



# **Beyond Diagnostics and Tuning:** **Using Machine Learning and Data Analytics to** **Maximize DB Performance**

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# Agenda

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Database Management: Landscape and Challenges

2

Oracle Management Cloud

3

Real-Time Analytics

4

Anomaly Detection and Machine Learning

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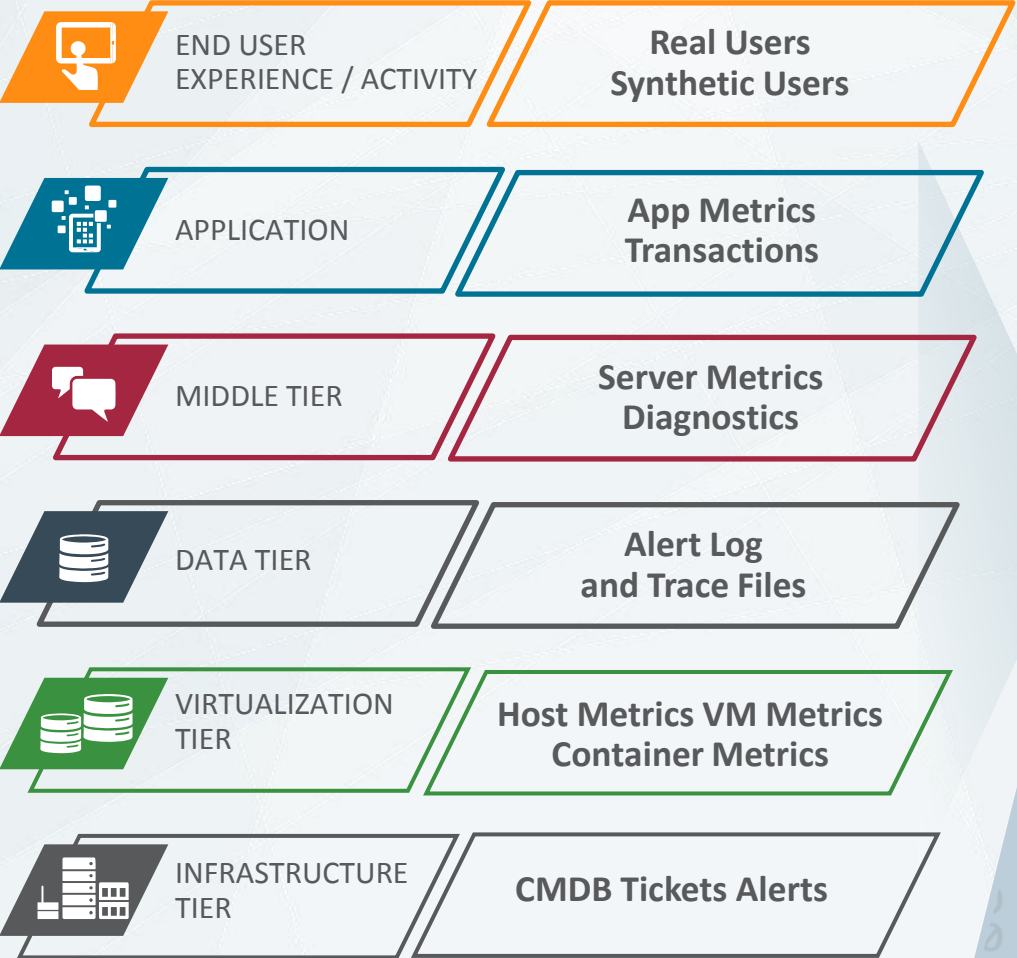
Q&A

# DB Management and Monitoring Trends

- Heterogeneity and hyper-extensibility
  - Ability to monitor and manage open-source, relational, NoSQL databases running on traditional hardware, cloud, or software defined entities (e.g., VMs, Dockers)
- Hybrid/Multi-cloud management
  - Administer databases seamlessly across cloud boundaries offering single pane-of-glass for monitoring and management
- Demand for real-time analytic offerings
  - Problem avoidance (vs. fast resolution)
  - Need for more algorithmic decision-making




