Trace and Logs analysis
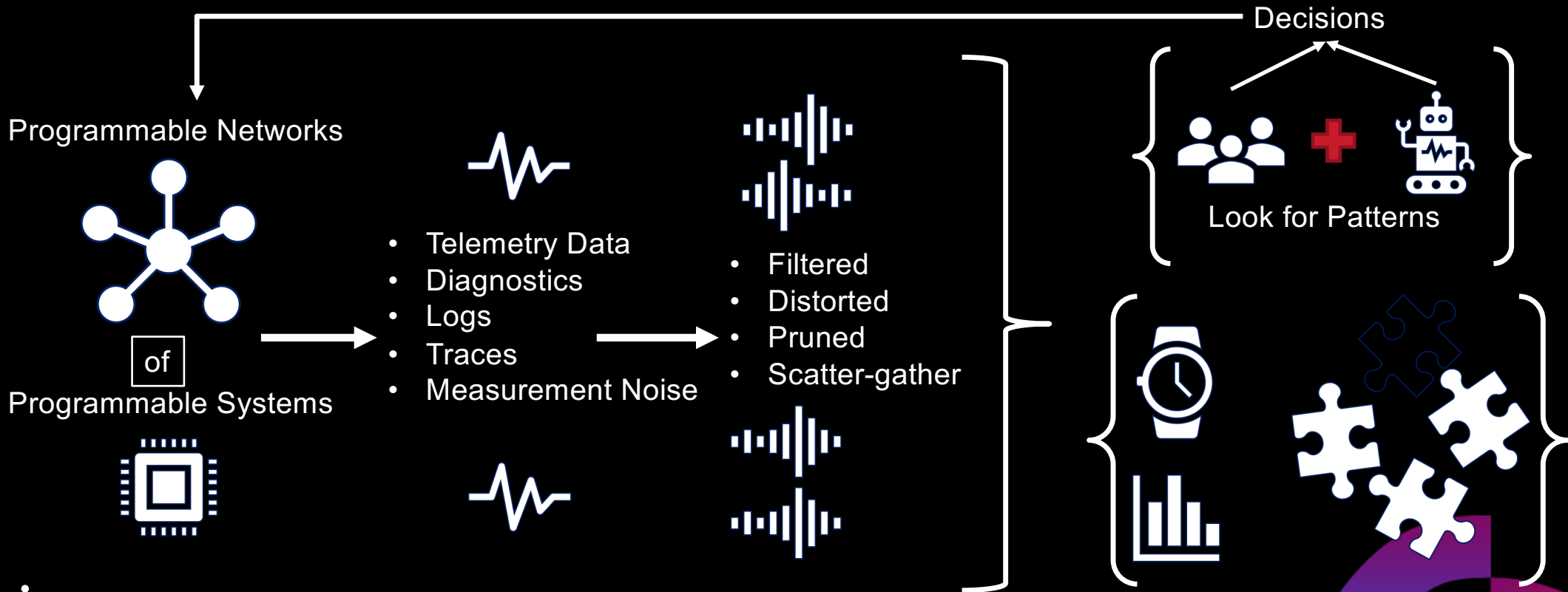
Elastic Search, Kibana, Plotly,…

Anurag Prakash, Cyrus Sadeghi, Alex Young and Peter Pieda

Dec 2018

Target Applications

- Network Time Correlated Debugging / Analysis
- Performance Characterization
- Always-on Tracing

Decisions

Programmable Networks

of

Programmable Systems

- Telemetry Data
- Diagnostics
- Logs
- Traces
- Measurement Noise

- Filtered
- Distorted
- Pruned
- Scatter-gather

Look for Patterns

Key Solution Requirements

Logging

- ➢ Easily added to large pre-existing on-box code base
- ➢ Conversion of existing logging to any new logging system must be largely an automated operation
- ➢ Off-box tools scalable to large networks with 100's of Network Elements
- ➢ Simple and fast enough to be practical for debugging on very small development systems
- ➢ Support seek and filter

Performance analysis

➢ Does not require a special load build (resident in a disabled state in all loads)

