- Domain-scale networks
 - Campus vs ICS
 - Not Global-scale such as BGP
- ICS Network Traffic
 - Two Water Treatment Facilities (let's say **ICS-I, ICS-II**)
 - real-world sites in South Korea
- Public Internet Traffic (Campus Networks)
 - Auckland Univ. (wand.net.nz, lets say **INT-A**)
 - Wisconsin (pages.cs.wisc.edu/~tbenson/, lets say **INT-U**)

Traffic Utilization

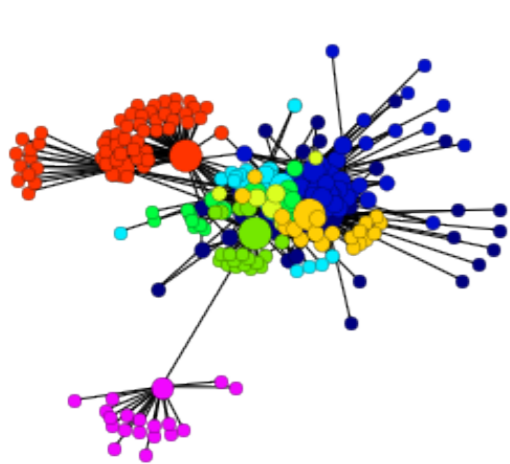
- ICS traffic
 - Carrying control messages + oracle DB
 - machines generate traffic
- Internet traffic
 - HTTP + HTTPS + DNS are most

ICS-1	ICS-2	INT-A	INT-U
Modbus (56.6%)	oracle (23.5%)	http (64.4%)	http (81.4%)
oracle (14.3%)	snmp (3.1%)	DNS (18.8%)	https (5.2%)
http (3.7%)	LS-IS (3.0%)	https (2.8%)	smtp (0.9%)
other (25.4%)	other (70.4%)	other (14.0%)	other (12.5%)

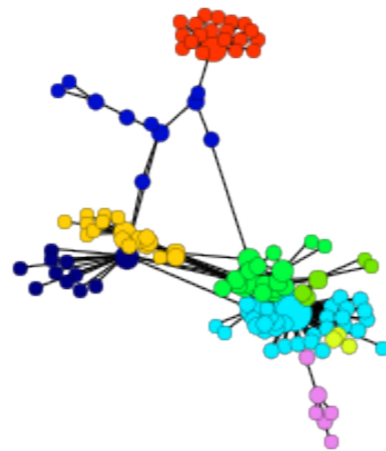
* **Modbus, LS-IS : Control Protocols for PLC**

Network Graph Analysis

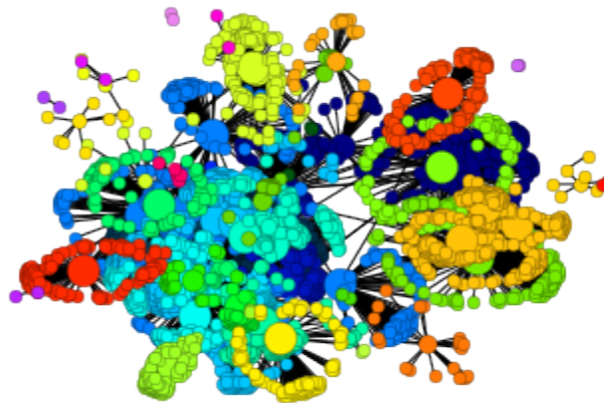
- Build Graph From the network traffic
 - aka., Traffic Dispersion Graph [1]
 - Nodes = distinct IPs
 - Edges = at least one packet