# Management Challenges





**Too many tools**  
**Too much data**  
**No insight**





# Powered by AI & Machine Learning

 END USER EXPERIENCE / ACTIVITY

 APPLICATION

 MIDDLE TIER

 DATA TIER

 VIRTUALIZATION TIER

 INFRASTRUCTURE TIER

Real Users  
Synthetic Users

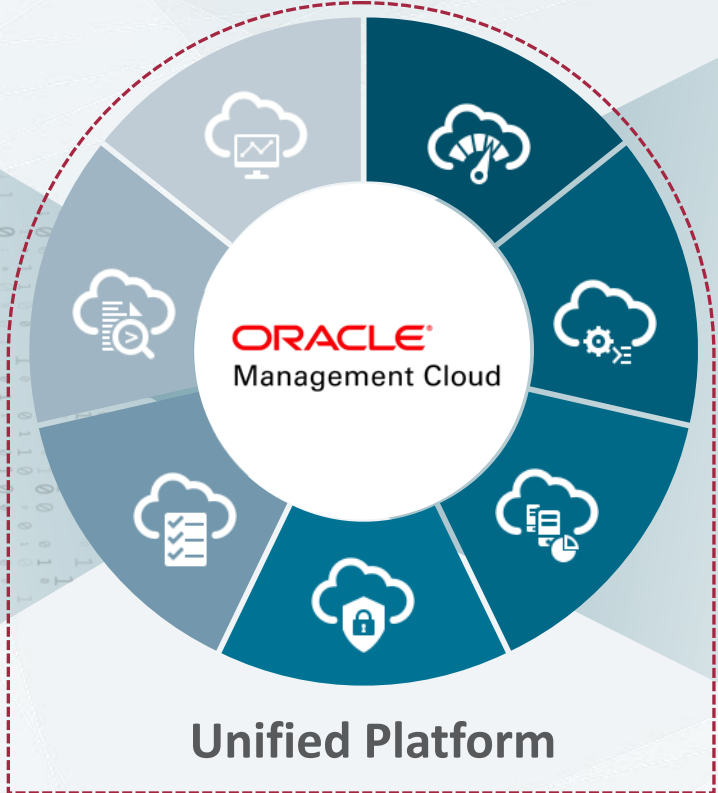
App Metrics  
Transactions

Server Metrics  
Diagnostics

Logs

Host Metrics  
VM Metrics  
Container Metrics

CMDB Tickets  
Alerts



ANOMALY DETECTION

CLUSTERING

PREDICTION

CORRELATION



# Analytics and ML

## Real-time analytics



Utilize DBA resources and time efficiently using big data analytics for smart systems management

## Anomaly detection machine learning



Use machine learning and analytics to avoid problems by predicting them before they occur



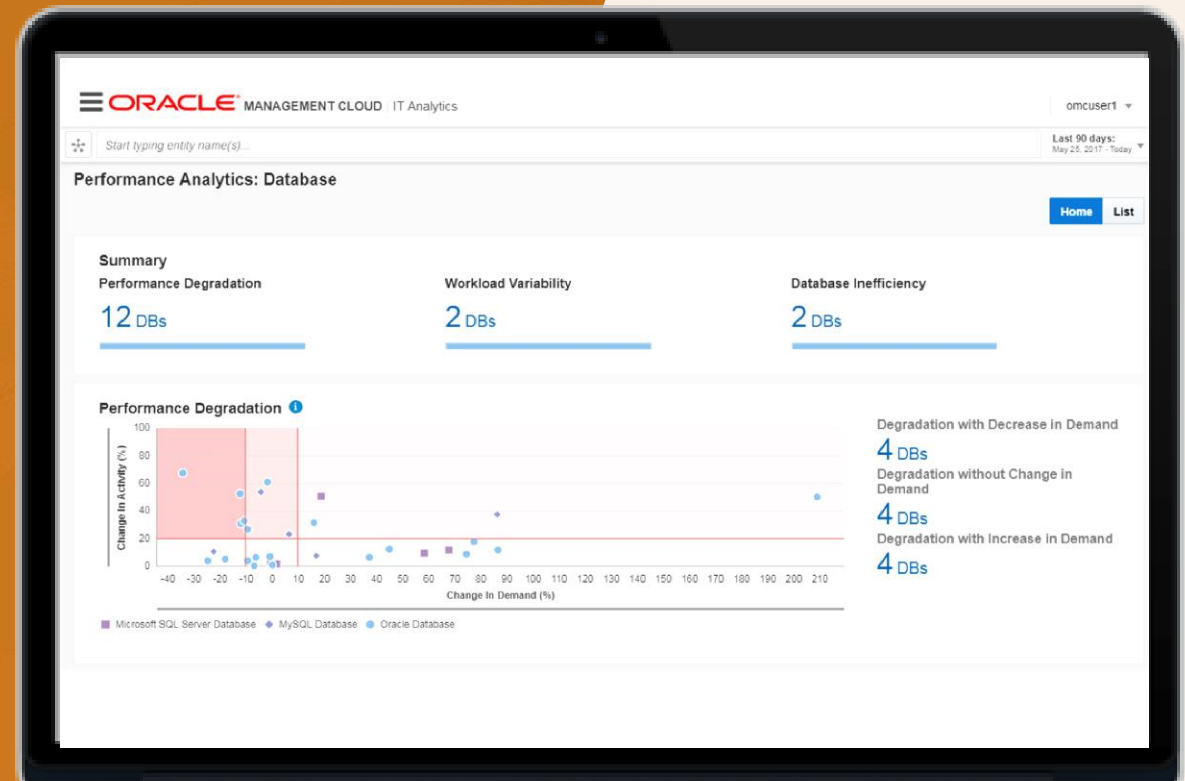
**#1 IT Trend: AI and Machine Learning widely deployed to make systems intelligent and autonomous**  
Next generation of systems management

