ORACLE®

Machine Learning Diagnostics Using Oracle Autonomous Health Framework



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Safe Harbor Statement

The following is intended to outline our general product direction. It is intended for information purposes only, and may not be incorporated into any contract. It is not a commitment to deliver any material, code, or functionality, and should not be relied upon in making purchasing decisions. The development, release, and timing of any features or functionality described for Oracle's products remains at the sole discretion of Oracle.



Program Agenda

- 1 Introducing Applied Machine Learning for Operations
- 2 Applied Machine Learning for Real-time Prevention
- Applied Machine Learning for Rapid Recovery
- 4 ODA Management Appliance Profile
- For Further Information / Q & A

Program Agenda with Highlight

- Introducing Applied Machine Learning for Diagnostics
- 2 Applied Machine Learning for Real-time Prevention
- 3 Applied Machine Learning for Rapid Recovery
- 4 ODA Management Appliance Profile
- 5 For Further Information / Q & A

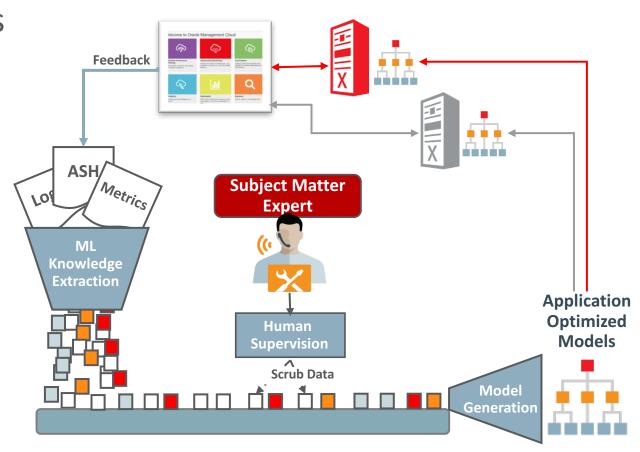
Why **Applied** Machine Learning?

- Brings an application's perspective versus a platform toolkit viewpoint
- Brings data science, algorithms, and domain expertise together
- Packages machine learning into usable, real-world operational algorithms and models that are applied at runtime
- Produces results and recommendations easily understood and trusted by non-data scientist/analyst end-users



Applied Machine Learning for Diagnostics

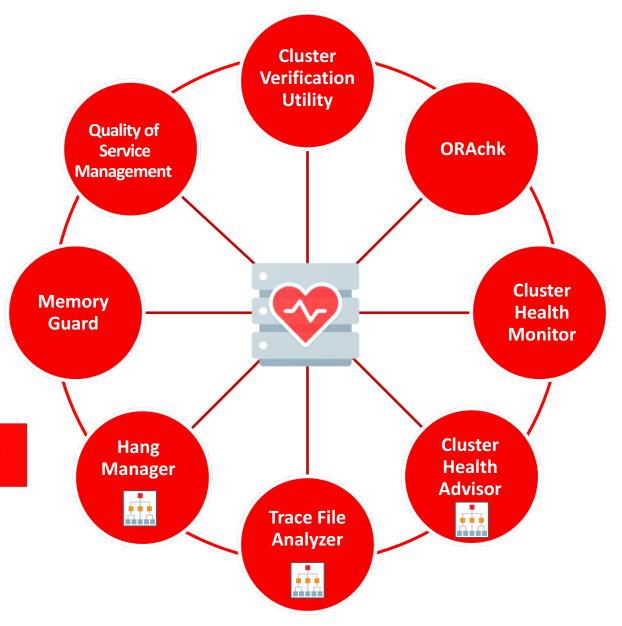
- Generic ML-extracted Data Clusters are insufficient for diagnostics
- Operational data correlation does not determine root cause
- Trusted root cause determination critical to swift corrective actions
- Algorithms selected and models built require domain expertise
- Models refined via field feedback



Oracle 12c Autonomous Health Framework

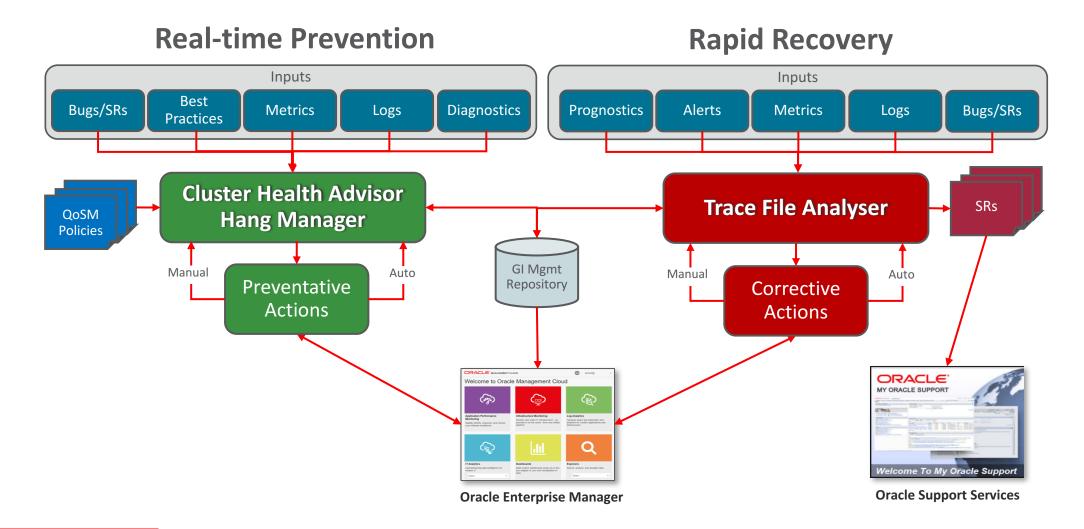
Powered by Applied Machine Learning







Applied ML in Oracle Autonomous Health Framework





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Applied Machine Learning – Cluster Health Advisor (CHA)

- Monitors in real-time Oracle database* systems and their hosts
 - Detects early impending as well as ongoing system faults
 - Diagnoses and identifies the most likely root causes
 - Provides targeted actions for prevention or escalation of DB/server problems
 - Generates relevant alerts and notifications for rapid response
- Released in 12.2 and currently under test by major RAC customers for production

* Currently RAC/R1N Databases only



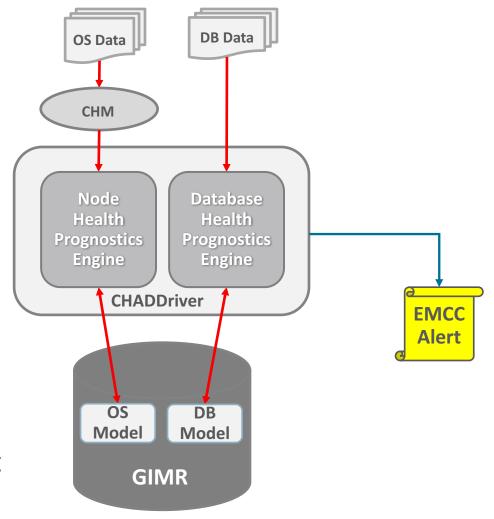
Cluster Health Advisor - Scope of Problem Detection Best Effort Immediate Guided Diagnosis

- Over 30 node and database problems have been modeled
- Over 150 OS and DB metric predictors identified
- Problem network model created based upon its signature
- Problem Detection in 12.2.0.1 includes
 - Interconnect , Global Cache and Cluster Problems
 - Host CPU and Memory , PGA Memory stress
 - IO and Storage Performance issues
 - Reconfiguration and Recovery issues
 - Workload and Session abnormal variations



Cluster Health Advisor (CHA) Architecture Overview

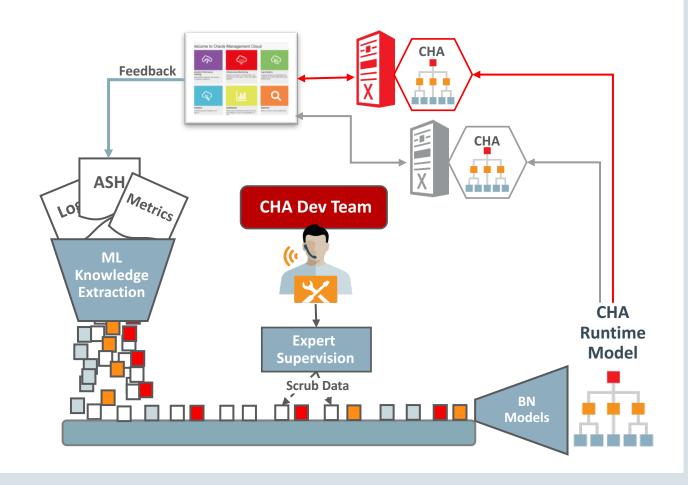
- cha Cluster node resource
- Single Java oracle.cha.server.CHADDriver daemon per node
- Reads Cluster Health Monitor data directly from memory
- Reads DB ASH data from SMR w/o DB connection
- Uses OS and DB models and data to perform prognostics
- Stores analysis and evidence in the GI Management Repository
- Sends alerts to EMCC Incident Manager per target



Applied Machine Learning – Cluster Health Advisor

Discovers Potential Cluster & DB Problems

- Actual Internal and External customer data drives model development
- Applied purpose-built Applied ML for knowledge extraction
- Expert Dev team scrubs data
- Generates Bayesian Network-based diagnostic root-cause models
- Uses BN-based run-time models to perform real-time prognostics





Cluster Health Advisor

Data Sources and Data Points

A CHA *Data Point* contains > 150 signals (statistics and events) from *multiple sources*

DB (ASH, AWR session, system and PDB statistics) OS, ASM, Network

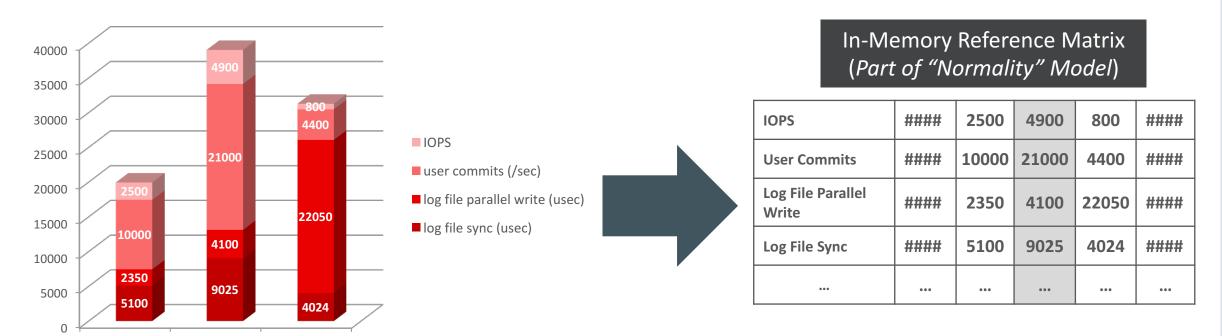
Time			% util	Network_ Packets Dropped	file			GC current request		GC current block busy	_
15:16:00	0.90	4100	13%	0	2 ms	600 us	0	0	300 us	1.5 ms	0

Statistics are collected at a *1 second internal sampling* rate , synchronized, smoothed and aggregated to a Data Point every 5 seconds



Models Capture all Normal Operating Modes

Models Capture the Dynamic Behavior of all Normal Operation



A model captures the **normal load phases** and their statistics over time, and thus the characteristics for all load intensities and profiles. During monitoring, **any data point similar** to one of the vectors is NORMAL. One could say **that** the **model REMEMBERS** the **normal operational dynamics over time**



10:00

2:00

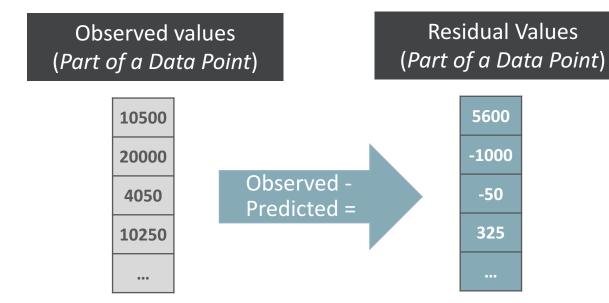
6:00

Cluster Health Advisor

CHA Model: Find Similarity with Normal Values

In-Memory Reference Matrix (Part of "Normality" Model)

IOPS	####	2500	4900	800	####	
User Commits	####	10000	21000	4400	####	
Log File Parallel Write	####	2350	4100	22050	####	
Log File Sync	####	5100	9025	4024	####	
***	•••	•••	•••	•••	•••	



CHA estimator/predictor (ESEE): "based on my normality model, the value of IOPS should be in the vicinity of \sim 4900, but it is reported as 10500, this is causing a residual of \sim 5600 in magnitude",

CHA fault detector: "such high magnitude of residuals should be tracked carefully! I'll keep an eye on the incoming sequence of this signal IOPS and if it remains deviant I'll generate a fault on it".