➢ Minimal impact when enabled
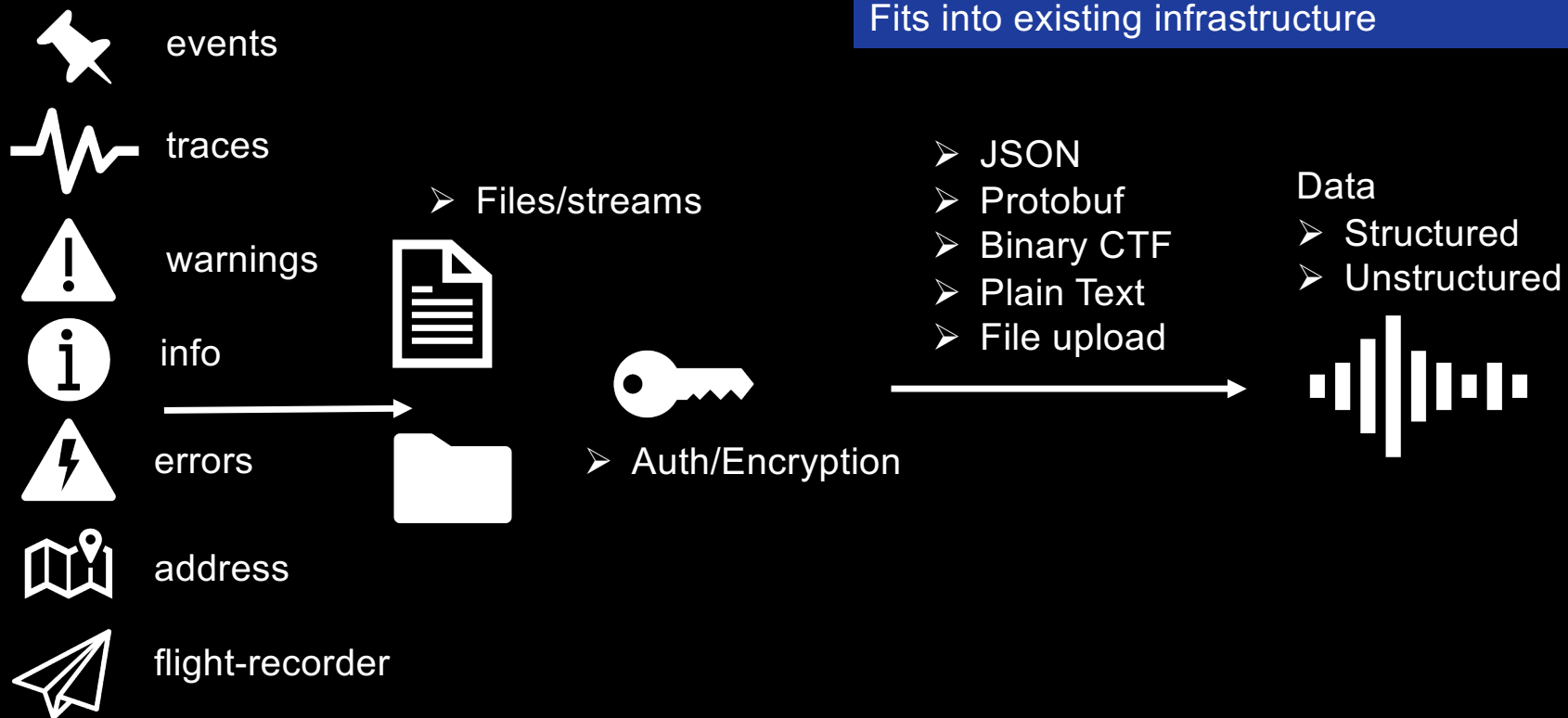
➢ Bottleneck analysis

➢ Benchmark & Comparative analysis

Always-on Tracing

- ➤ Analysis/Playback of field issues without needing to reproduce them
- ➤ Several hours of trace buffer (time between issues occurrence and data collection)
- ➤ Strict constraints on performance and size
- ➤ always-on without sacrificing system performance
- ➤ Capability to render a message or state sequence from a running system

On-Box Infrastructure

Constraints

Allow filters and on-off capability

Minimal impact on running system

Performance and size

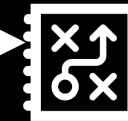Schema driven

Fits into existing infrastructure

events

traces

warnings

info

errors

address

flight-recorder

➢ Files/streams

➢ Auth/Encryption

➢ JSON
➢ Protobuf
➢ Binary CTF
➢ Plain Text
➢ File upload

Data
➢ Structured
➢ Unstructured

Off-Box Infrastructure

Constraints

Programmable
Capability to scale to requirements
Responsiveness
Visualization

Data
- Structured
- Unstructured

Distributed processing
- Proprietary code
- Logstash/plugins
- Schema driven parsers