A man with a beard and mustache, wearing a dark suit, light blue shirt, and dark tie, is looking intently at a tablet computer. The background is a blurred cityscape at night with bokeh lights. The image is overlaid with a teal geometric pattern.

# Real-Time Analytics

# Real-Time Analytics: Find Needle in the Haystack Performance Analytics

- Analyze database performance based on long term performance data
- Get insights into database performance
  - Analyze performance degradation by response time
  - Identify inefficient databases by wait time
  - Analyze performance of highly variant SQLs and databases
  - Databases which are increasingly inefficient
  - Top SQLs



## Maximize your cloud investments

- Achieve highest level of database performance
- Consolidate databases for better price to performance



# Performance Analytics

## Analyze performance degradation by response time

- Degradation with decrease in demand
  - Change in Response Time > +20% and Change in Demand < -10 %
- Degradation without change in demand
  - Change in Response Time > +20% and Change in Demand between -10% and +10%
- Degradation with increase in demand
  - Change in Response Time > +20% and Change in Demand < +10 %

Degradation with decrease in demand

1 DBs

Degradation without change in demand

2 DBs

Degradation with increase in demand

1 DBs

Configurable thresholds for “Change in Response Time” and “Change in Demand”

- **Default Values:**
  - Change in Response Time - 20%
  - Change in Demand - 10%

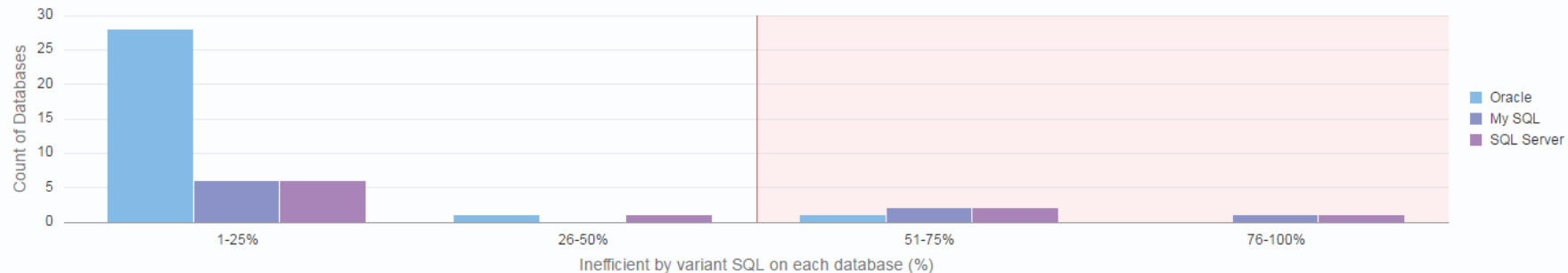
# Performance Analytics

## Analyze inefficient workloads

- Inefficient wait time is in Active Sessions which are not part of CPU Time, IO wait Time and idle wait events
- Inefficient (%) = Inefficient Wait Time / DB time
- Increasingly inefficient among the most inefficient databases = DBs with Inefficient (%) > 50 % and Inefficiency (%) Increasing over time

