



# Health monitoring & predictive analytics

To lower the TCO in a datacenter

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1. The opportunity
2. Our vision & implementation
3. Use cases
4. Summary

# The opportunity



# What if...

➤ Seagate offered you a technology that could help you



Improve datacenter efficiency



Optimize system management

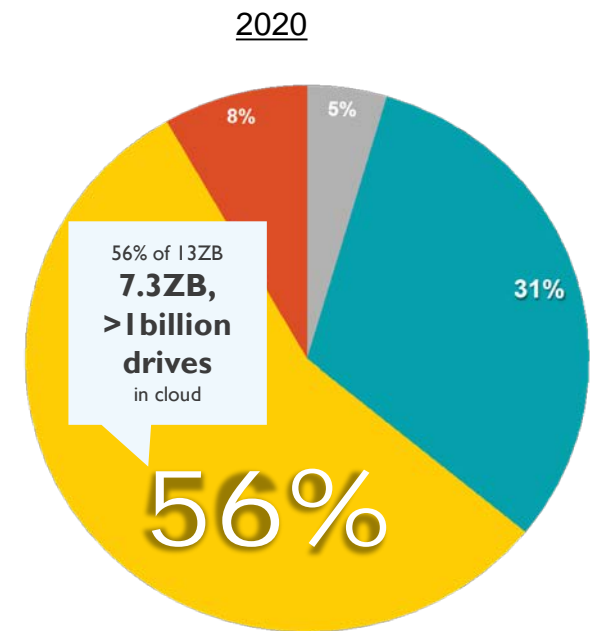


Reduce potential cost of operation

# The problem

## ▶ Failures in storage lead to costly outages

- ◆ **1 billion hard drives** will be used in cloud datacenters by 2020, highlighting the need to manage drive health at scale
- ◆ One total outage per datacenter is statistically expected every year
- ◆ 80% of those outages are not completely explained (or linked to root causes)
- ◆ \$700,000 is the average cost per incident
  - › \$8,000 is the average cost per minute of an unplanned outage
- ◆ **Up to 10% of datacenter accidents are related to storage**



Source: Seagate Strategic Marketing and Research 2013

# Better drive management will lower the TCO

## ▶ Top 4 challenges in drive management

### 1. Drive health monitoring

- Need reliable key performance indicators to track drive health status

### 2. Drive failure prediction

- “Ultimately, we want to know when our drives will fail so we can take actions before that happens”

### 3. Drive failure diagnostics and management automation

- Need to correctly identify and quickly resolve issues
- Need to prevent false alerts to reduce cost of failure handling

### 4. Drive lifespan extension

- Need to know how to optimize operating environment for better reliability
- Need to reuse partially good drives (should be possible with in-drive diagnostic, IDD)



# Our vision & implementation



# Our vision

Monitoring, analytics, prediction and control – “The internet of things”<sup>2</sup>

Data Aggregation



## MONITORING



Global Access

## ANALYTICS



Quick Issue Resolution



## CONTROL

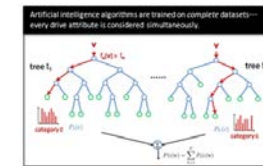
Actionable Decisions

- Report storage health
  - Run drive self-test
- Shut-down systems
  - Repair drives
  - Run auto-FA
- Point at an issue
- Highlight inefficiency
- Predict reliability
- Detect anomalies



Data Center

## PREDICTIONS



Early Warning System



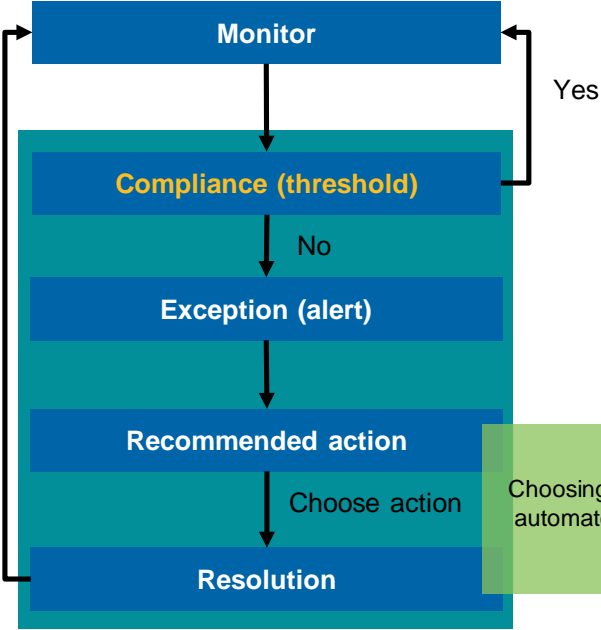
- Drive-centric health monitoring
- Analytics and predictive models
- Closed-loop automation