<key, value> maps

- ML models

<key/set(val), counts> maps

<time, key, value> maps

- Elastic Search

<key/set(val), freq> maps

<diff-time, key, value> maps

<set, bins> maps

Intermediate Maps

Visualization
- Kibana/Grafana
- Plotly
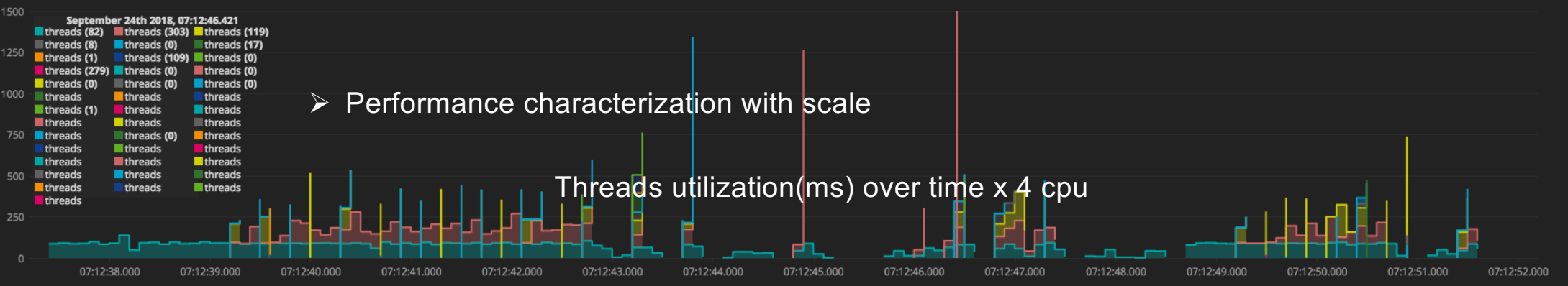- Matlab

Trace data

X-axis: Time
Y-axis: utilization (ms)
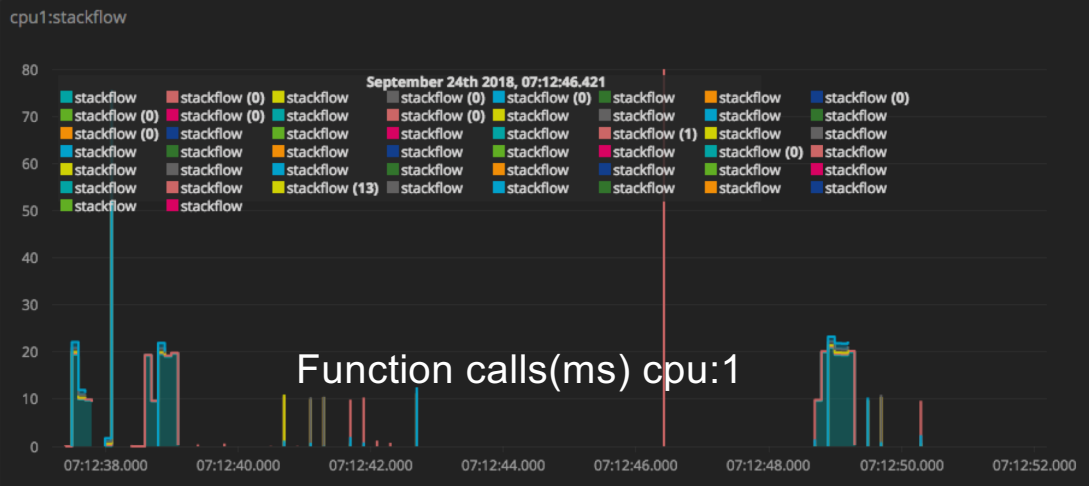Traces: threads or unique trace-backs