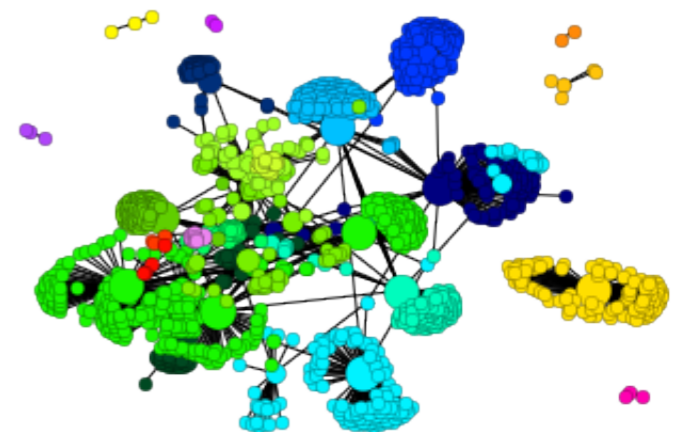
ICS-I



ICS-II



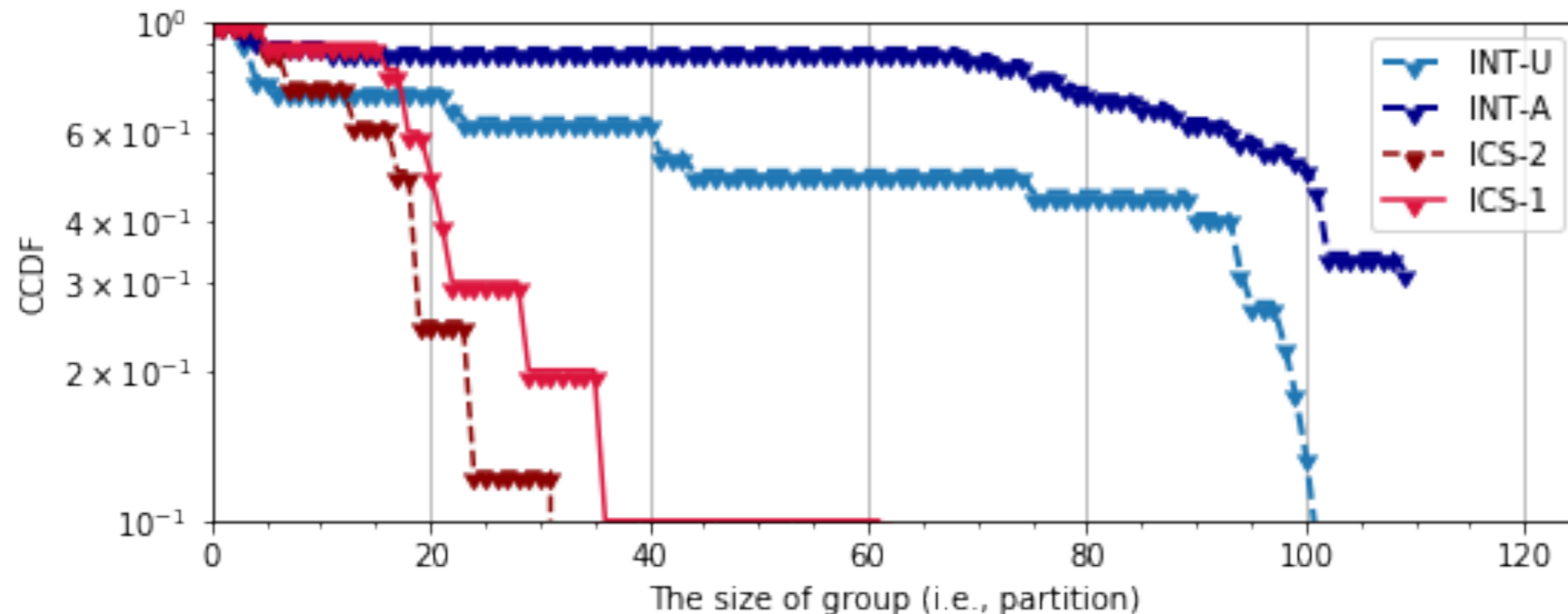
INT-A



INT-U

Network Graph Analysis

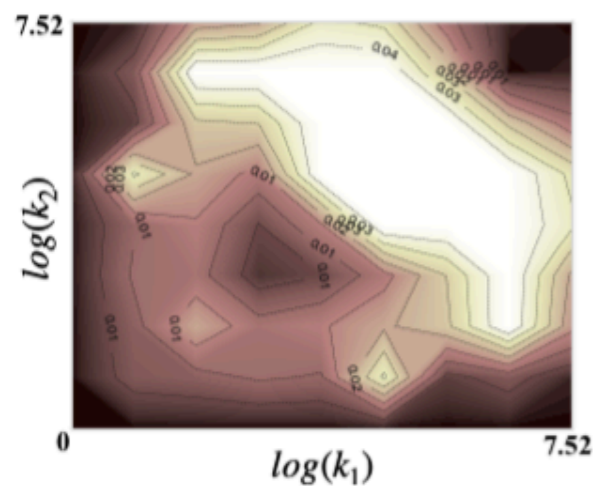
- Community size distribution
 - Using community discovery algorithm
 - Good to know group activity pattern
- Results
 - ICS traffic : relatively small size of group (20~40)
 - Internet traffic : massive size of group (~100)