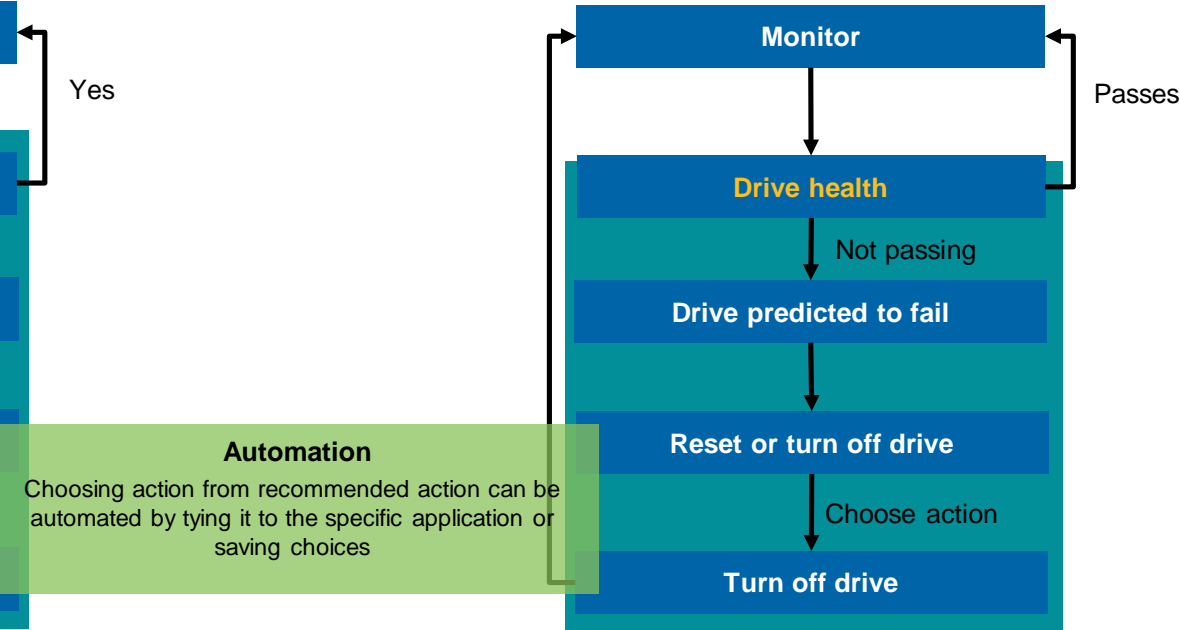
# Functional diagram

## Monitoring, intelligent decisions and automation

Closed-loop automation



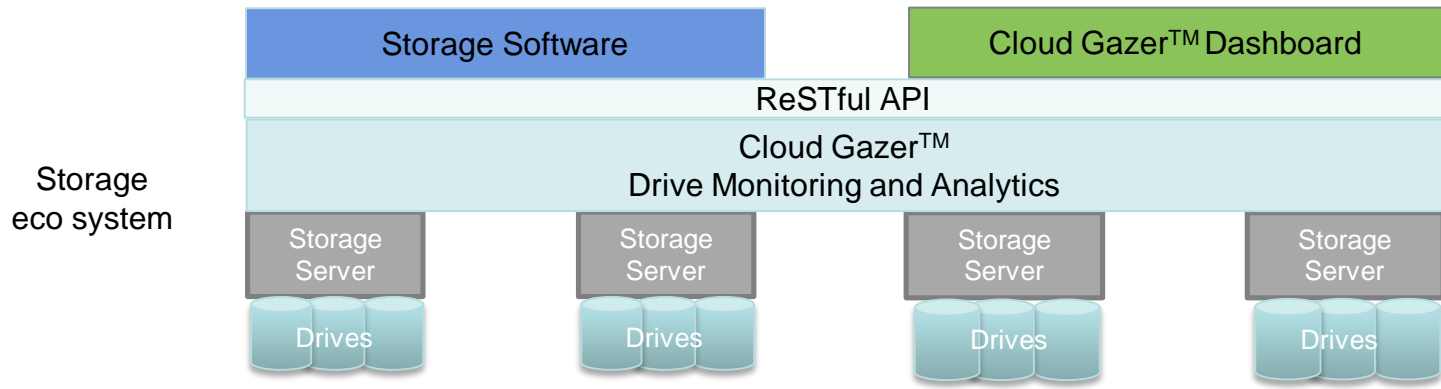
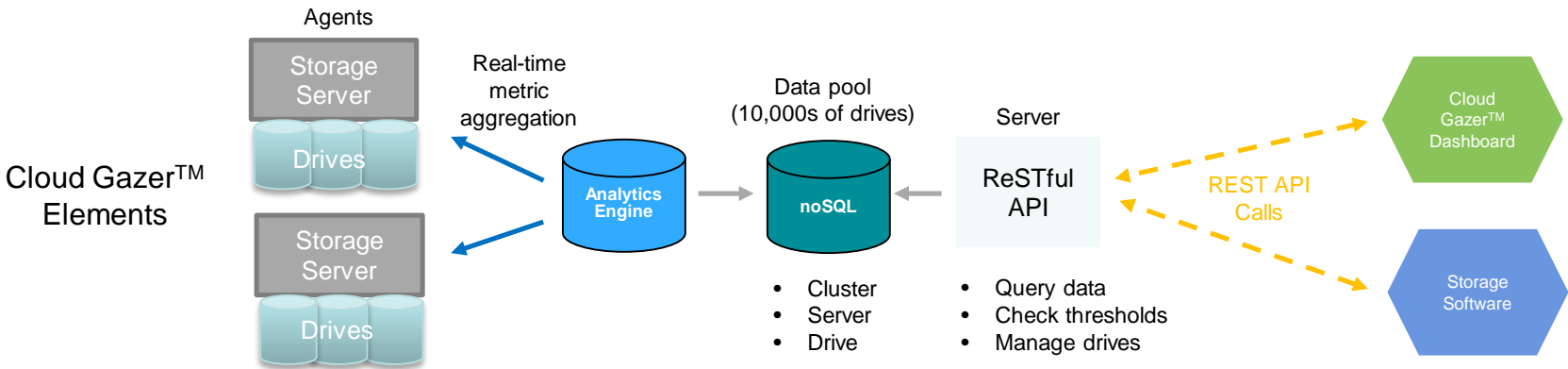
Example