➢ Performance characterization with scale

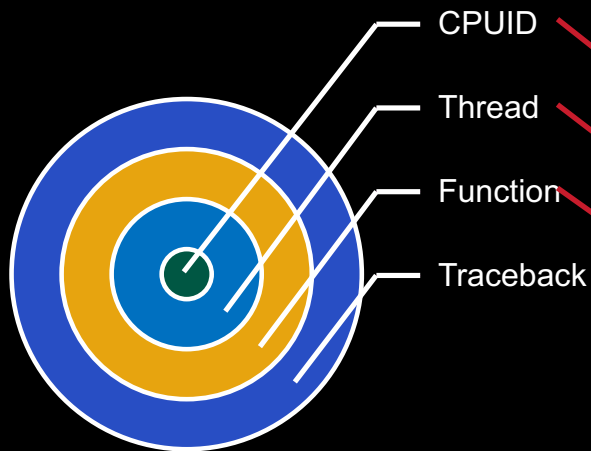Threads utilization(ms) over time x 4 cpu

Function calls(ms) cpu:0

Function calls(ms) cpu:1

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PHYLOGENETIC TREE

CPUID
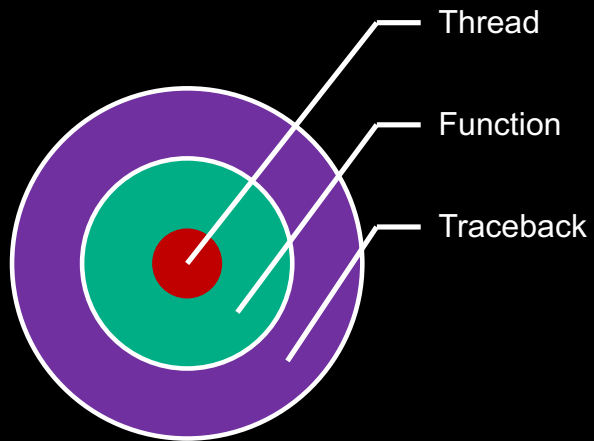Thread