Cluster Health Advisor

Inline and Immediate Fault Detection and Diagnostic Inference

Input : Data Point at Time t

Time	CPU	ASM IOPS	Network % util	Network_ Packets Dropped	Log file sync	Log file parallel write	GC CR request	GC current request	GC current block 2-way		
15:16:00	0.90	4100	88%	105	2 ms	600 us	504 ms	513 ms	2 ms	5.9 ms	0

Fault Detection and Classification

	15:16:00	ОК	ОК	HIGH	HIGH	ОК	OK	HIGH	HIGH	HIGH	HIGH	ОК	
				1	2			3	3	4	4		

Diagnostic Inference

Symptoms

1. Network Bandwidth Utilization

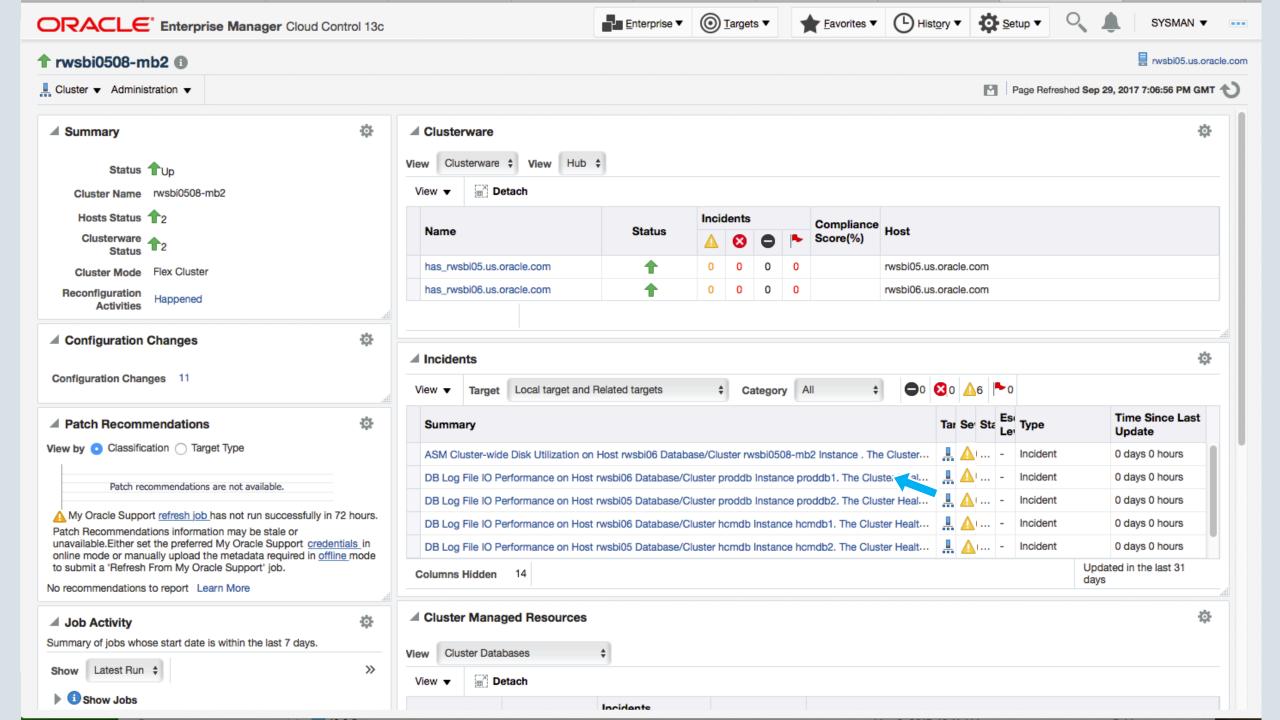
15:16:00

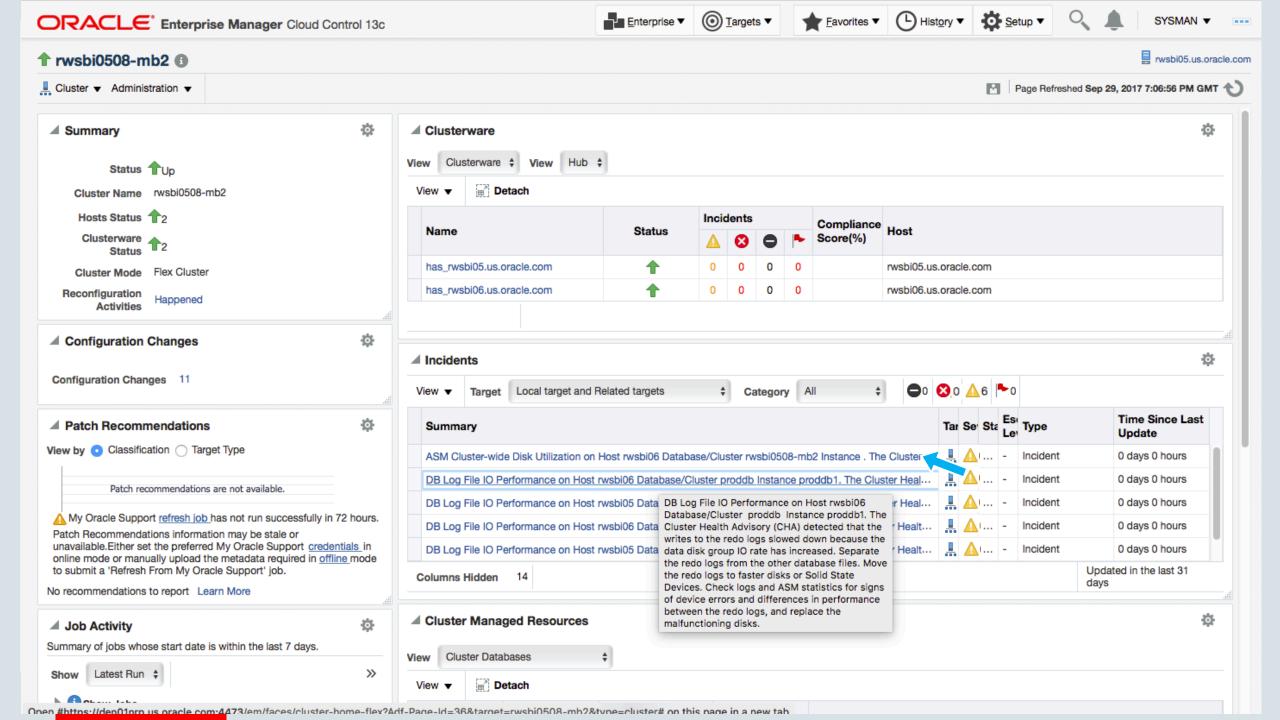
- 2. Network Packet Loss
- 3. Global Cache Requests Incomplete
- 4. Global Cache Message Latency

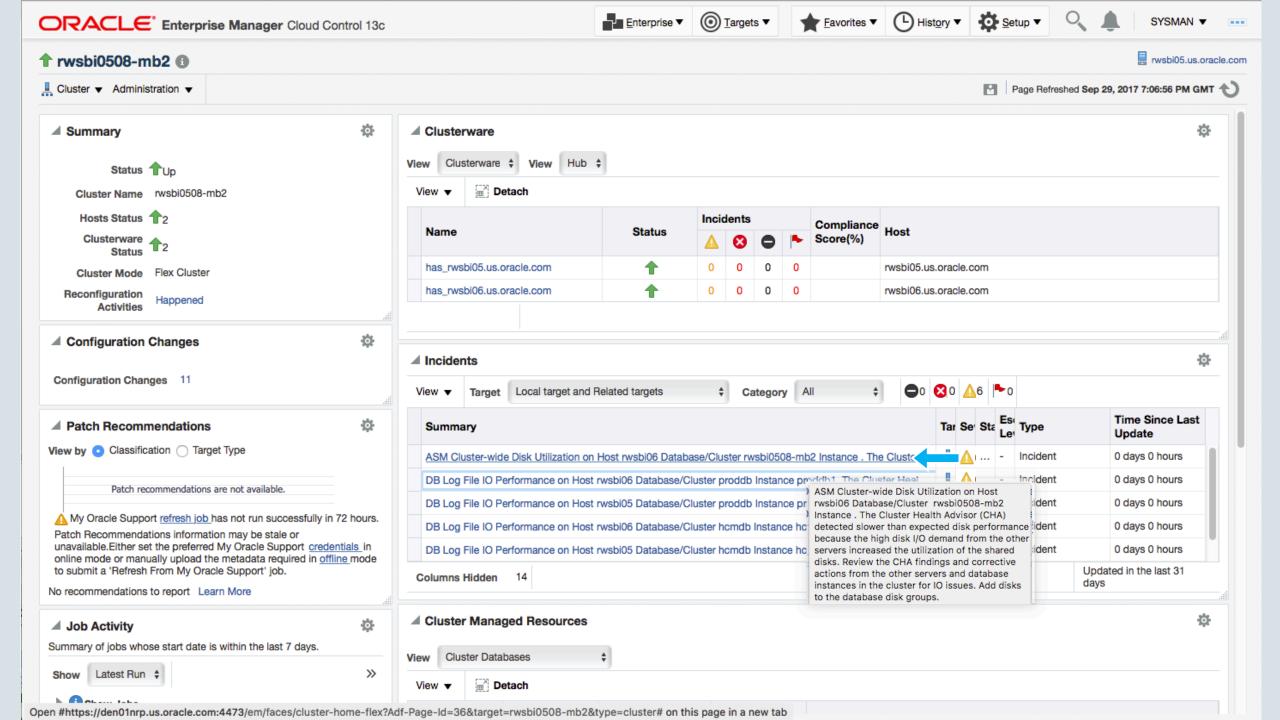
Diagnostic Inference Engine Root Cause (Target of Corrective Action)

Network Bandwidth Utilization





















Incident Manager

Incident Manager > Incident Details

Page Refreshed Sep 29, 2017 12:08:13 PM PDT 1

ASM Cluster-wide Disk Utilization on Host rwsbi06 Database/Cluster rwsbi0508-mb2 Instance . The Cluster Health Advisor (CHA) detected slower tl... Open in new tab Unassigned, Not acknowledged

General

Events Notifications My Oracle Support Knowledge All Updates Related Events Related Metrics

Incident Details

766

Metric Alert Level

Metric Group CHA Alerts

CHA_INCIDENT_STATE_CHANGE_CLUSTERWARE_rwsbi0508-mb2__CHA_...

Target rwsbi0508-mb2 (Cluster)

Sep 29, 2017 7:06:45 PM GMT Created

Sep 29, 2017 7:06:45 PM GMT Last Updated

ASM Cluster-wide Disk Utilization on Host rwsbi06 Database/Cluster rwsbi0508-mb2 Instance .

The Cluster Health Advisor (CHA) detected slower than expected disk performance because the high disk I/O demand from the other servers increased the utilization of the shared disks. Review the CHA findings and corrective actions from the other servers and database instances in the

cluster for IO issues. Add disks to the database disk groups.

Internal Event

Name

cha_alerts:cha_alert_level

Event Type Metric Alert

Category Unclassified

Show internal values for attributes ...

Critical Threshold Not Applicable

Warning Threshold Not Applicable

Number of Occurrences 0

Last Known Value Critical

Tracking

✓ Acknowledge Add Comment ... Manage ...

More ▼

Escalated No

Priority None

Owner Acknowledged No

Status New

Last Incident created by rule (Name = Incident management rule set for all targets, Create incident for critical metric Comment alerts [System generated rule]).: on Sep 29, 2017 7:06:45 PM GMT

This incident will be automatically cleared when the underlying issue is resolved.