Inefficient databases to focus on

Database Inefficiency



Increasingly inefficient among the most inefficient databases

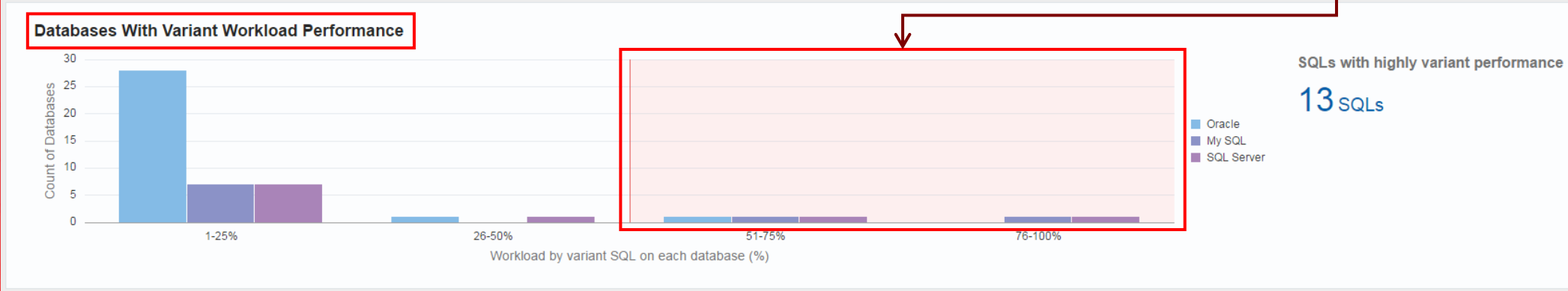
7 DBs

# Performance Analytics

## Analyze workload stability

- Predict the relative variability of a SQL over a period of time
- Focus on databases with variant workload performance