**Automation**  
Choosing action from recommended action can be automated by tying it to the specific application or saving choices

# Implementation

## Architecture overview

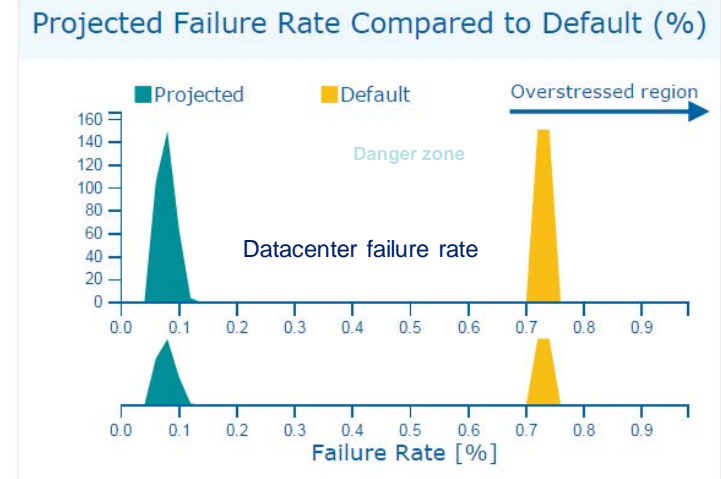
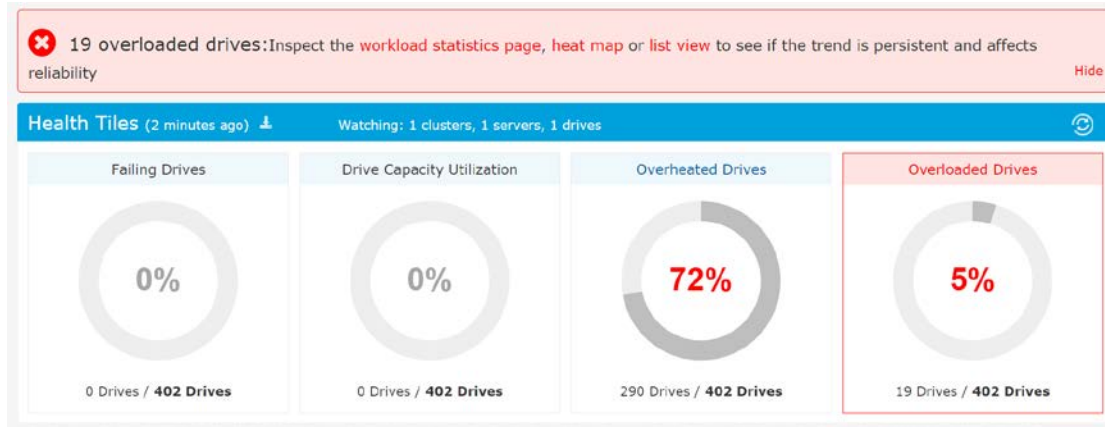


# Use cases



# Compliance (thresholds)

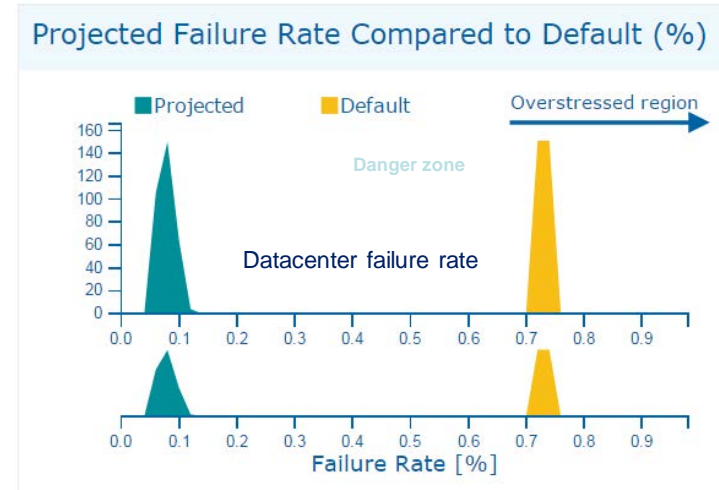
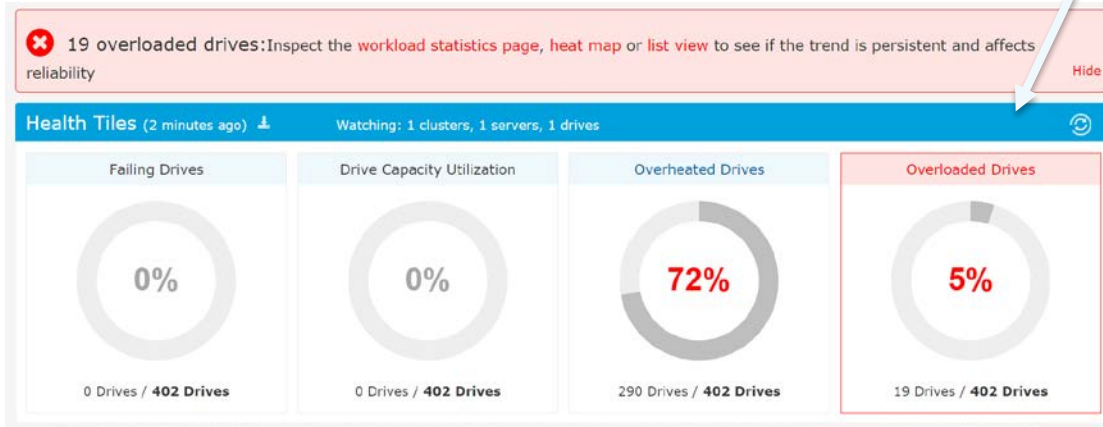
## ➤ Degradation and performance warnings