Function
Traceback

Provides run time information on branching
- Can be tailored on
  - branch counts
  - utilization
  - traceback depths
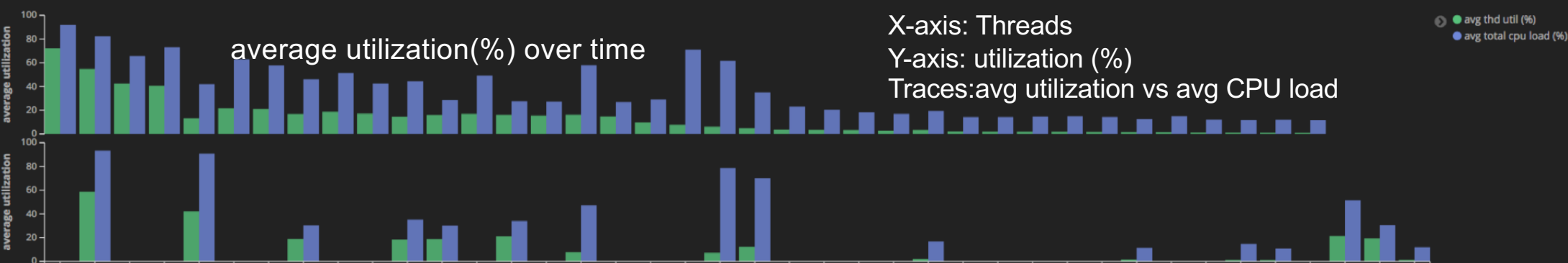 - unique function/thread/traceback counts
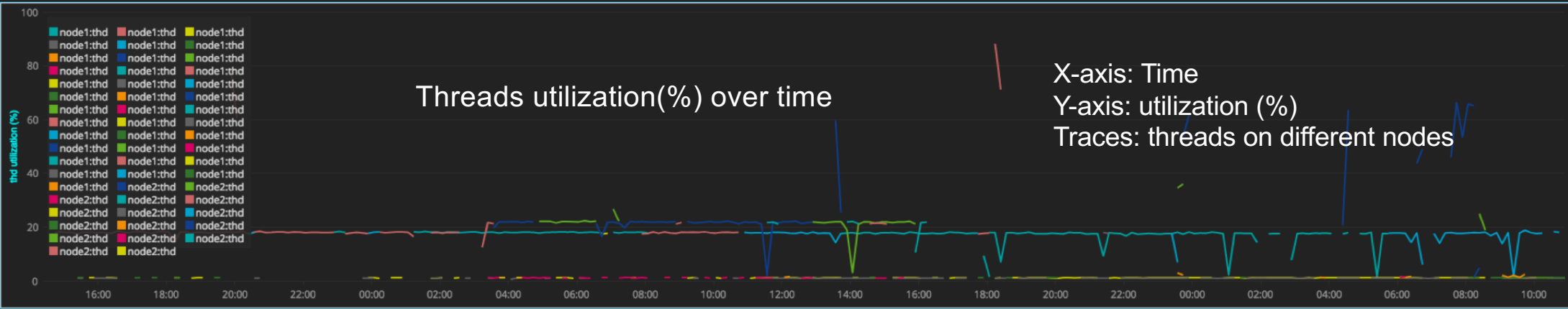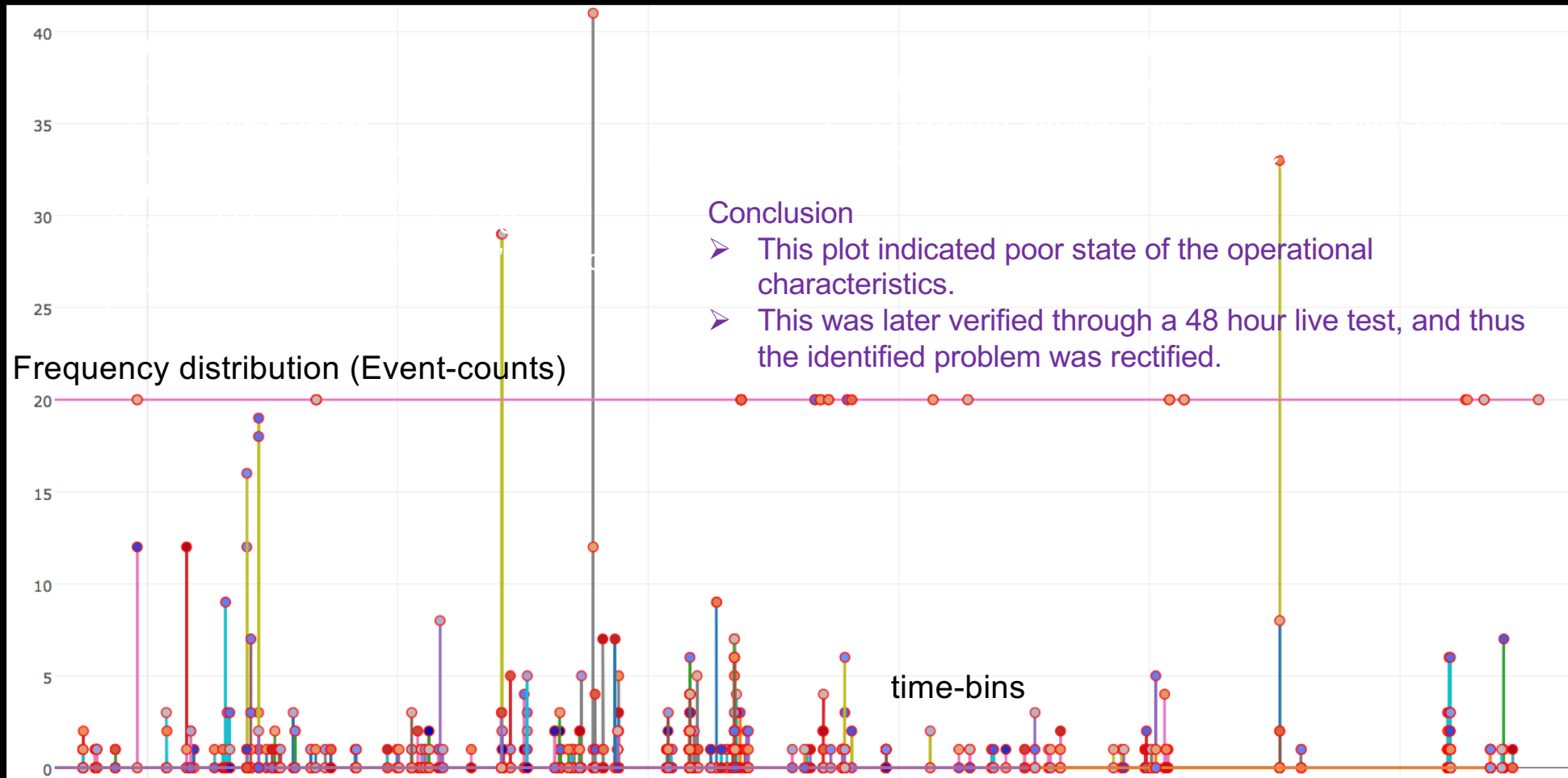 - …