Guided Resolution

Diagnostics Problem Analysis View Metric Help Actions Edit Thresholds Corrective Actions

No corrective action defined

Add corrective action







(L) History ▼





Page Refreshed Sep 29, 2017 12:08:13 PM PDT 1

Incident Manager

Incident Manager > Incident Details

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Unassigned, Not acknowledged

General

Events Notifications My Oracle Support Knowledge All Updates Related Events Related Metrics

Incident Details

ID 766

Alert Level

CHA Alerts Metric Group

CHA_INCIDENT_STATE_CHANGE_CLUSTERWARE_rwsbi0508-mb2_CHA_...

rwsbi0508-mb2 (Cluster)

Incident Created

Sep 29, 2017 7:06:45 PM GMT

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Show internal values for attributes ...

Metric Data

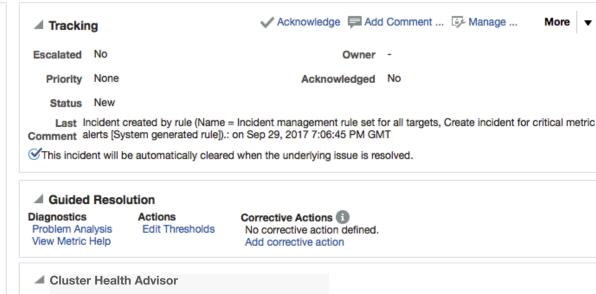
Critical Threshold Not Applicable

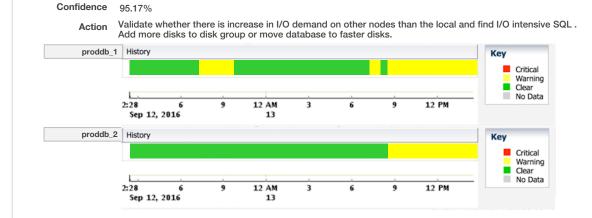
Warning Threshold Not Applicable

Number of Occurrences 0

Last Known Value Critical

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Problem The degradation is caused by a higher than expected utilization of shared storage devices for this database. No evidence of significant increase in I/O demand on the local node.

Oracle Cluster Health Advisor (CHA)

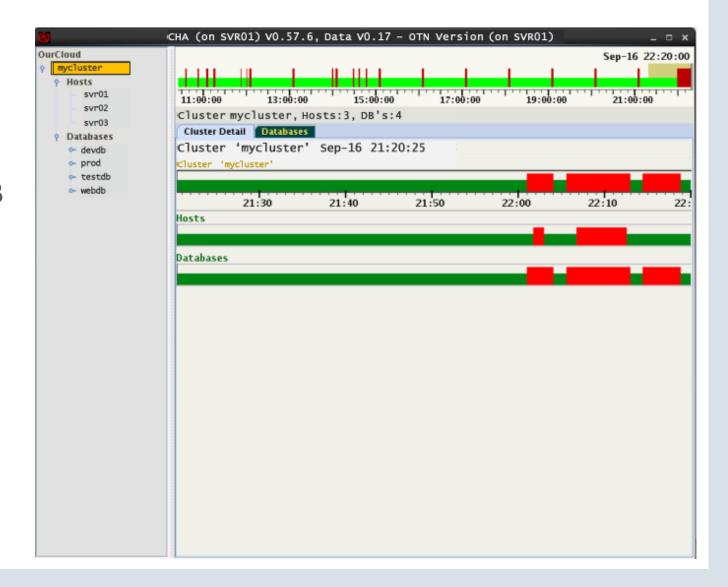
Standalone Data Exploration Tool

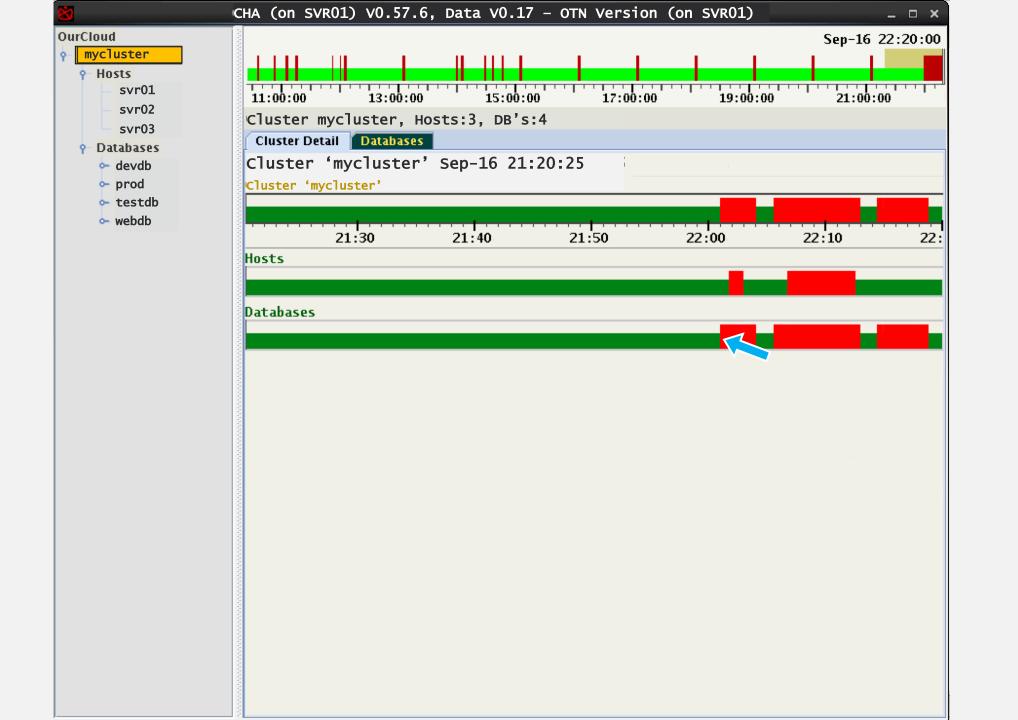
- Standalone Java GUI Client
- Must be run on local cluster node
- Can be run against live GIMR or MDB (dump) file chactl export repository -format mdb -start '2017-05-01 00:00:00'
- Used internally for development

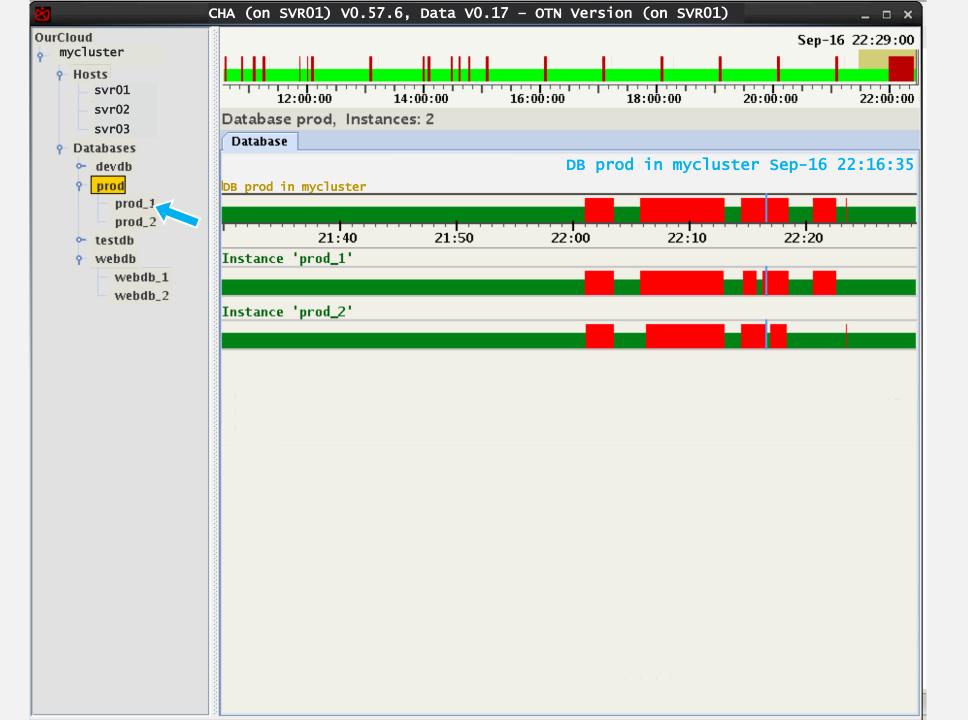
-end '2017-05-10 00:00:00'

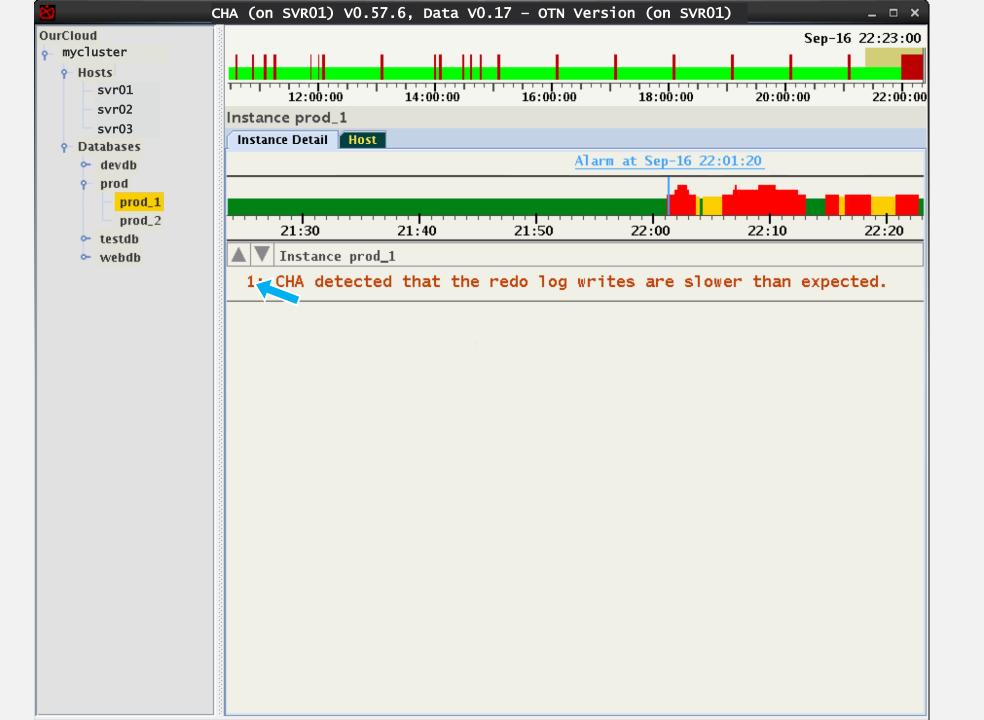
 Will be available and maintained on Oracle Technology Network

