



Go further, faster

# CLUEBOX: A Performance Log Analyzer for Automated Troubleshooting

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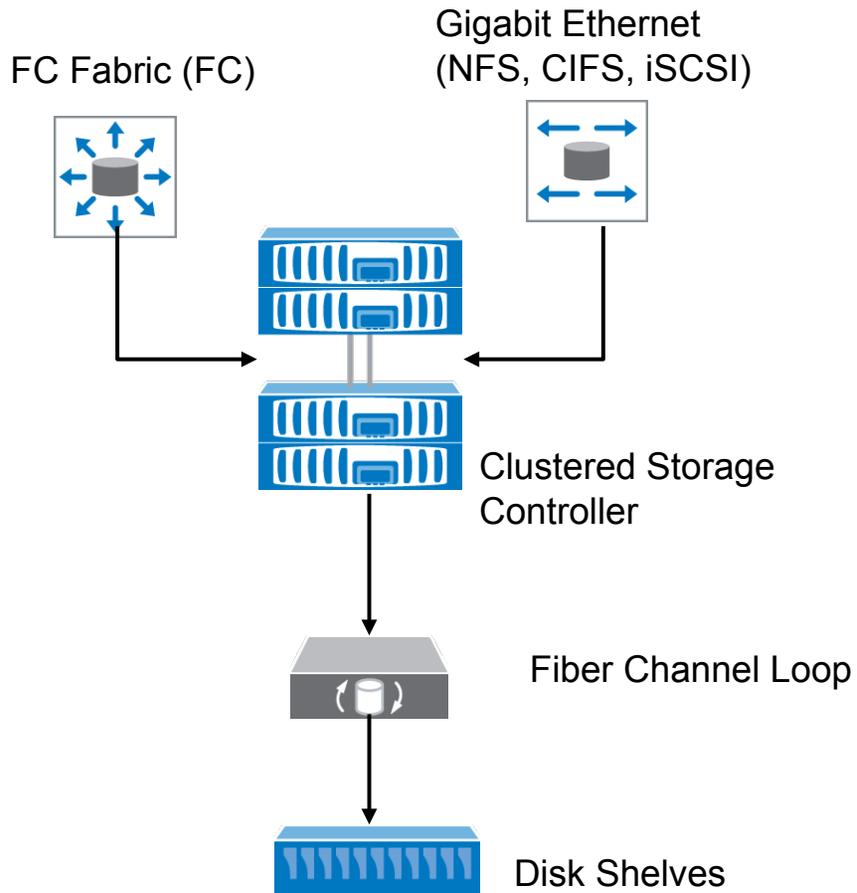


# The Problem

- Complex system deployments have ad-hoc but effective mechanisms for:
  - Data collection
  - Monitoring
  - Alerting
- ...but do not have good analysis tools
- What's available: detailed performance counters. Can we mine that to:
  - Characterize and identify workload?
  - help in the performance troubleshooting workflow?