Trace data

Memory characterization

X-axis: Time

Y-axis: { >0 memory allocations (per function)
          <0 memory free (per function)

Thread

Function

Traceback

Branching tree for memory allocations/frees

Telemetry data

Threads utilization(%) over time

X-axis: Time
Y-axis: utilization (%)
Traces: threads on different nodes

average utilization(%) over time

X-axis: Threads
Y-axis: utilization (%)
Traces:avg utilization vs avg CPU load

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Unknown patterns but known time range

Frequency distribution (Event-counts)

Conclusion
➢ This plot indicated poor state of the operational characteristics.
➢ This was later verified through a 48 hour live test, and thus the identified problem was rectified.
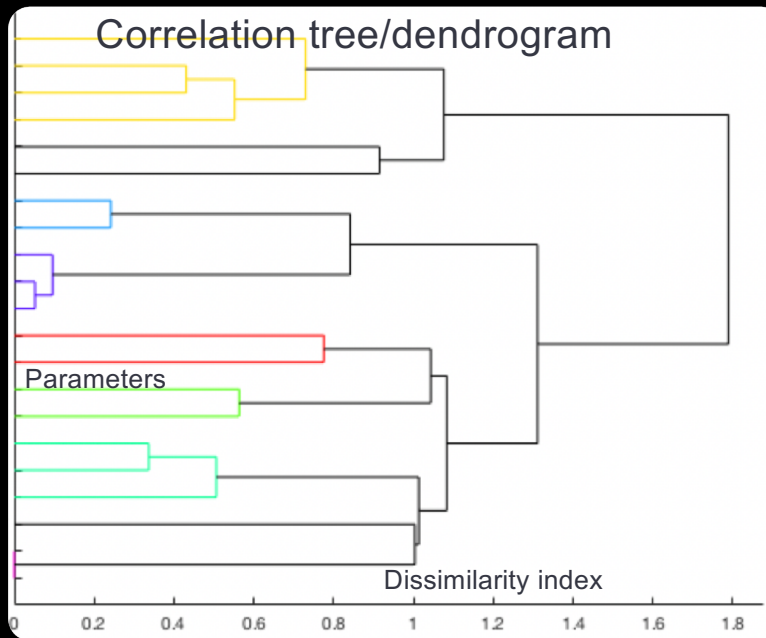
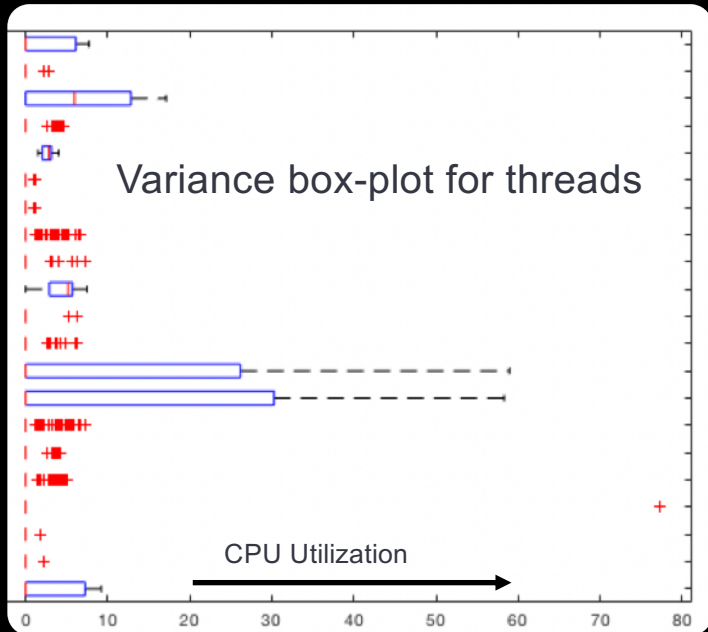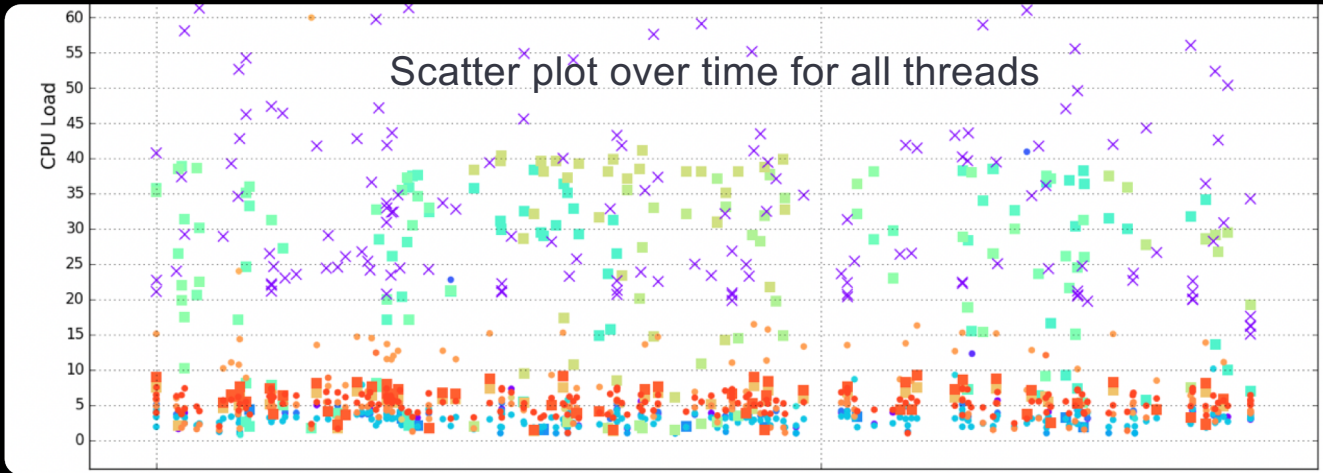time-bins