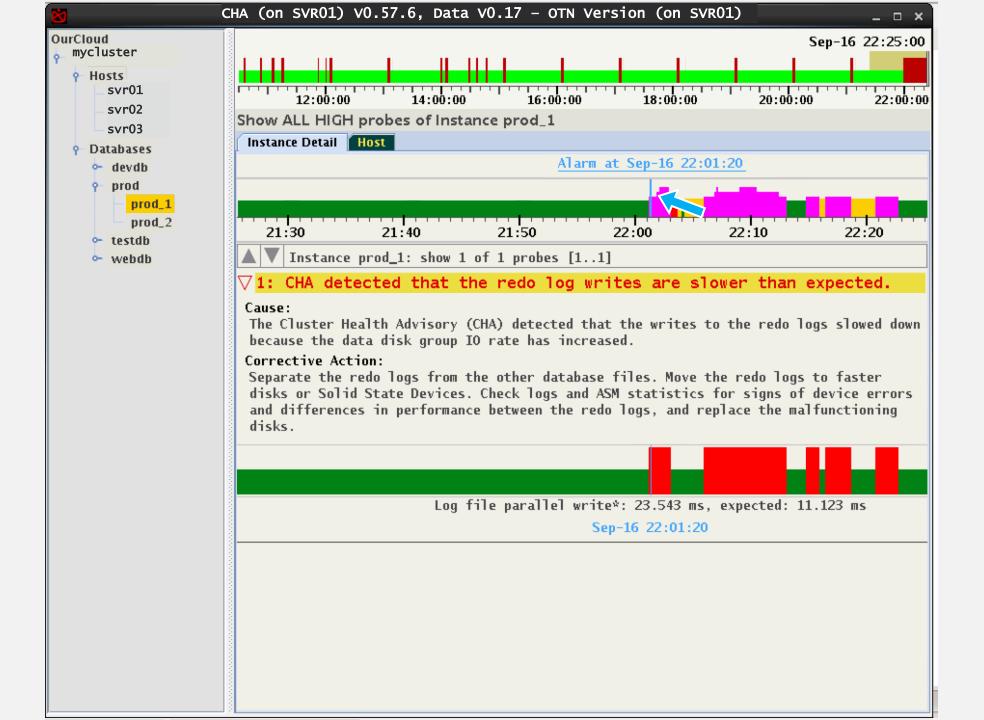
DEMO

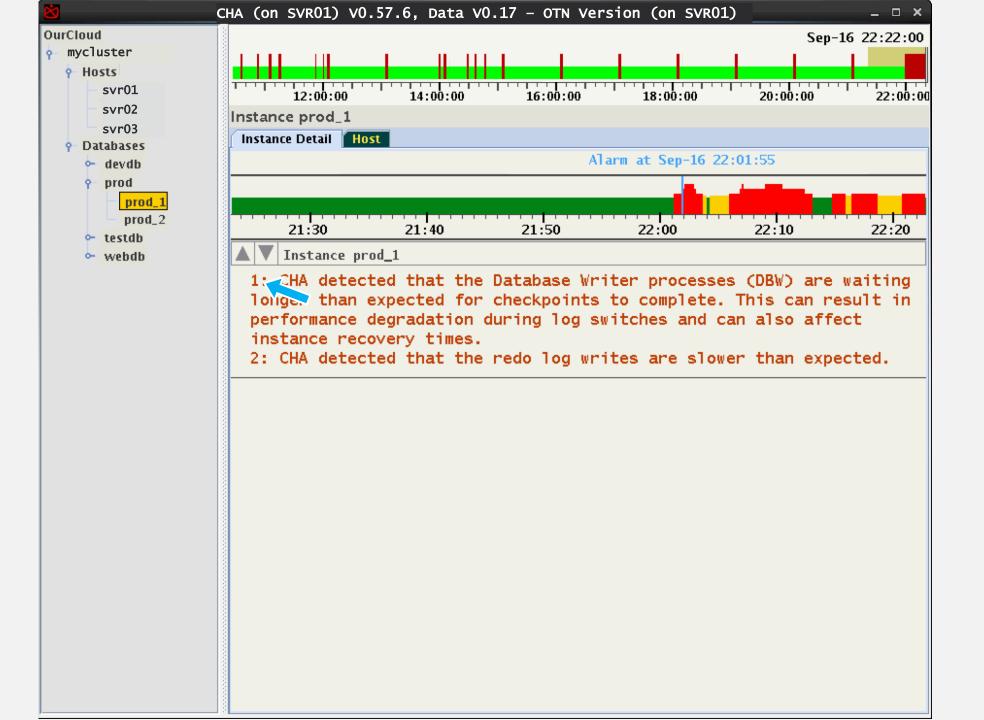


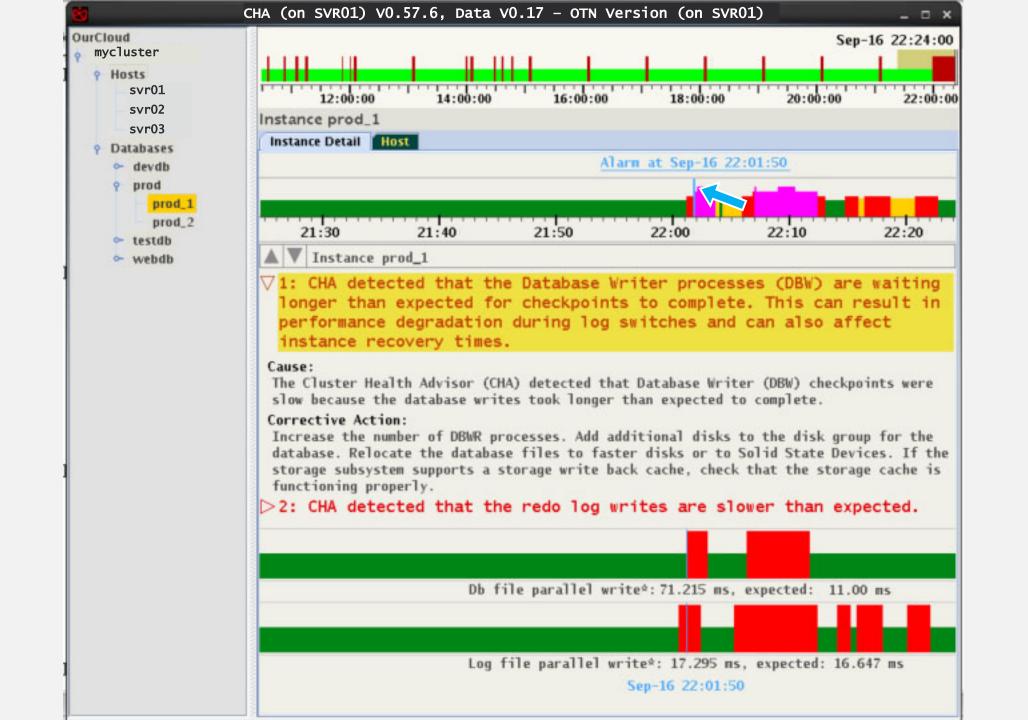


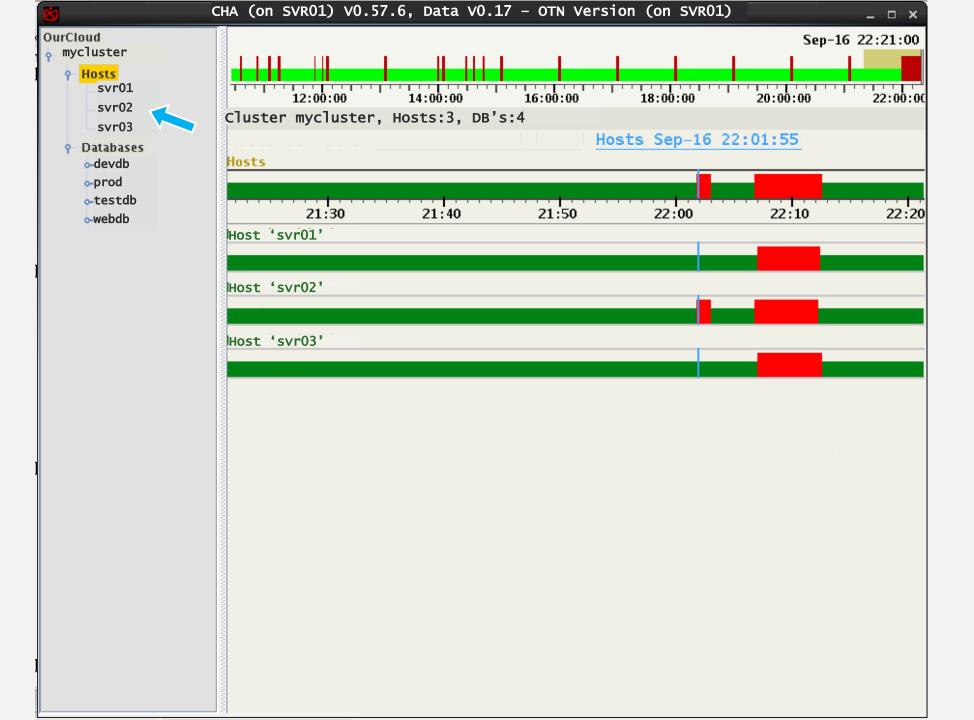


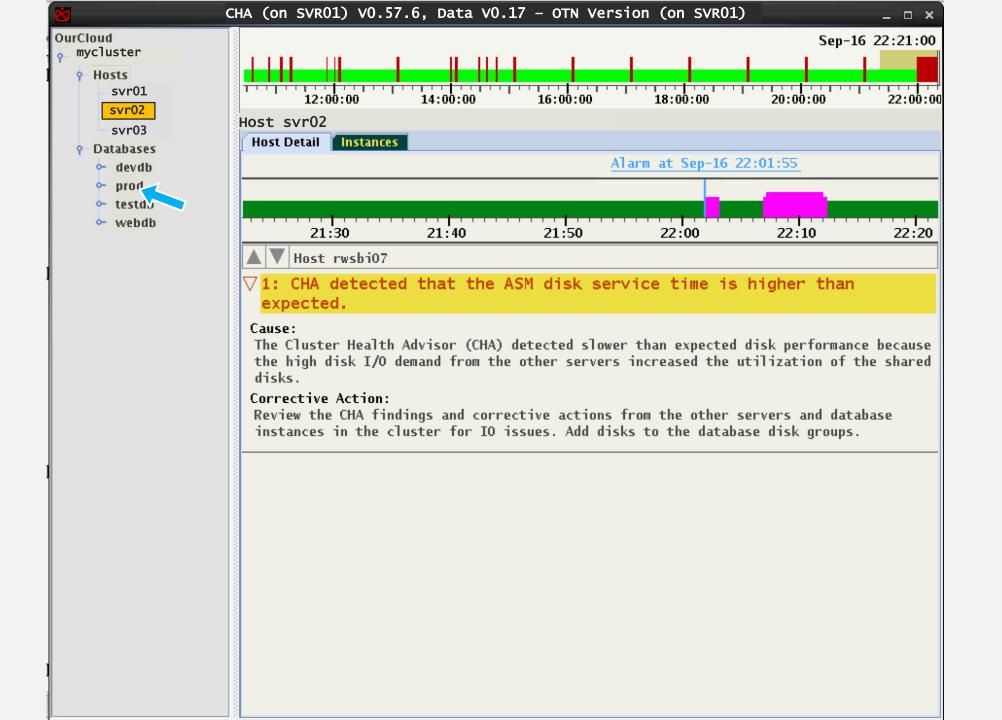


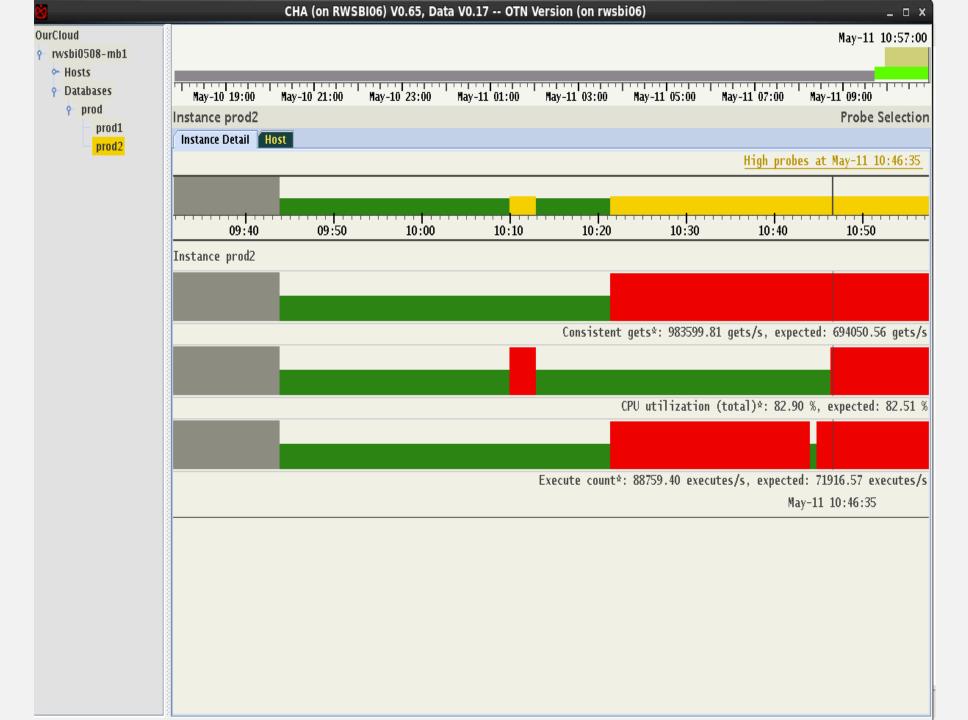


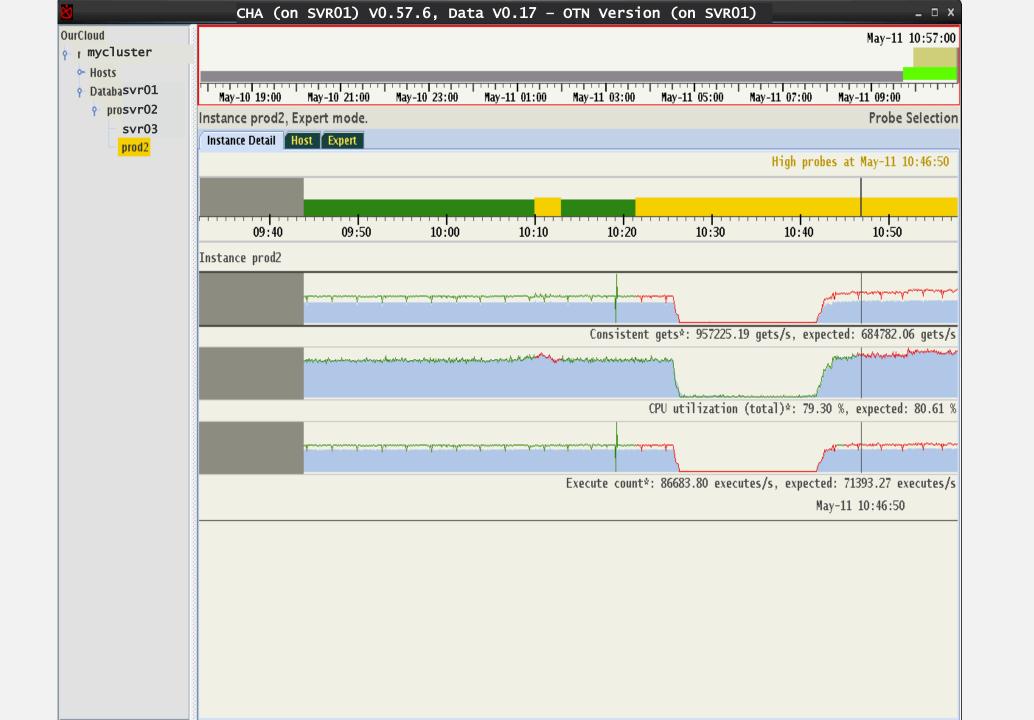










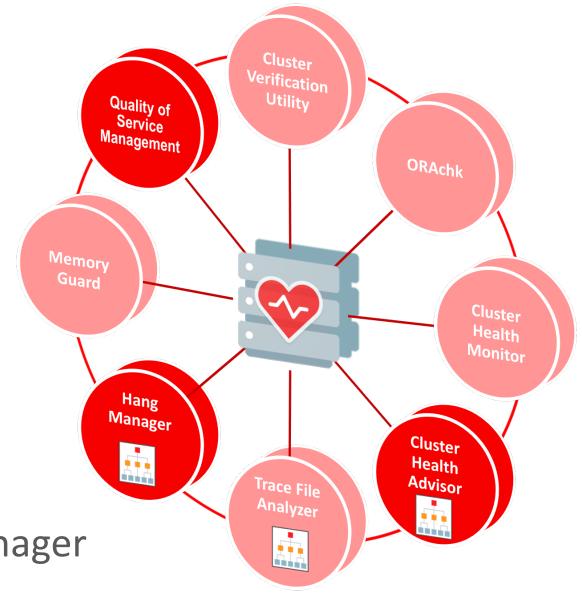


Oracle Cluster Health Advisor Coming Features

- Cross Cluster Problem Support
 - Inter-Instance Problem Detection
 - Inter-Database Problem Detection
- Portable HTML Report
 - Consolidated diagnosis output
 - Easy to send and review

```
2017-02-06 09:40:55.0 Database oltpacdb DB Multi Block
Read I/O Performance (oltpacdb 1) [detected]
Top Instances/PDBs by : IOs per sec
Database oltpacdb
                  Host slcac455
                                  Instance total 2228.80
Database oltpacdb
                   Host slcac455
                                  PDB OLTPA 308.40
Database oltpacdb
                  Host slcac455
                                  PDB OLTPA1
                                             12.80
                  Host slcac455
                                  PDB OLTPA5
                                              11.60
Database oltpacdb
Database oltpacdb
                   Host slcac455
                                  PDB OLTPA4
                                              7.60
Database oltpacdb
                  Host slcac455
                                  PDB OLTPA2
                                              4.00
Database oltpacdb
                   Host slcac454
                                  Instance total 1136.20
                   Host slcac454
Database oltpacdb
                                  PDB OLTPA 784.20
Database oltpacdb
                   Host slcac454
                                  PDB OLTPA4
                                              428.00
Database oltpacdb
                   Host slcac454
                                  PDB OLTPA2
                                              21.80
Database oltpbcdb
                   Host slcac455
                                  Instance total
                                                  0.20
Database oltpccdb
                   Host slcac455
                                  Instance total
                                                  0.00
Database oltpbcdb
                   Host slcac454
                                  Instance total
                                                  0.00
```

Autonomously Preserves
Database Availability and
Performance



Oracle 12c Database Hang Manager

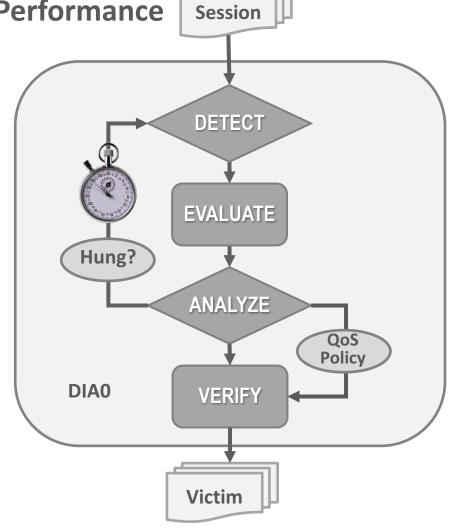