# The Environment



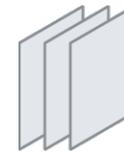
## File System Software



Aggregates  
RAID groups



Flexible Volumes



Snapshot Copies

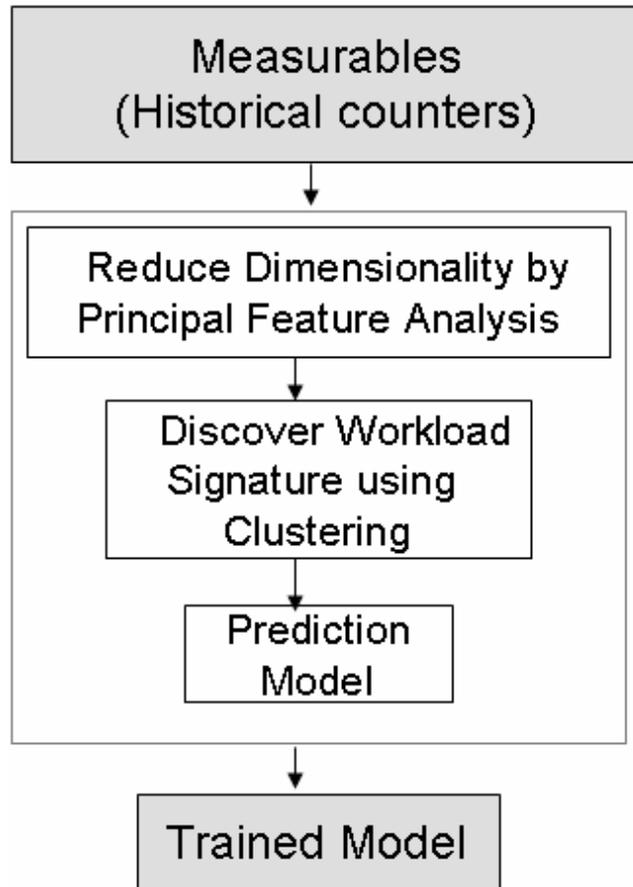


Replica Services

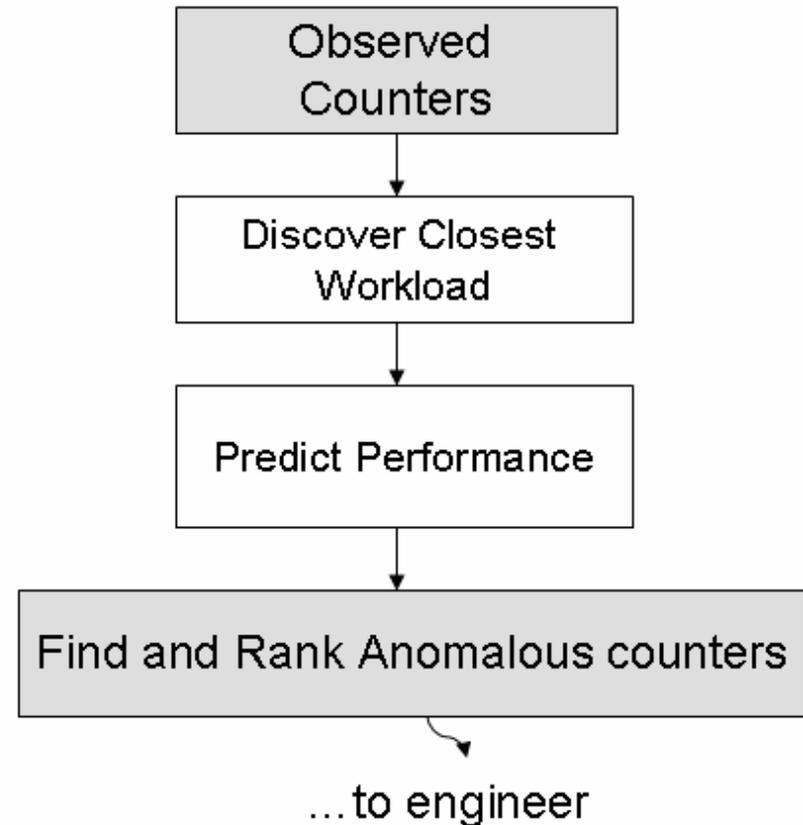


# CLUEBOX Workflow

## TRAINING

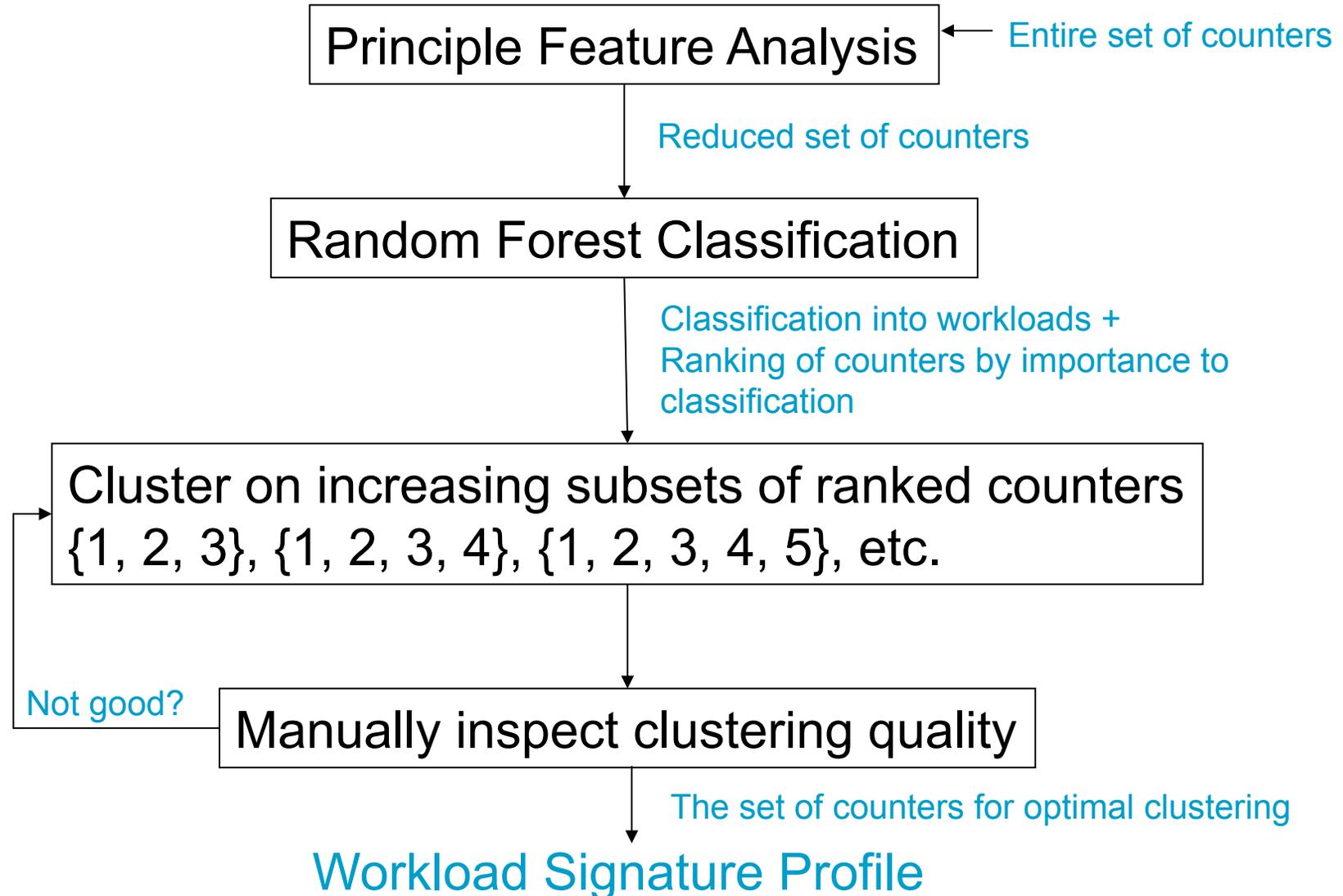


## USAGE





# Workload Identification





# Workload Identification: Evaluation

- SIO
  - 6 workloads, each with varying read/write ratios and sequential/random I/O ratios
- Cthon
  - 5 workloads, each exercising different sets of file system metadata operations
- PostMark
  - 2 workloads, each operating on different number of files and different file size ranges
- Sysbench
  - 5 workloads, each exercising database-like workloads