"g/re/p" for known patterns

UNSTRUCTURED DATA
- pattern A and B are of interest
- plot all such patterns over data collected across the network for few months

Conclusions
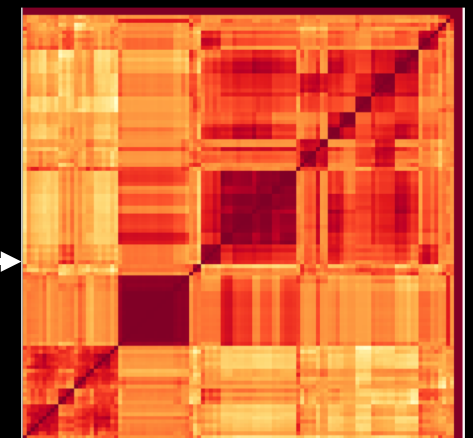- Pattern A or B happen independent
- Pattern A and B when happen together with higher frequency of pattern A was the problem

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Time series correlation

Scatter plot over time for all threads

CPU Load

Variance box-plot for threads

CPU Utilization

Correlation tree/dendrogram

Parameters

Dissimilarity index

Distributed processing
- Time series data
- Sequential on-line data
- Find correlation patterns

- **Variance plot gives an idea of system activity**
- **Correlation plots provide relationships for pattern identification**
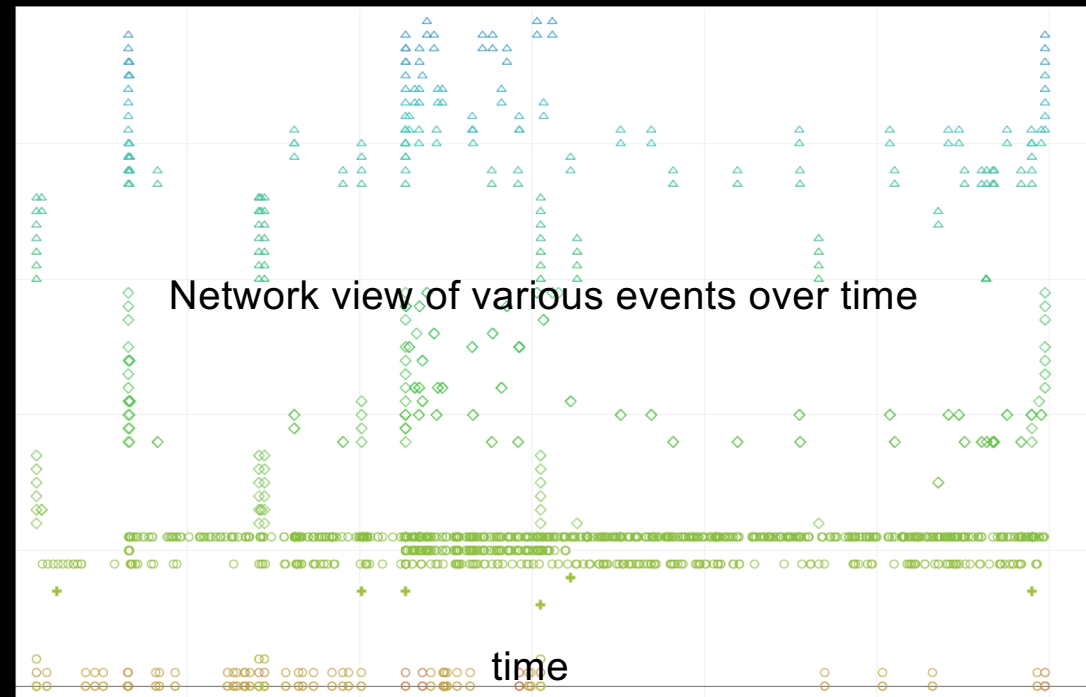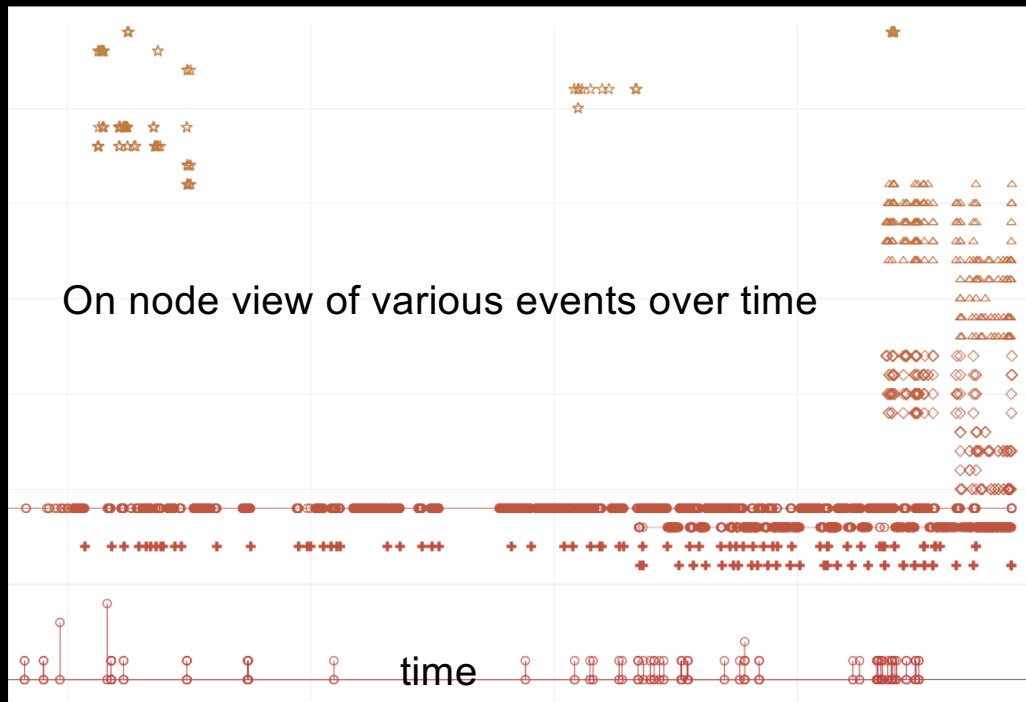
Heatmap
(symmetric/asymmetric)

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Unknown patterns (models)

Conclusion
- **The similarity amongst the two views indicated that the problem hops across systems, thus involved communication across elements**
- **Eventually lead to misconfiguration diagnosis**

- Problem had no known signature and was not specific to any known configuration
- Thus one approach was to seek comparisons between "nodal patterns vs network patterns"

On node view of various events over time

time

Network view of various events over time

time

Future

➢ Make existing infrastructure user friendly and faster for routine jobs

➢ Keep gathering and benchmarking the always-on tracing data

➢ Build and test new ML models on existing infrastructure

Questions ?

Thank You

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