Oracle 12c Hang Manager

Autonomously Preserves Database Availability and Performance

- Always on Enabled by default
- Reliably detects database hangs and deadlocks
- Autonomously resolves them
- Supports QoS Performance Classes, Ranks and Policies to maintain SLAs
- Logs all detections and resolutions
- New SQL interface to configure sensitivity (Normal/High) and trace file sizes



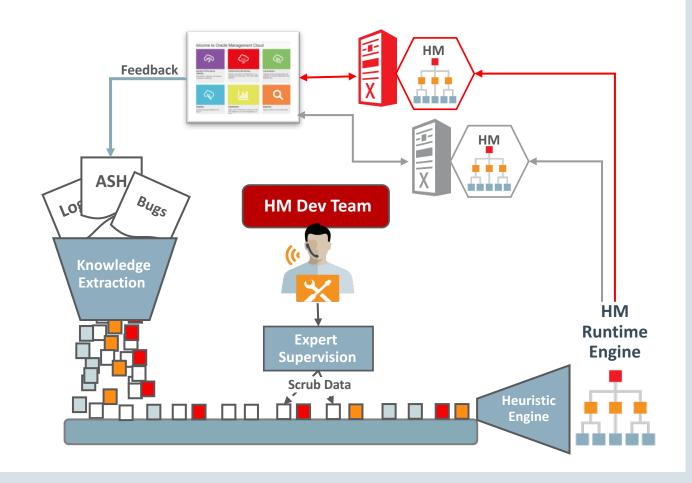




Oracle Database Hang Manager – Applied Machine Learning

Discovers and Resolves Runtime Database Hangs

- Actual Internal and External customer data drives model development
- Purpose-built diagnostic technology used for knowledge extraction
- Expert Dev team scrubs data
- Hang Heuristic Engine created and deployed @Customer
- HM uses run-time engine to perform real-time DB hang detection and resolution





Oracle 12c Hang Manager

Full Resolution Dump Trace File and DB Alert Log Audit Reports

Dump file .../diag/rdbms/hm6/hm62/incident/incdir 5753/hm62 dia0 12656 i5753.trc

Oracle Database 12c Enterprise Edition Release 12.2.0.0.0 - 64bit Beta With the Partitioning, Real Application Clusters, OLAP, Advanced Analytics

and Real Application Testing options

Build label: RDBMS MAIN LINUX.X64 151013

ORACLE HOME: .../3775268204/oracle

System name: Linux

Node name: slc05kvr

2.6.39-400.211.1.el6uek.x86 64 Release:

#1 SMP Fri Nov 15 13:39:16 PST 2013 Version:

Machine: x86 64

Xen Version: 3.4 (PVM) VM name:

Instance name: hm62

Redo thread mounted by this instance: 2

Oracle process number: 19

Unix process pid: 12656, image: oracle@slc05kyr (DIA0)

- *** 2015-10-13T16:47:59.541509+17:00
- *** SESSION ID:(96.41299) 2015-10-13T16:47:59.541519+17:00
- *** CLIENT ID:() 2015-10-13T16:47:59.541529+17:00
- *** SERVICE NAME:(SYS\$BACKGROUND) 2015-10-13T16:47:59.541538+17:00
- *** MODULE NAME:() 2015-10-13T16:47:59.541547+17:00
- *** ACTION NAME:() 2015-10-13T16:47:59.541556+17:00
- *** CLIENT DRIVER:() 2015-10-13T16:47:59.541565+17:00

2015-10-13T16:47:59.435039+17:00

Errors in file /oracle/log/diag/rdbms/hm6/trace/hm6 dia0 12433.trc (incident=7353):

ORA-32701: Possible hangs up to hang ID=1 detected Incident details in: .../diag/rdbms/hm6/hm6/incident/in Hang detected by hang manager 3_i7353.trc

2015-10-13T16:47:59.506775+17:00

DIA0 requesting termination of session sid:40 with serial # 43179 (ospid:13031) on instance 2

due to a GLOBAL, HIGH confidence hang with ID=1.

Hang Resolution Reason: Automatic hang resolution was Session victim identified & terminated

significant number of affected sessions.

DIAO: Examine the alert log on instance 2 for session termination status of hang with ID=1.