# Compliance (thresholds)

## ➤ Degradation and performance warnings

**Overload detection**  
Detecting and reporting when drive load exceeds design limits

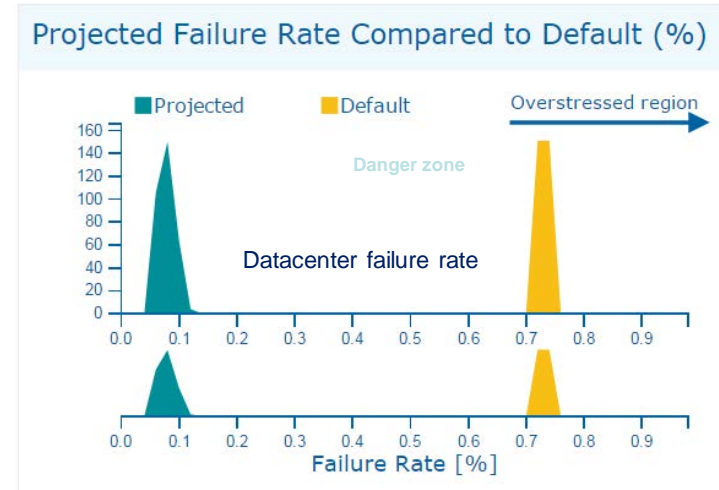
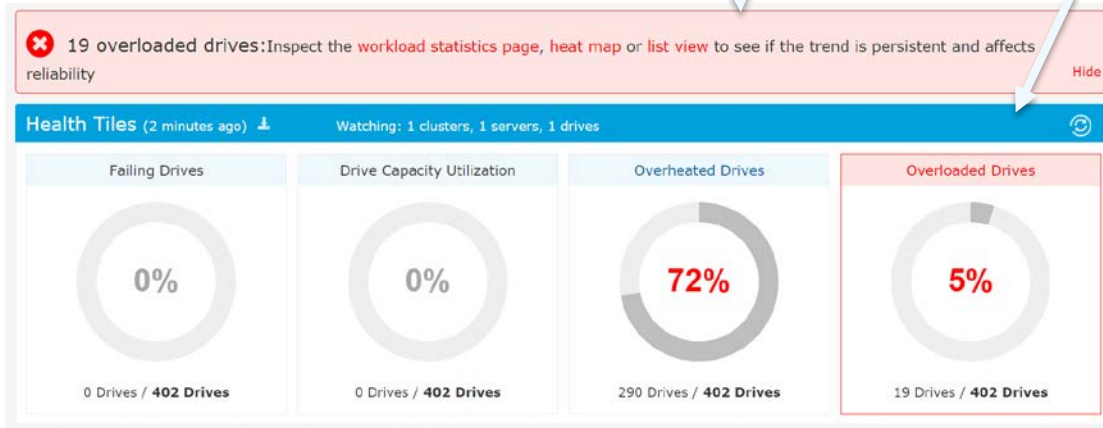