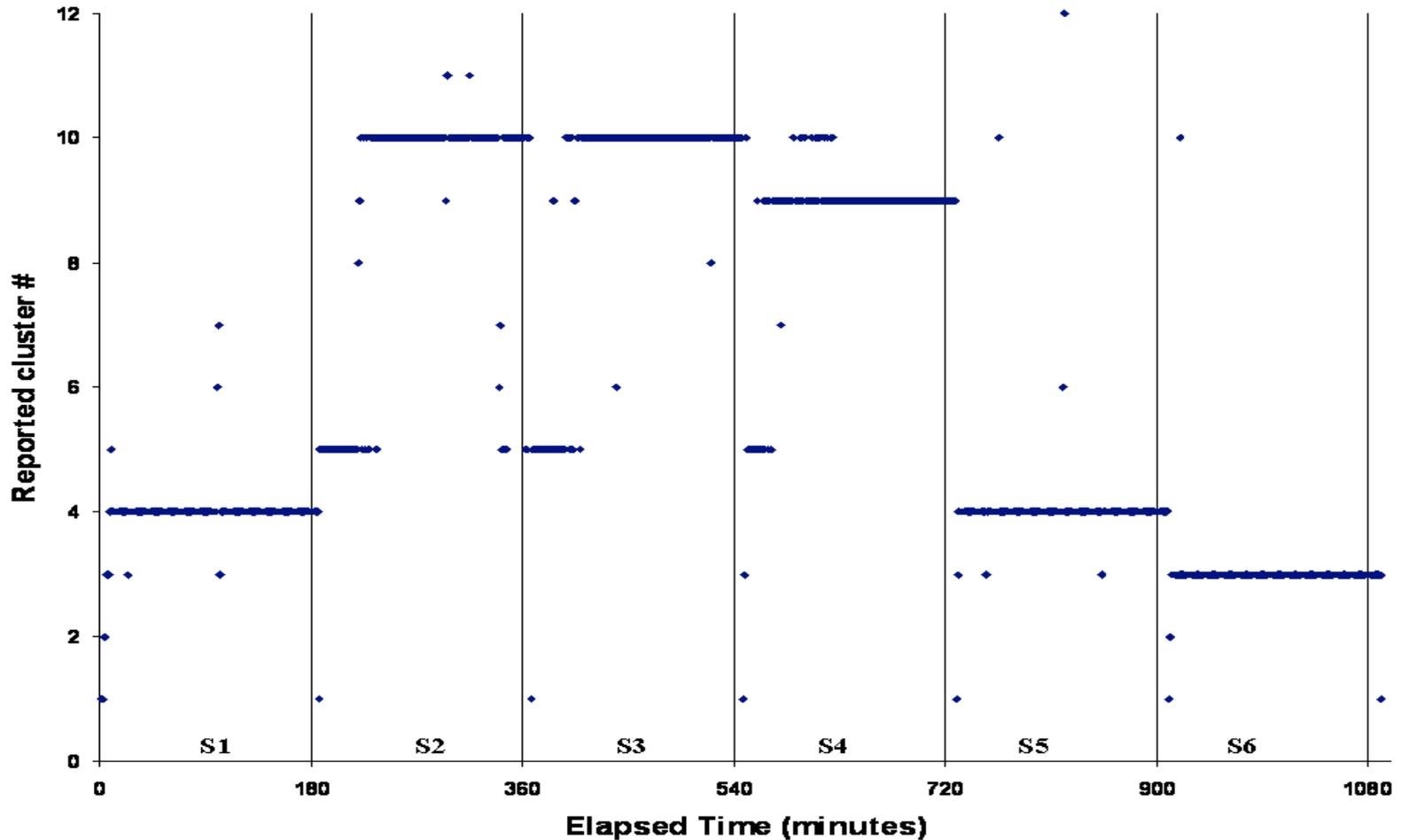


# Workload Identification: How Many Counters Do We Really Need?





# Workload Identification: Results



S1: Read 80%, Seq 80%

S2: Read 20%, Seq 80%

S3: Read 30%, Seq 90%

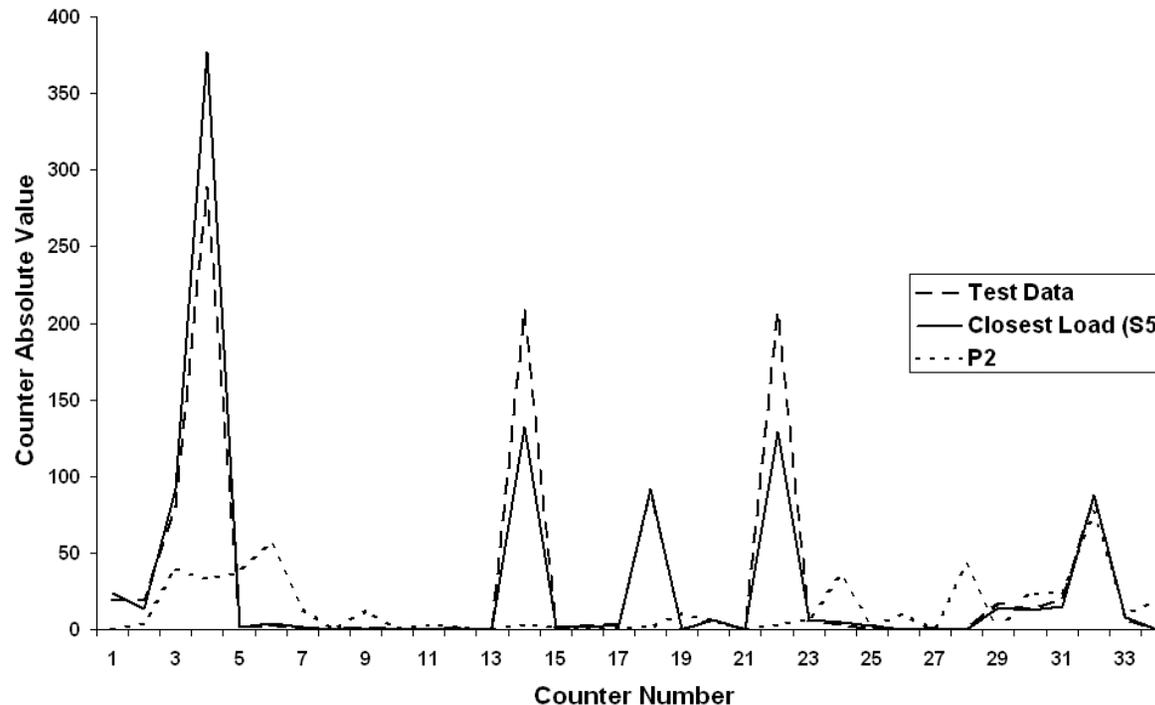
S4: Read 30%, Seq 10%

S5: Read 80%, Seq 90%

S6: Read 80%, Seq 10%



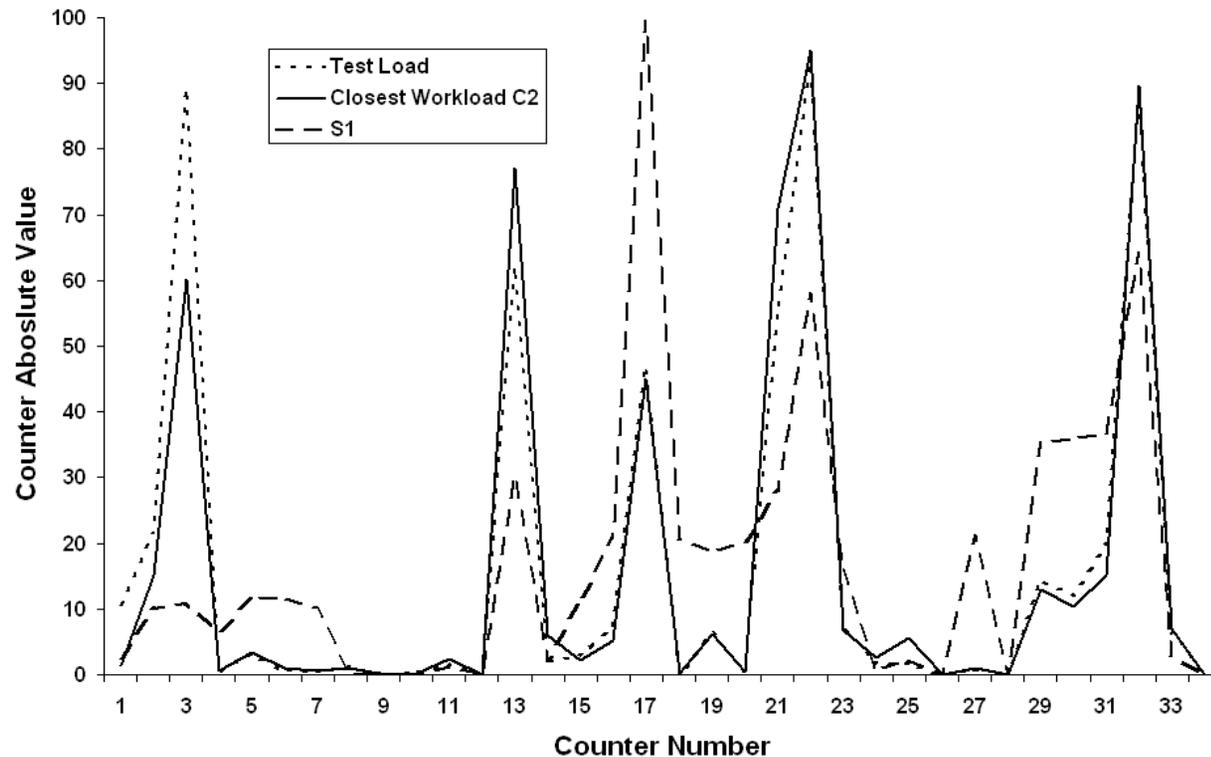
# Workload Identification: Results



- Known workloads training data contains:
  - S5: SIO, Seq Reads = 72%, Seq Writes = 18%, Random Reads = 8%, Random Writes = 2%
  - P2: PostMark, # Files =  $10^5$ , File Size = 1KB to 100KB
- Test workload: SIO, Seq Reads = 72%, Seq Writes = 8%, Random Reads = 18%, Random Writes = 2%



# Workload Identification: Results



- Known workloads training data contains
  - C2: Cthon Test 8 (symlink, readlink), # files = 1000, #symlinks = 1000
  - S1: SIO, Seq Reads = 64%, Seq Writes = 16%, Random Reads = 16%, Random Writes = 4%
- Test workload: Cthon Test8 with different parameters