In the alert log on the instance local to the session (instance 2 in this case). we see the following:

2015-10-13T16:47:59.538673+17:00

Errors in file .../diag/rdbms/hm6/hm62/trace/hm62_dia0_12656.trc (incident=5753):

ORA-32701: Possible hangs up to hang ID=1 detected

Incident details in: .../diag/rdbms/hm6/hm62/incident/incdir_5753/hm62 dia0 12656 i5753.trc

2015-10-13T16:48:04.222661+17:00

DIA0 terminating blocker (ospid: 13031 sid: 40 ser#: 43179) of hang with ID = 1

requested by master DIA0 process on instance 1

Hang Resolution Reason: Automatic hang resolutio

significant number of affected sessions.

by terminating session sid:40 with serial # 43179 (ospid:13031)

Blocker session terminated

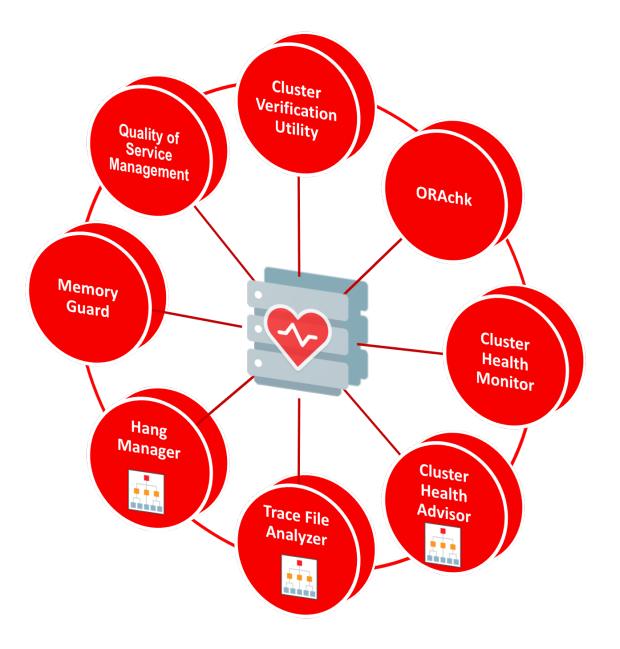


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Speeds Issue Diagnosis, Triage and Resolution

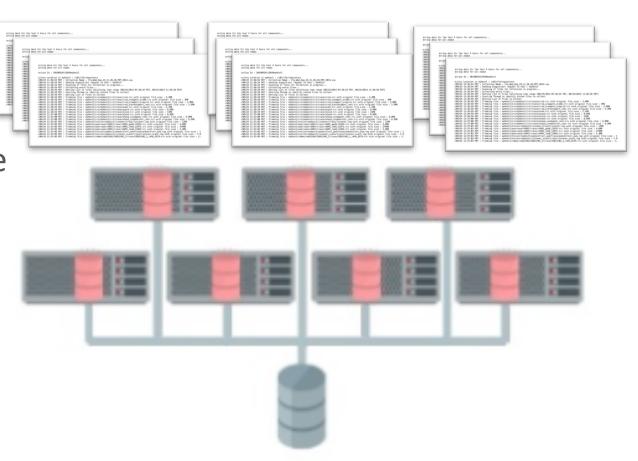
Oracle 12c Trace File Analyzer





Challenges in Failure Recovery

- GBs of logs generated everyday
- Distributed across cluster nodes
- Diagnosing an issue can be "a needle in the haystack" problem
- Manual issue diagnosis can be tedious and time-consuming
- Any delay in issue diagnosis can adversely impact the business



Rapid Recovery with Trace File Analyzer (TFA)

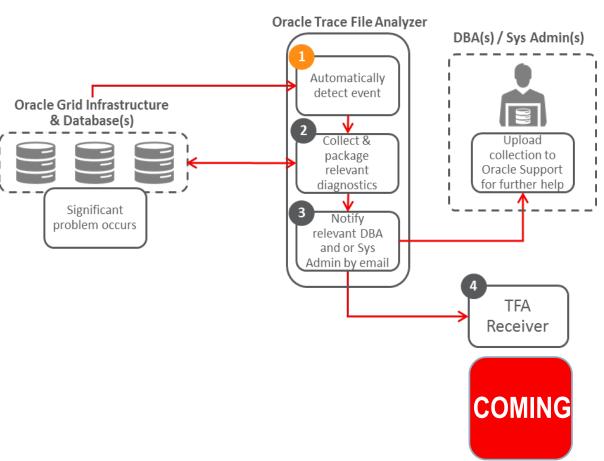
- Autonomously collects data intelligently (Smart Collection)
 - Autonomously and intelligently collects only relevant logs
 - Reduces log files to small set of potential candidates
- Autonomously finds relevant information for issue at hand
 - Anomaly Timeline Generation
 - Identifies errors associated with the issue
 - Generates list of potential problems across the system ordered by time
- Speeds issue diagnosis with Oracle Support Services (OSS) for unknown issues



Rapid Recovery with TFA

Smart Collection with TFA Collector

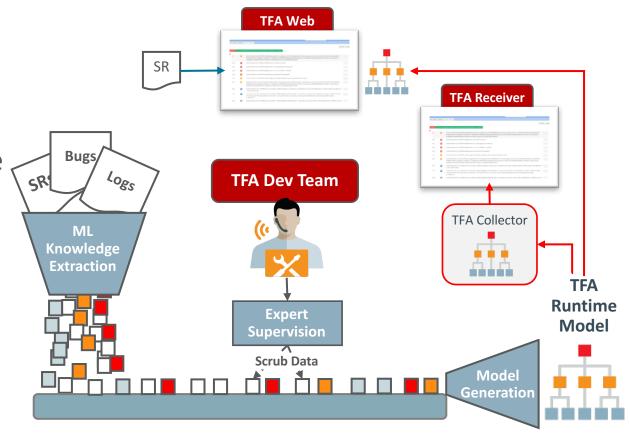
- Always on
- Collects comprehensive first failure diagnostics on each node
- Filters and packages relevant diagnostic data; using Applied ML model
- Automatically notifies DBAs and Sys Admins of errors
- Optionally allows quick issue resolution with Oracle Support
- Transfers data to centralized storage for detailed analysis with TFA Receiver



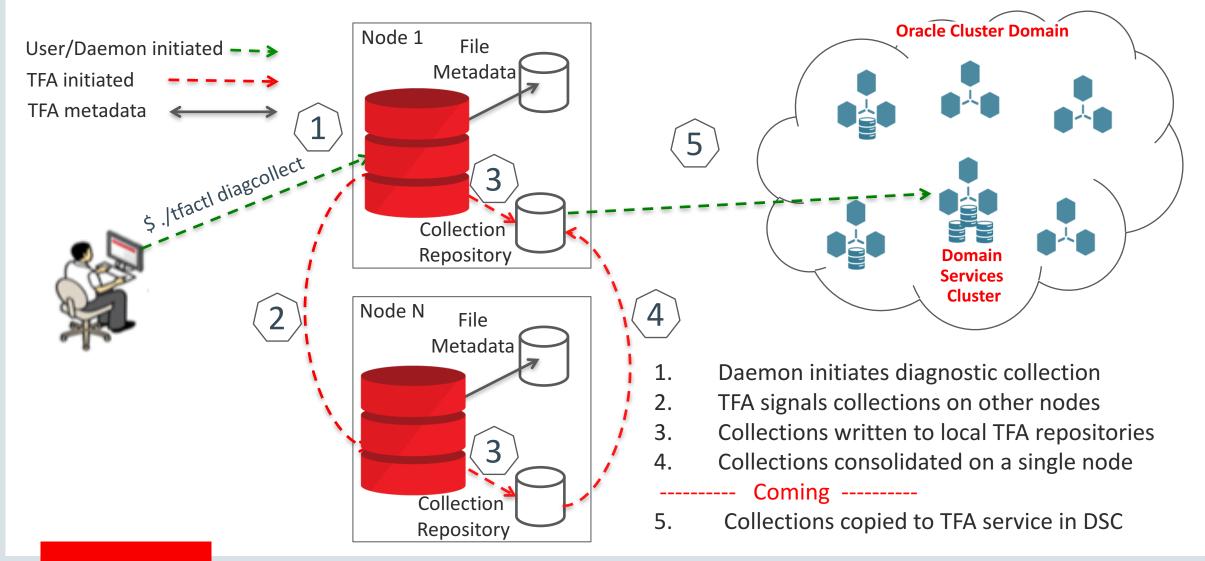
Trace File Analyzer – Applied Machine Learning

Speeds Issue Diagnosis, Triage and Resolution

- ML-based Knowledge Extraction of Logs, SRs and Bugs
- Expert training refines data training set
- Knowledge is embedded into the run-time model
- Model is shipped in TFA Collector to work with the live logs on the Cluster
- Log anomaly detection is performed with TFA Receiver
- No model training required by user
- Model is updated regularly



Oracle TFA in Cluster Domain Design Overview



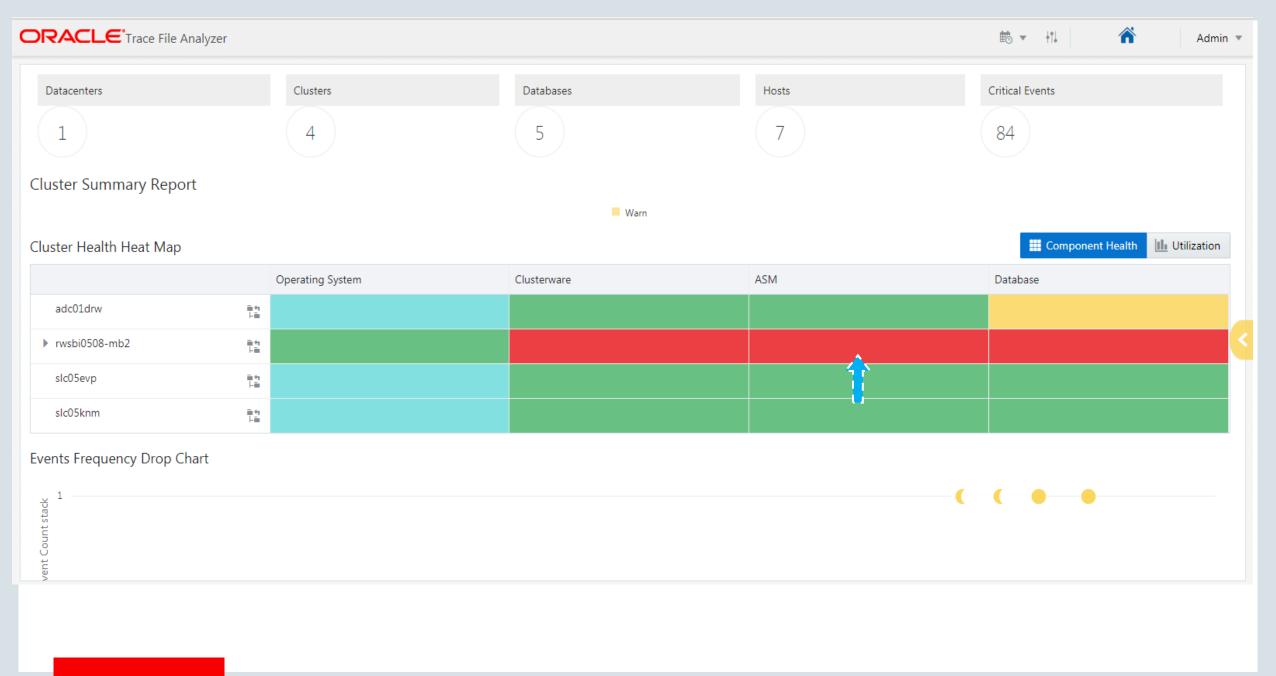
Rapid Recovery with TFA Detailed Issue Analysis using TFA Receiver