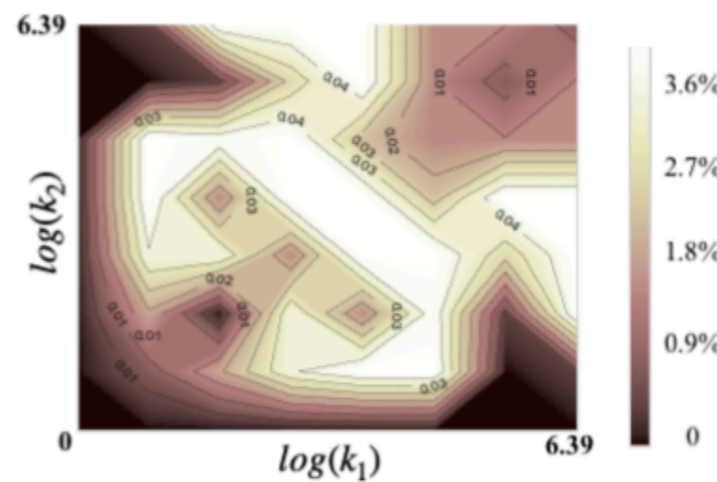
Network Graph Analysis

- Joint Degree Distributions

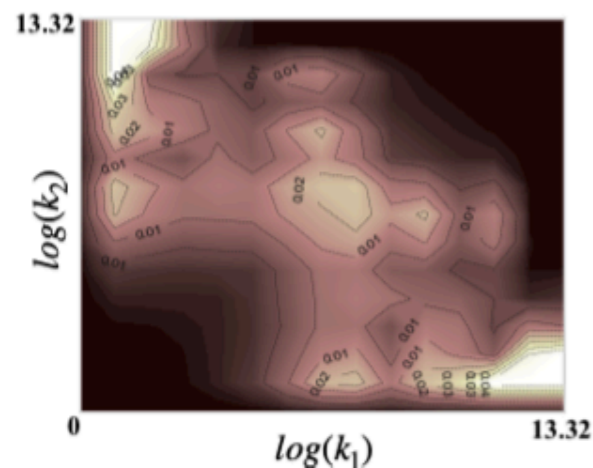
- Brightness in (x,y) : how many edges connecting degree x node and degree y node



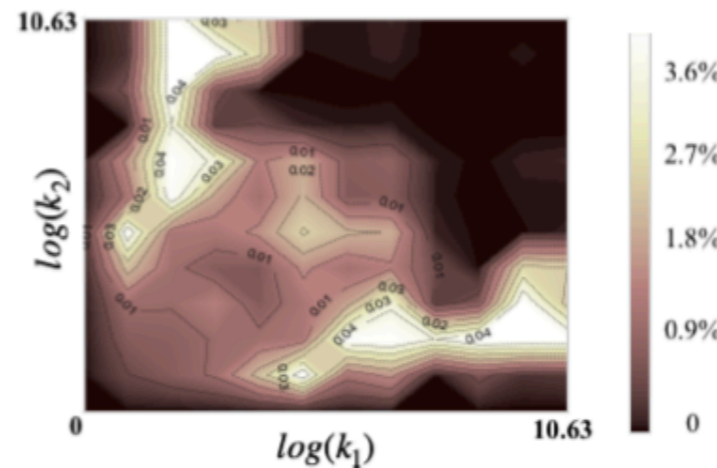
(a) ICS-1



(b) ICS-2



(c) INT-A



(d) INT-U

- ICS Traffic

- clustered by evenly distributed communities
- p2p networks in each community

- Internet Traffic

- right upper, left bottom areas
- few selected nodes dominate most edges (famous sites)

Time-Series Analysis

- Time-Series Analysis
 - How Dynamic? 0-N Edges, Jaccard Index [2]
 - How Periodic? Autocorrelation Method
 - Detail score : refer the paper
- Results
 - ICS traffic is less dynamic than Internet traffic (maybe repeatedly operate same logic)
 - All flows are not periodic in ICS traffic, but flows of industrial protocols are relatively periodic

Thanks

- **Source code for this paper is available at cwb.kr:8080**
- **We are happy to open anomaly dataset from an ICS**
 - **Search “HAI Dataset” on Google**
- **You can freely send me any questions to me !!**
 - **cwbae@nsr.re.kr**