# Anomaly Detection

- User: “the performance of the system was fine at Time T. I haven’t changed a thing since then, but now the latencies are very high”

Run the cluster medoids and Workload at T through RF and get proximities

Closest Workload

Predict counter values and diff with measured values

Rank counters in order of variable importance (predictive power of counter for latencies, given by RF)



# Anomaly Detection

- A handful of top-ranked counters were enough
- Anomalies in counters + Non-anomalous counters were both important
- An expert scanning this list diagnosed the root-cause rapidly
  - Conducive to a rule-based system at this point?



# Anomaly Detection: fsck-like load

Counter	Deviation from Prediction
Ifnet:e0:total_packets	-99.4%
Processor0:hard_switches	-63.6%
System:cpu_busy	305.6%
waf:restart_msg_cnt:BACK DOOR	99947%
Readahead:total_read_reqs	-100%
Waf:buf_hash_hit	7088%
Waf:new_msg_cnt:BACKD OOR	972.9%

- Readahead counters have dropped, so not a replication load
- Absence of anomaly in cp\_phase\_times counter, so no high amount of destaging from cache
- Buf\_hash\_hit is extremely high, which cannot be explained by repeated mounts and unmounts
- Only an fsck or similar scanner can explain the data



# Anomaly Detection: Local I/O load

Counter	Deviation from Prediction
Testaggr:cp_read_blocks	129%
Ifnet:e0:total_packets	8.2%
System:cpu_busy	359.9
Waf:buf_hash_hit	3045
Testaggr:total_transfers	164.2%

- system:cpu\_busy higher than predicted indicative of some other load
- ifnet:e0:total\_packets is not different, so not a network I/O load
- No other significant anomalies, so not a bookkeeping activity
- testaggr:total\_transfers higher implies significant amount of new I/O
- Only a separate I/O workload local to the storage controller can explain the symptoms



## What Next

- Test CLUEBOX on customer environments
  - Real performance problems
  - Real workloads
- Incorporate CLUEBOX into NetApp's performance log analysis workflows
  - AutoSupport Database
  - Support Case Resolution
  - Duplicate case/bug report Identification
- Figure out how to avoid re-training if system configurations are changed (e.g., a few more disks added)