# Compliance (thresholds)

## ➤ Degradation and performance warnings

**Recommended action**  
How to increase drive reliability

**Overload detection**  
Detecting and reporting when drive load exceeds design limits



# Compliance (thresholds)

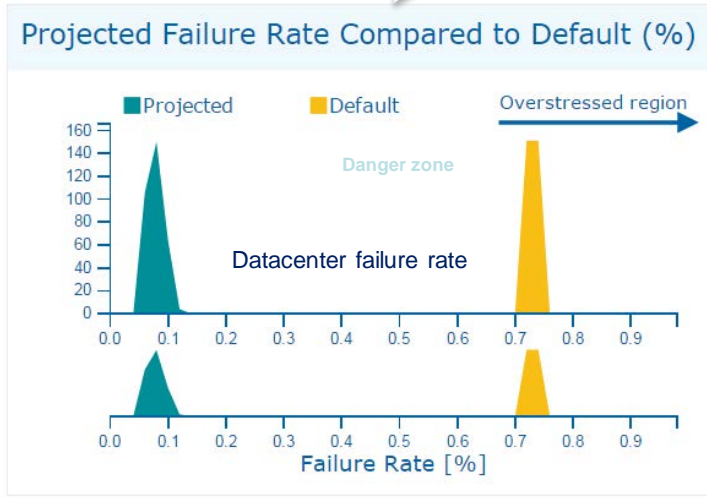
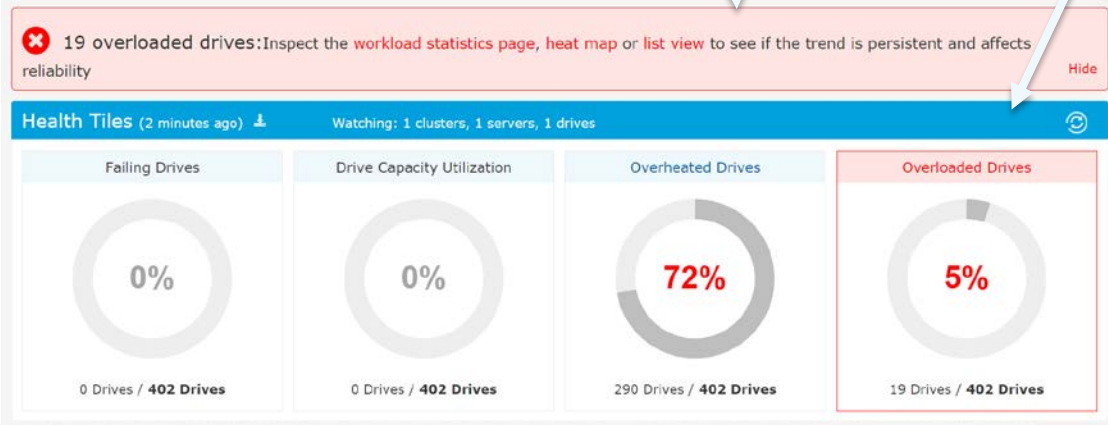
## Degradation and performance warnings



**Recommended action**  
How to increase drive reliability

**Overload detection**  
Detecting and reporting when drive load exceeds design limits

**HDD population failure rate**  
Measuring stress and estimating failure acceleration of the disk drive population in real time. Relies on the proprietary failure prediction algorithms





# Compliance (thresholds)

## ► Degradation and performance warnings

### Failure detection

Warning about expected drive failures. Relies on the proprietary failure prediction algorithms that use unsupervised machine learning techniques. Expected average failure prediction time window is from 9 days to 12 days.

### Recommended action

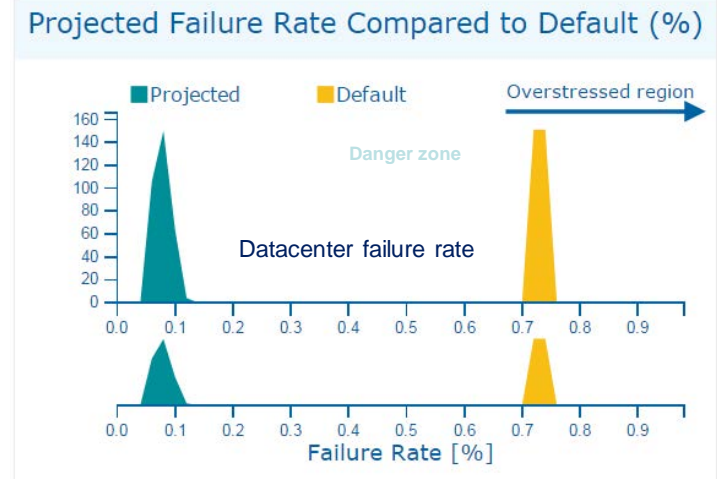
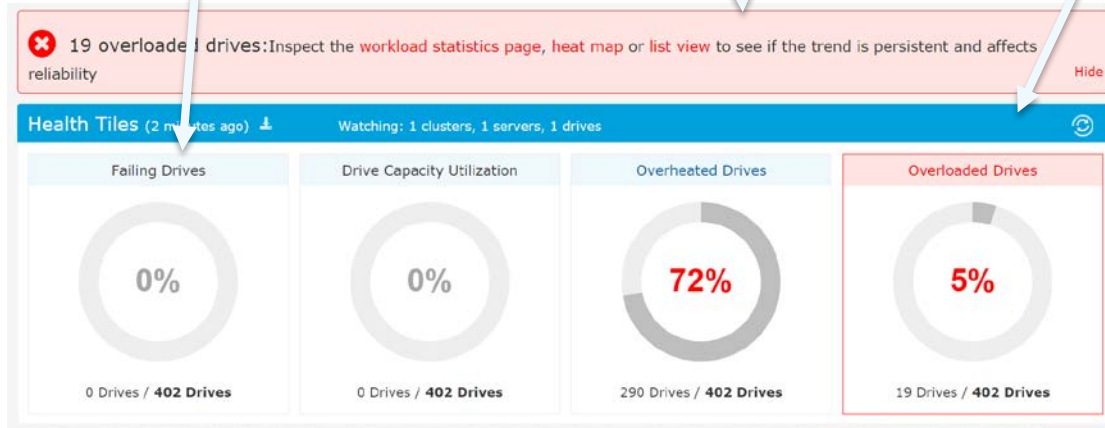
How to increase drive reliability

### Overload detection

Detecting and reporting when drive load exceeds design limits

### HDD population failure rate

Measuring stress and estimating failure acceleration of the disk drive population in real time. Relies on the proprietary failure prediction algorithms