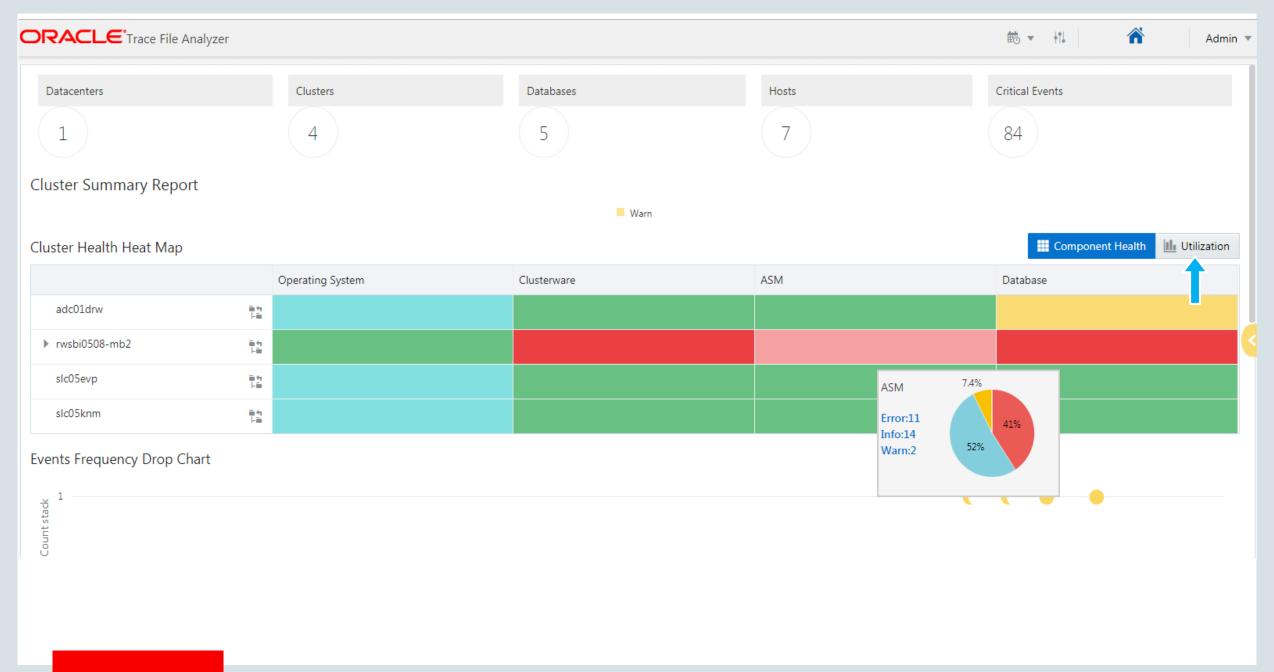


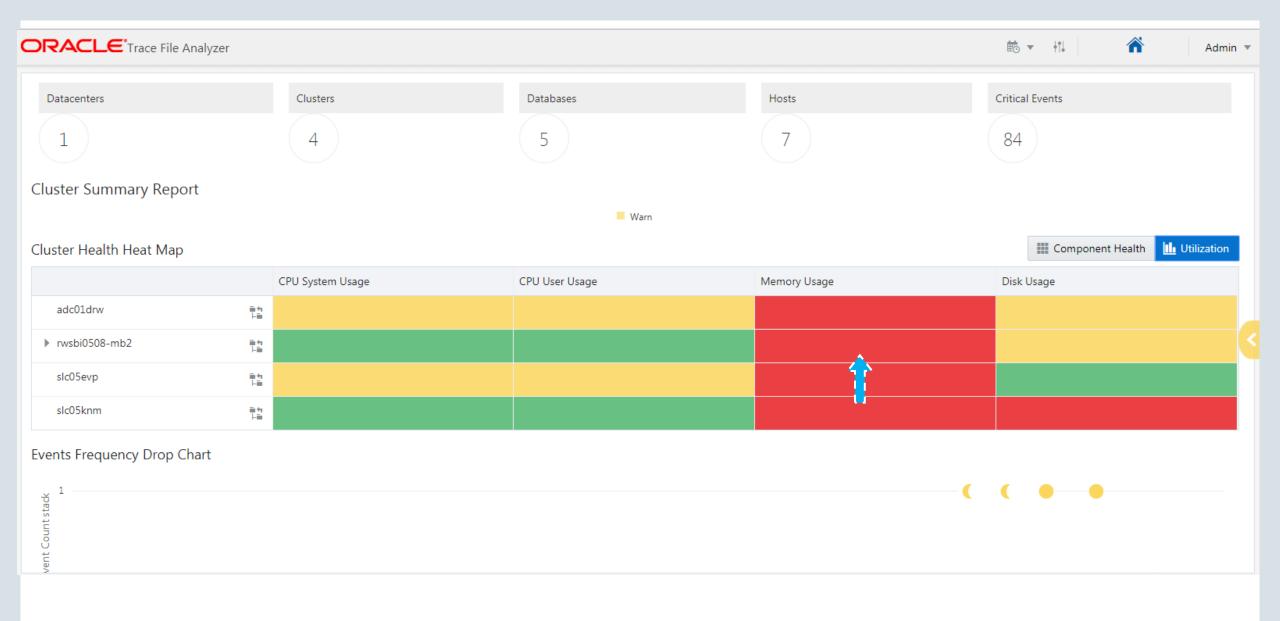
- Centralized aggregator in the Cluster Domain
- Mines logs and errors from all nodes registered with it
- Browser-Based UI
 - Supports browsing errors
 - Viewing associated logs
 - Easily construct timelines