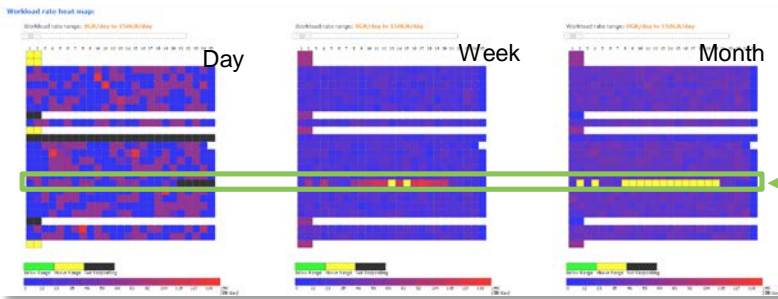




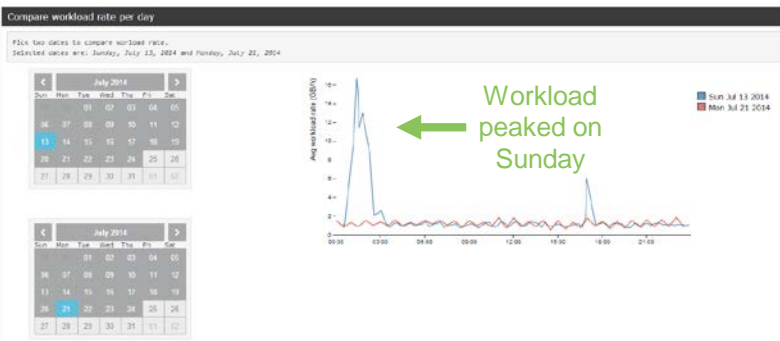
# Workload optimization

▶ Drive visibility tools to improve workload balancing

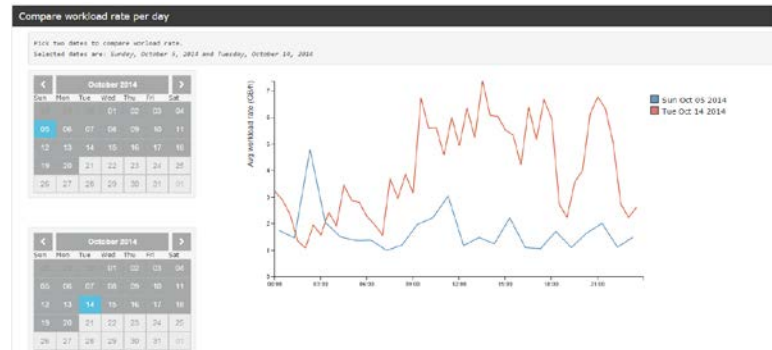
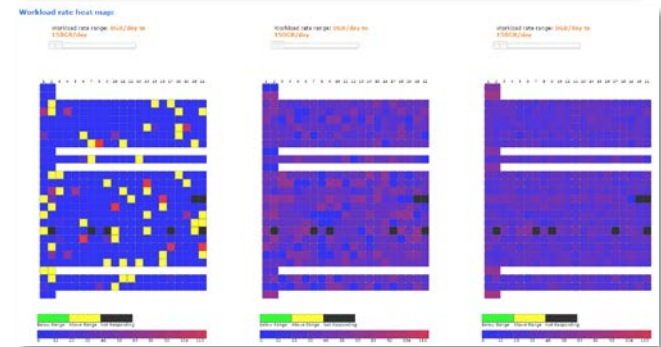
## Before Load balancing issues



Workload predominantly hitting one server

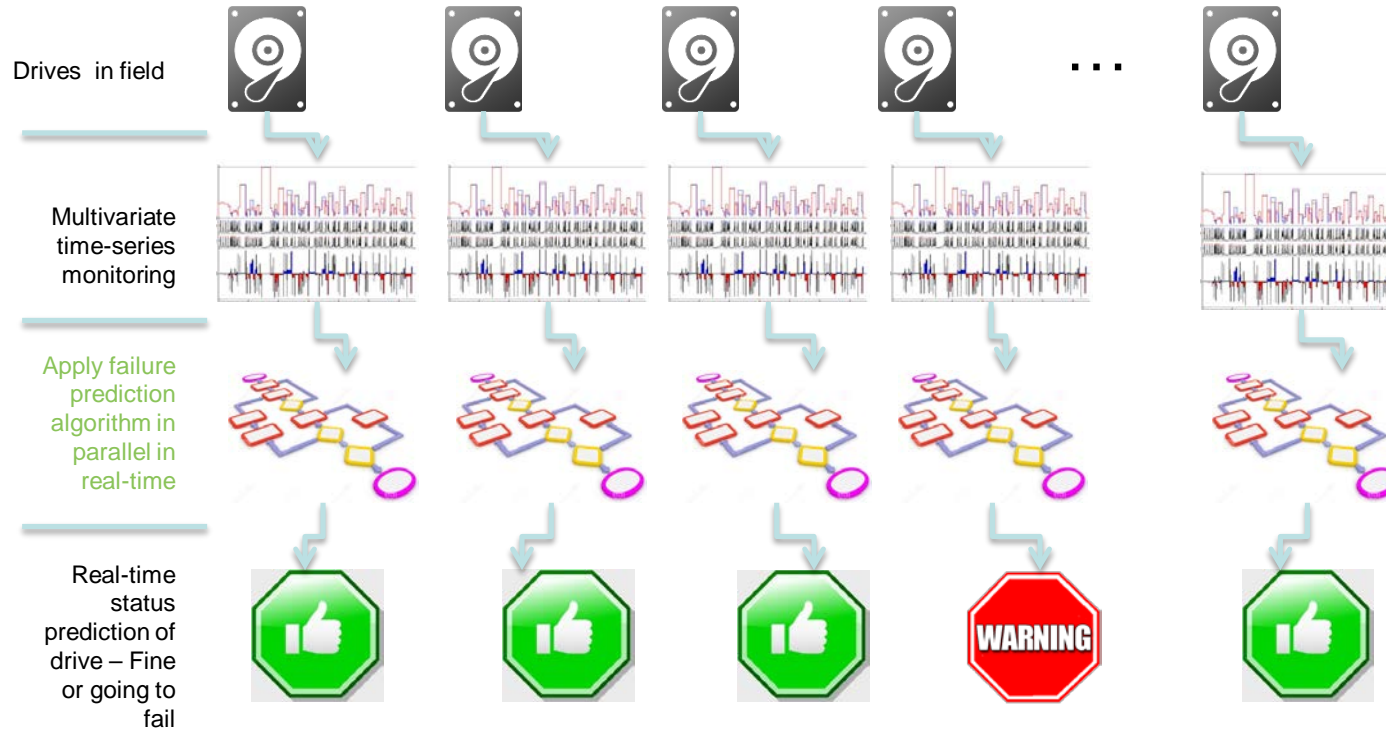


## After Workload distributed over servers and time



# Unsupervised machine learning and failure prediction

▶ No interaction between drive set, no prior knowledge



For now, an average failure prediction window is on the order of 9 to 12 days  
Failure prediction accuracy ranges from 55% to 90%

# Prediction and follow up actions

Heat map indicates drives at risk and you can issue drive tests (DST, IDD,...) to resolve or corroborate

Schedule Short Self Test    Schedule Long Self Test    Schedule Short IDD    Schedule Long IDD    Turn off drives

Schedule long self test on selected drives OK Cancel

Select all

- proxy-2
- 10.26.128.16
- proxy-3
- storage-3-1
- storage-3-2**
- storage-3-3
- storage-3-4
- storage-3-5
- storage-3-6
- lb-1
- storage-3-7
- lb-2
- storage-2-1
- storage-2-2
- storage-2-3
- storage-2-4
- storage-2-5

Server	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25
ev1	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
proxy-2	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
10.26.128.16	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
proxy-3	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-3-1	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-3-2	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-3-3	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-3-4	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-3-5	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-3-6	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
lb-1	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-3-7	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
lb-2	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-2-1	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-2-2	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
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storage-1-5	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
ev1-cc1	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-1-6	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
storage-1-7	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green
proxy-1	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green	Green