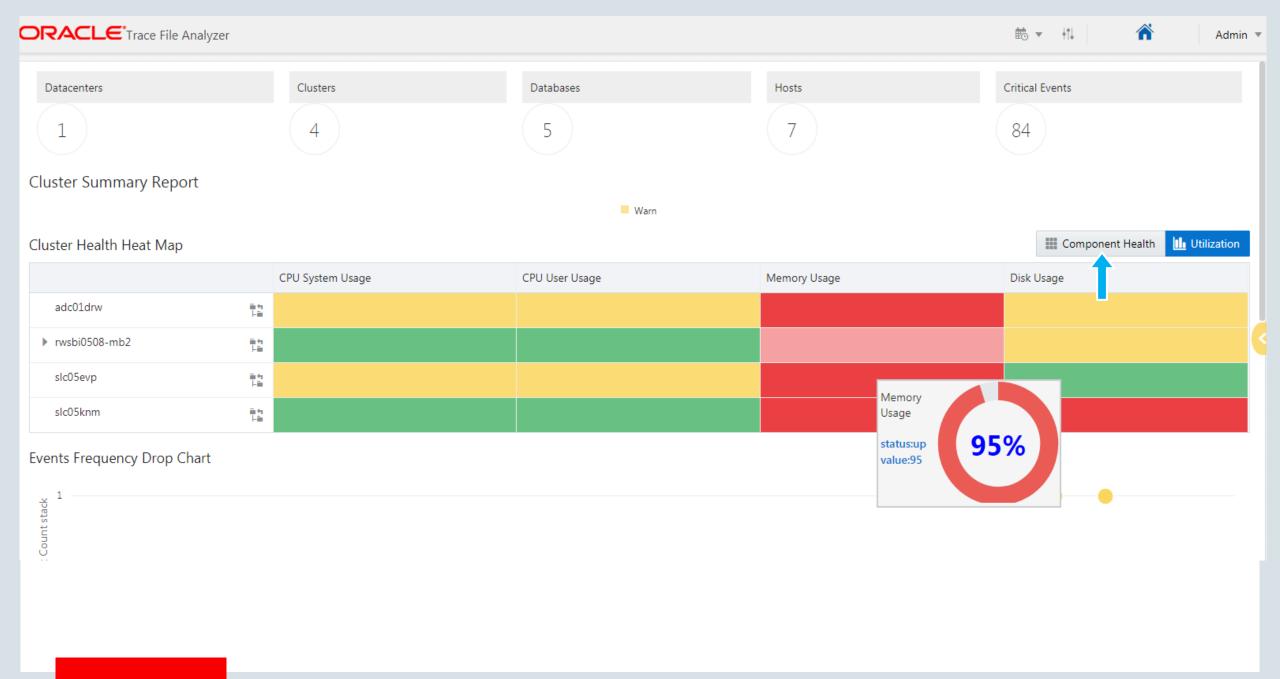
DEMO

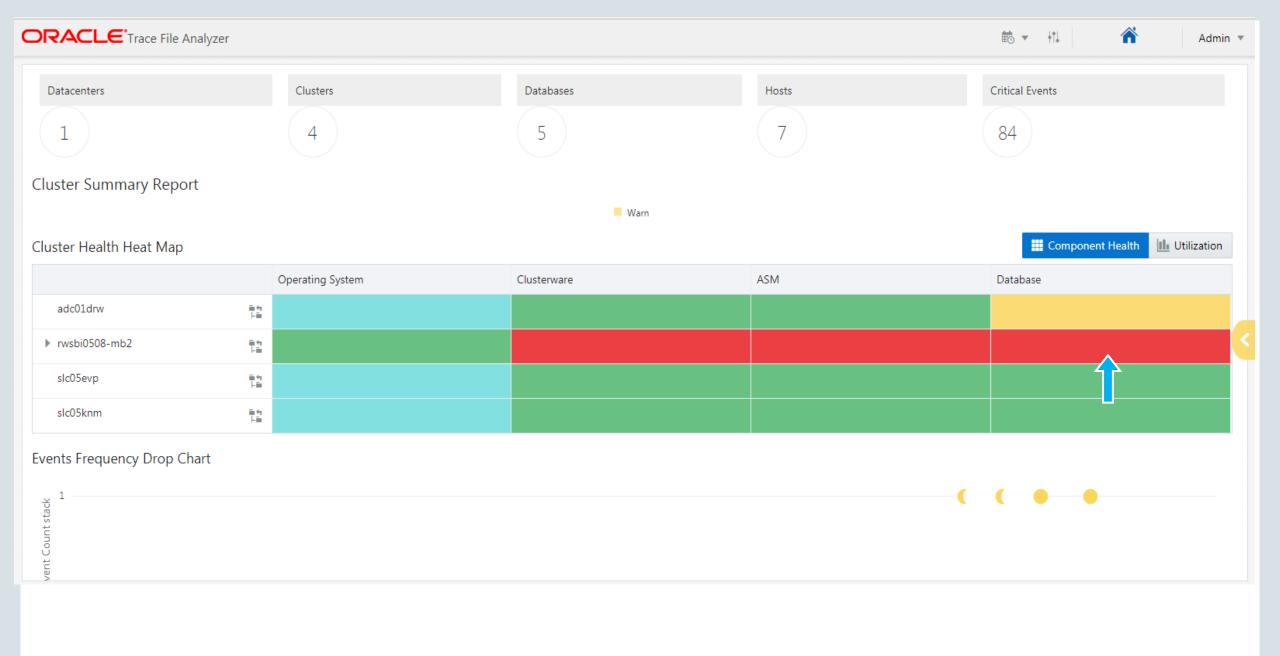


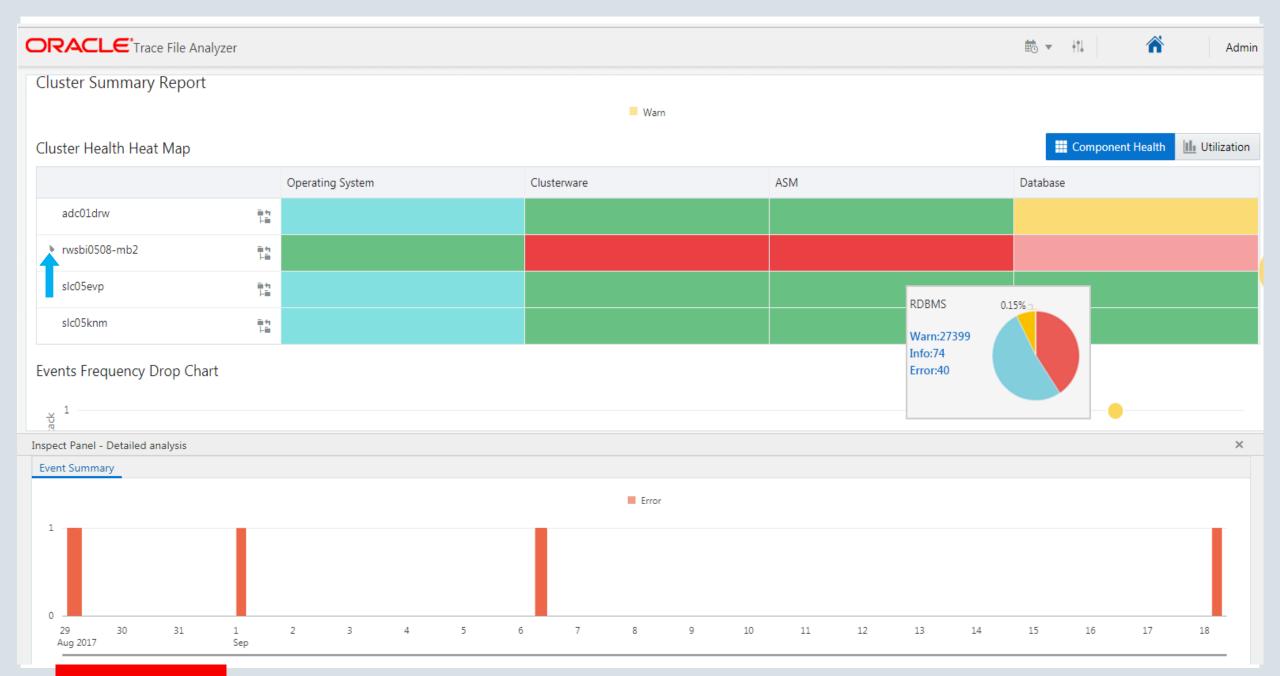


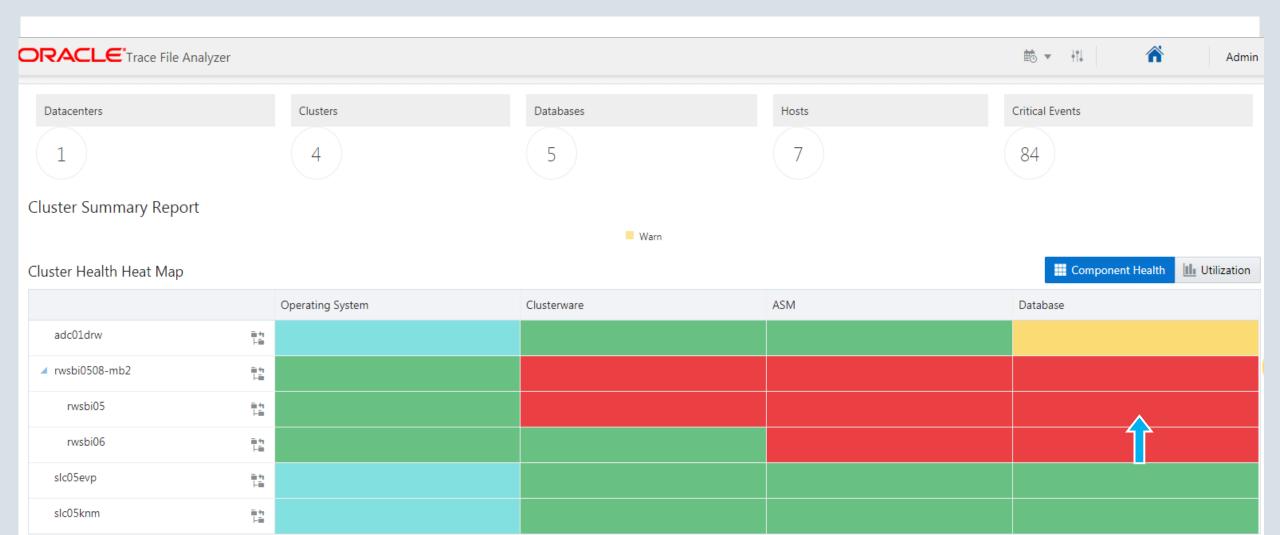




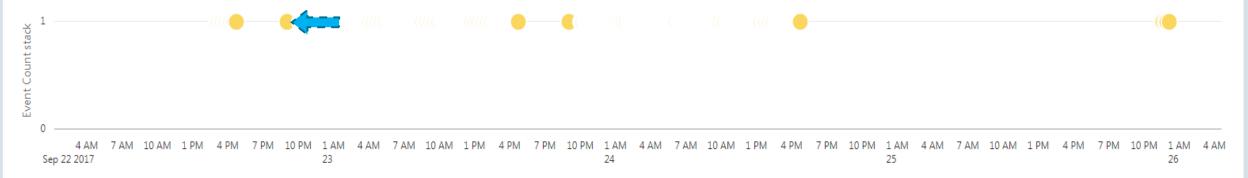




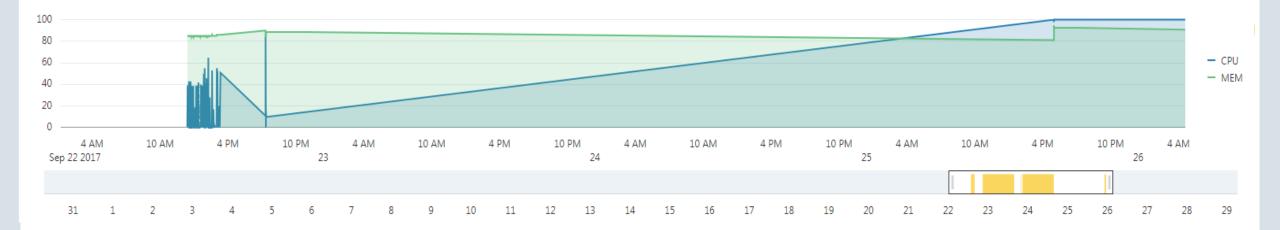




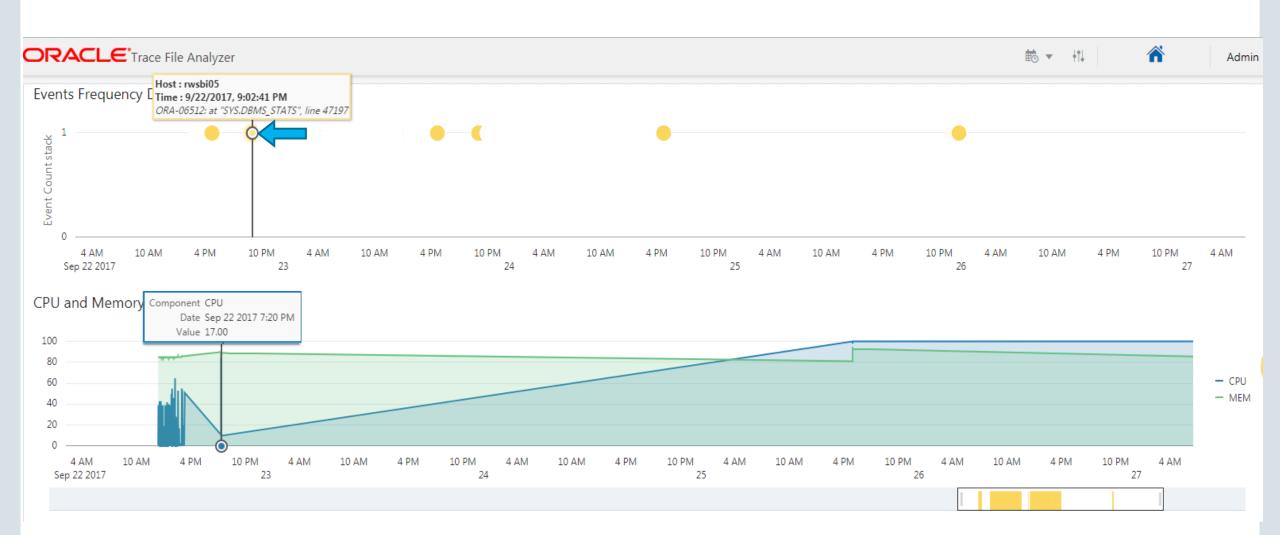
Events Frequency Drop Chart



CPU and Memory Utilization Chart

















Admin ▼

- Dashboard
- FileType
 - ▶ **■** RDBMS(361)
 - ▶ **a** OS(133)
 - CRS(33)
 - INSTALL(15)
 - ▶ **a** ASM(12)
 - ▶ **TNS(7)**
 - ▶ DBWLM(1)
- Host
 - ▶ **i** slc05evp(1228)
 - rwsbi05(257)
 - adc01drw(228)
- rwsbi06(161)
- ▶ **i** slc05knm(16)
- Directory
 - slc05evp(1228)
 - rwsbi05(257)
- adc01drw(228)
- rwsbi06(161)
- ▶ **i** slc05knm(16)

```
Browse Files
               alert hcmdb2.log ×
```

Enter search pattern/string Q 09/22/17 09:02 PM

```
2017-09-22T21:31:11.626129-07:00
         Resize operation completed for file# 3, old size 2344960K, new size 2355200K
7654
         2017-09-22T22:00:00.394054-07:00
         Setting Resource Manager plan SCHEDULER[0x4AC7]:DEFAULT MAINTENANCE PLAN via scheduler window
         Setting Resource Manager plan DEFAULT MAINTENANCE PLAN via parameter
         2017-09-22T22:00:09.645880-07:00
         Begin automatic SQL Tuning Advisor run for special tuning task "SYS_AUTO_SQL_TUNING_TASK"
         2017-09-22T22:00:24.508940-07:00
         End automatic SQL Tuning Advisor run for special tuning task "SYS AUTO SQL TUNING TASK"
         2017-09-22T22:03:10.085621-07:00
         Thread 2 advanced to log sequence 41 (LGWR switch)
         Current log# 5 seq# 41 mem# 0: +DATAE/HCMDB/ONLINELOG/group 5.304.954006835
         2017-09-22T22:04:43.009484-07:00
         Errors in file /scratch/app/orabase/diag/rdbms/hcmdb/hcmdb2/trace/hcmdb2_j002_6743.trc:
         ORA-12012: error on auto execute of job "SYS". "ORA$AT OS OPT SY 3589"
         ORA-20001: Statistics Advisor: Invalid task name for the current user
         ORA-06512: at "SYS.DBMS STATS", line 47207
         ORA-06512: at "SYS.DBMS STATS ADVISOR", line 882
7670
         ORA-06512: at "SYS.DBMS_STATS_INTERNAL", line 20059
         ORA-06512: at "SYS.DBMS_STATS_INTERNAL", line 22201
         ORA-06512: at "SYS.DBMS STATS", line 47197
```

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Program Agenda

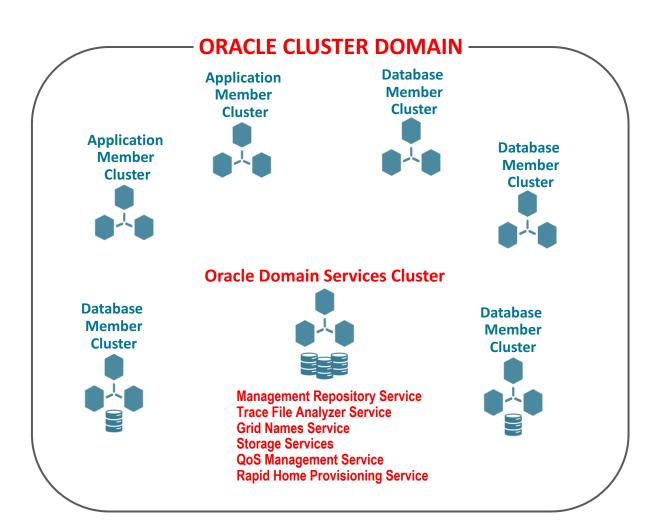
- 1 Introducing Applied Machine Learning for Diagnostics
- 2 Applied Machine Learning for Real-time Prevention
- 3 Applied Machine Learning for Rapid Recovery
- 4 ODA Management Appliance Profile
- 5 For Further Information / Q & A

Oracle 12c Domain Services Cluster

Deploy with Minimum Footprint and Maximum Manageability



- Hosts Framework as Services
- Reduces local resource footprint
- Centralizes management
- Speeds deployment and patching
- Optional Shared Storage
- Supports multiple versions and platforms going forward

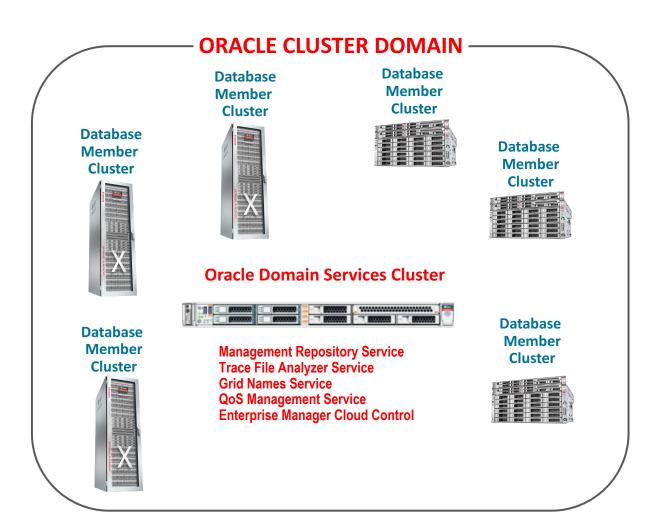


Oracle Database Appliance – Management Appliance Profile

Domain Services Management Engineered Solution



- Ideal Management Solution for Oracle Engineered Systems
- Reduces diagnostic footprint
- Centralizes management function
- Does not interfere with provisioning and patching
- Pay only for ODA hardware (S/M/L)
- No additional software license fees



Program Agenda

- 1 Introducing Applied Machine Learning for Diagnostics
- 2 Applied Machine Learning for Real-time Prevention
- 3 Applied Machine Learning for Rapid Recovery
- 4 ODA Management Appliance Profile
- For Further Information / Q & A

For Further Information

- Oracle 12c Autonomous Health Framework User's Guide
- Oracle 12c Clusterware Adminstration and Deployment Guide
- Oracle Autonomus Health Framework on OTN
- Oracle QoS Management 12c User's Guide
- Oracle QoS Management on OTN
- Oracle 12c ORAchk
- Oracle 12c Trace File Analyzer