Legend: ■ Normal    ■ Predicted to fail    ■ Not Responding

- Short Drive Self Test

In Progress

Recent

+ Long Drive Self Test

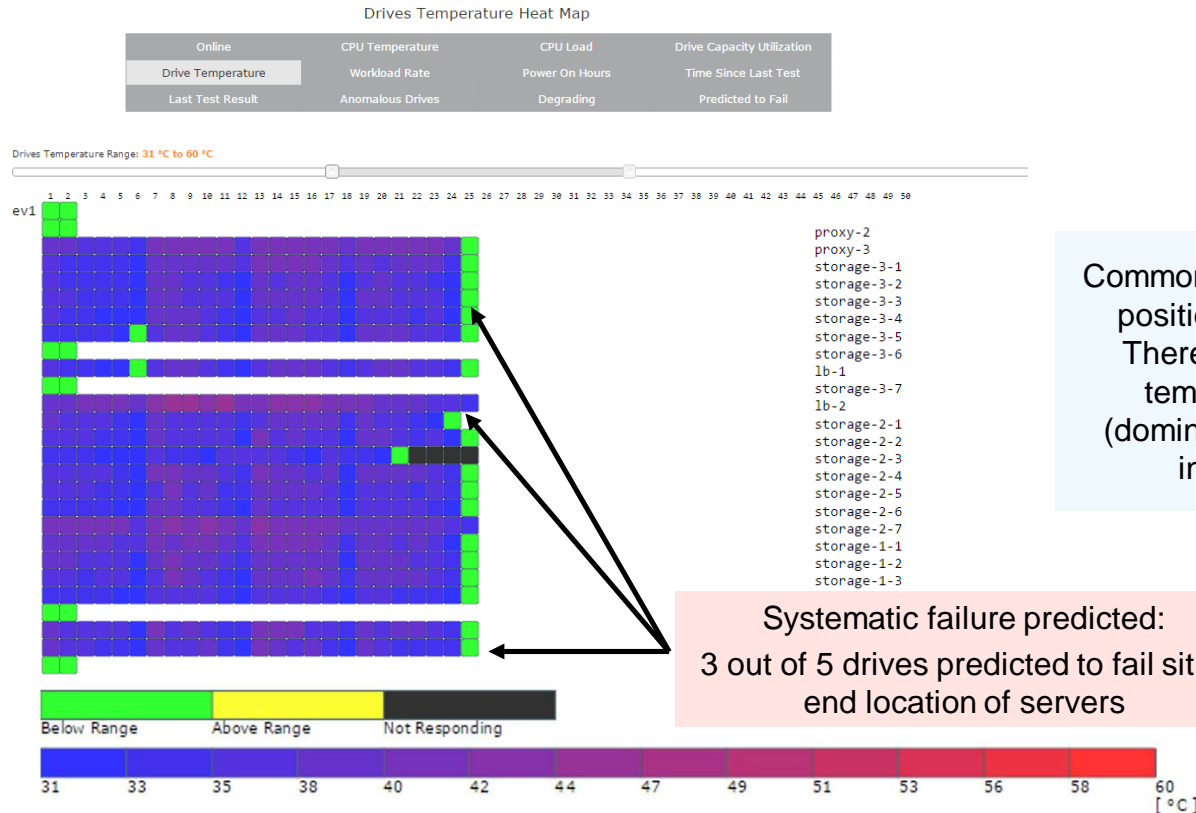
+ Short In Drive Diagnostic

+ Long In Drive Diagnostic

**Systematic failure predicted: 3 out of 5 drives predicted to fail sit in end location of servers**

# Find failure triggers

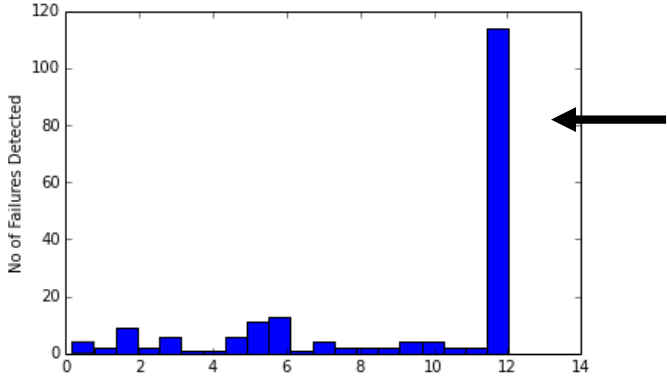
- ▶ Root cause tools including a drive temperature heat map can help you triage the cause of your drive issues



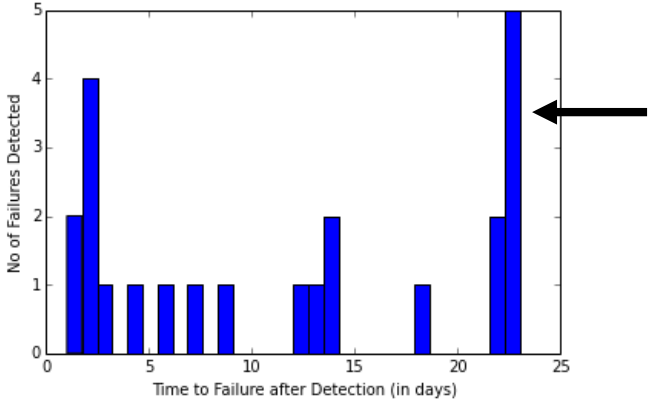
Common factors for drives in the end position is a cooler temperature. Therefore increasing the server temperature may reduce the (dominant) failure mechanism and increase drive reliability

# Failure prediction lead time

▶ We can predict drives will fail on average 9 -10 days before the failure



Case study 1, we predicted most drives (118 drives) to fail 12 days prior to failure



Case study 2, we predicted 5 drives to failed 23 days prior to failure, 2 drives 22 days prior to failure,... 2 drives just one day in advance

Currently catch 55-90% of failures ahead of time

# Summary



# Why Cloud Gazer™?

- Truly drive-centric management tool for the cloud
- Most efficient tool for extracting drive health information using Seagate IP
  - Nobody knows drives better than us
  - Freeware utilities are frequently wrong

- Runs on any Linux system with little overhead (<1%)

## Windows is next

- Data can be collected, monitored and analyzed locally or in the Cloud
- ReSTful API to interact with other software
- New analytics, prediction, AI, and control capabilities are added continually
- Drive repair will be possible with in-drive diagnostic
- Enclosure control will be possible by summer 2015

## Simply SMARTer

Attribute	Seagate's CloudGazer*		Competition	
	SATA	SAS	SATA	SAS
Raw Error Rate	Yes	Yes	Partial	No
Spin-Up Time	Yes	Yes	No	No
Start/Stop Count	Yes	Yes	Yes	No
Retired Sectors Count	Yes	Yes	No	No
Seek Error Rate	Yes	Yes	Partial	No
Power On Hours	Yes	Yes	Partial	No
Power Cycle Count	Yes	Yes	Yes	No
Reported Uncorrectable	Yes	Yes	No	No
Command Timeout	Yes	Yes	Partial	No
High Fly Writes	Yes	Yes	Yes	No
Emergency Retract Count	Yes	Yes	Yes	No
Load/Unload Count	Yes	Yes	Yes	No
Temperature	Yes	Yes	Yes	No
ECC Count	Yes	Yes	No	No
Load Cycle Count	Yes	Yes	Yes	No
Pending Sparring Count	Yes	No	No	No
Head Flight Hours	Yes	No	Partial	No
Lifetime Writes	Yes	Yes	Partial	No
Lifetime Reads	Yes	Yes	Partial	No
Flags1	Yes	Yes	no	No
RV Abs Mean	Yes	Yes	no	No
Motor Power	Yes	Yes	No	No
Critical Event Errors	Yes	Yes	No	No

\*Seagate drives

**Questions?**