Databases with variant workload performance to focus on

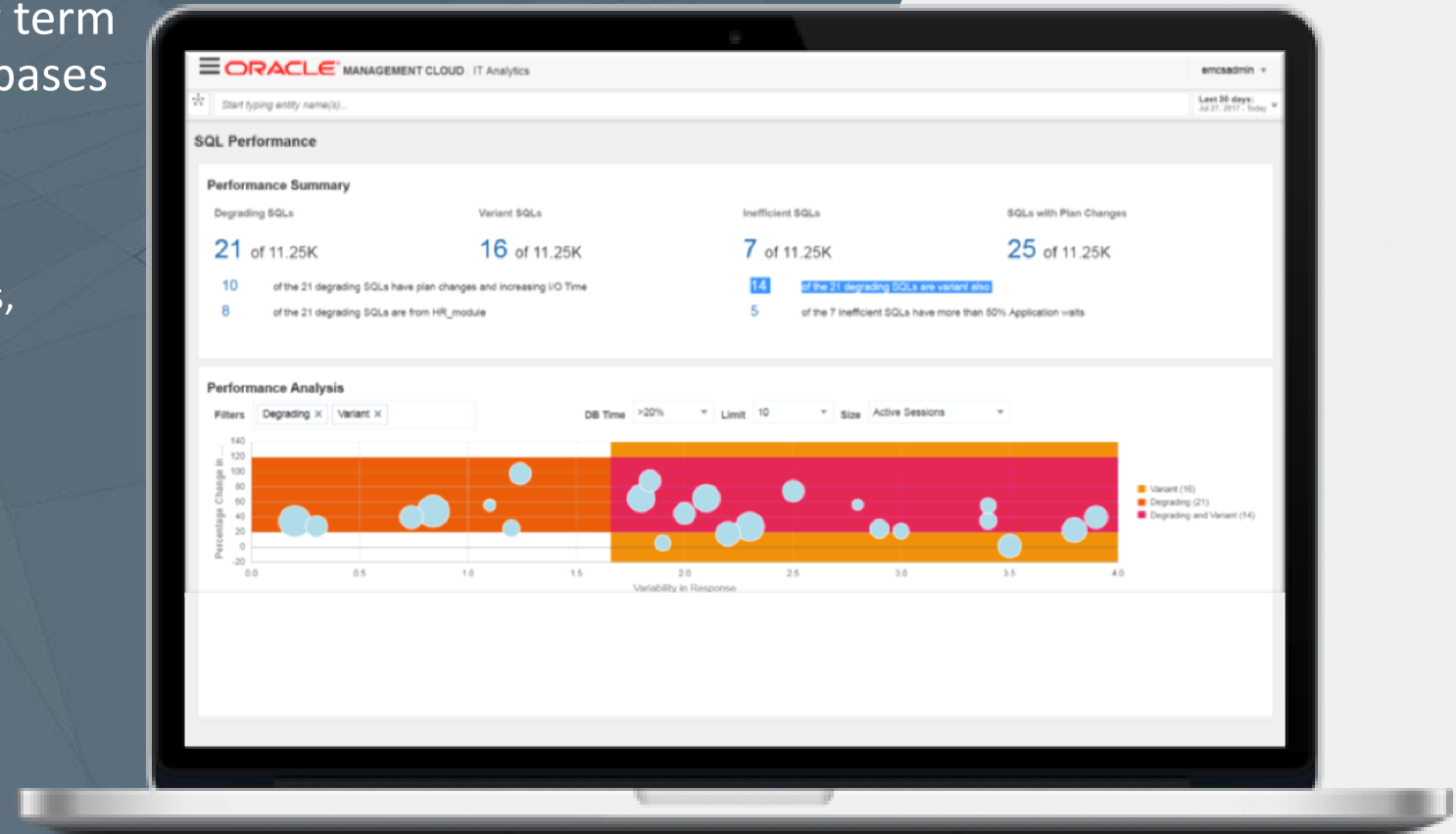


All databases with variant workload performance

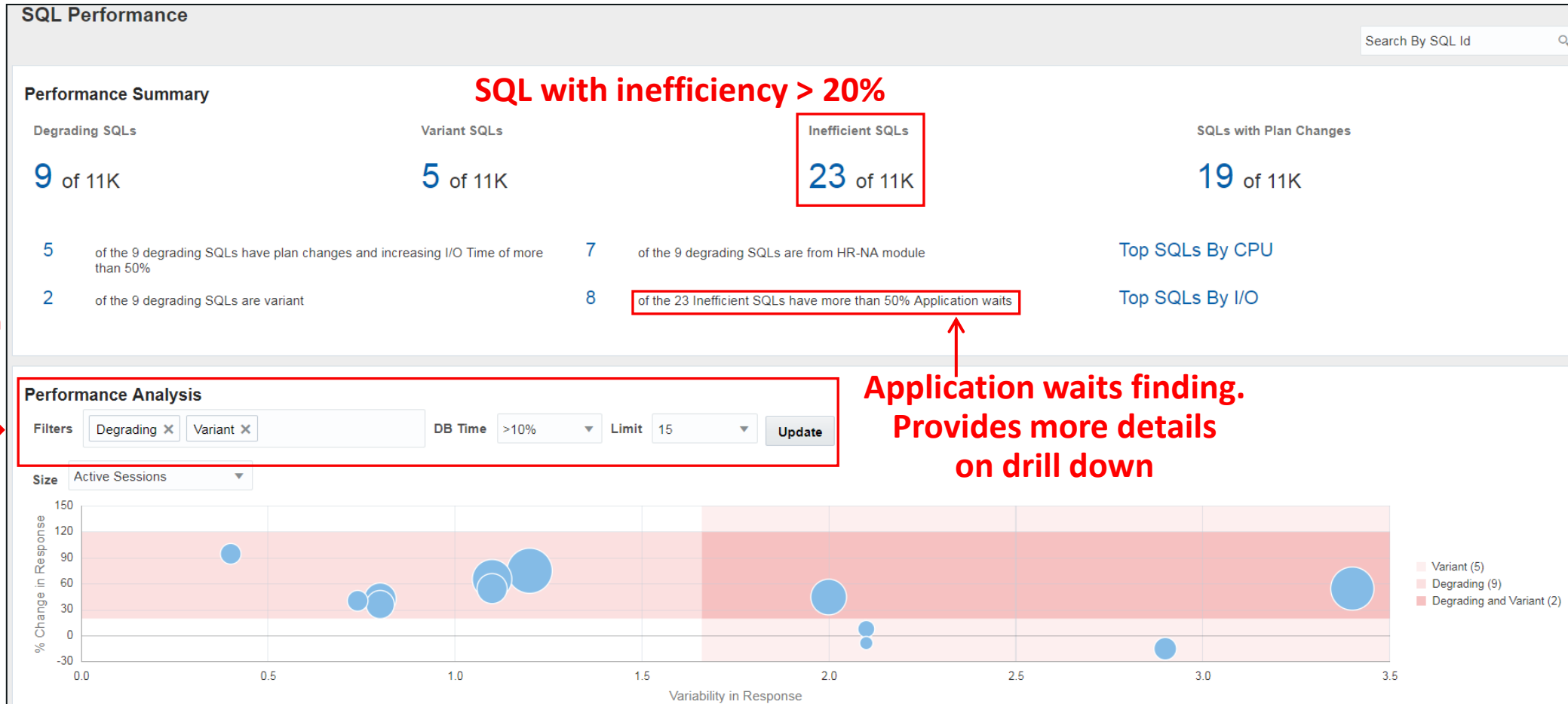
# Performance Analytics

## Analyze SQL performance

- Analyze SQL performance based on long term ASH data and across entire fleet of databases
- Helps find systemic root cause of SQL performance issues
  - Compare performance trends across databases, drill-down to execution plans for analysis
  - Key insights into SQL performance issues
  - Trends and forecast SQL response time and other key SQL performance metrics
  - Was there a plan change for the SQL?



# SQL Performance Analytics



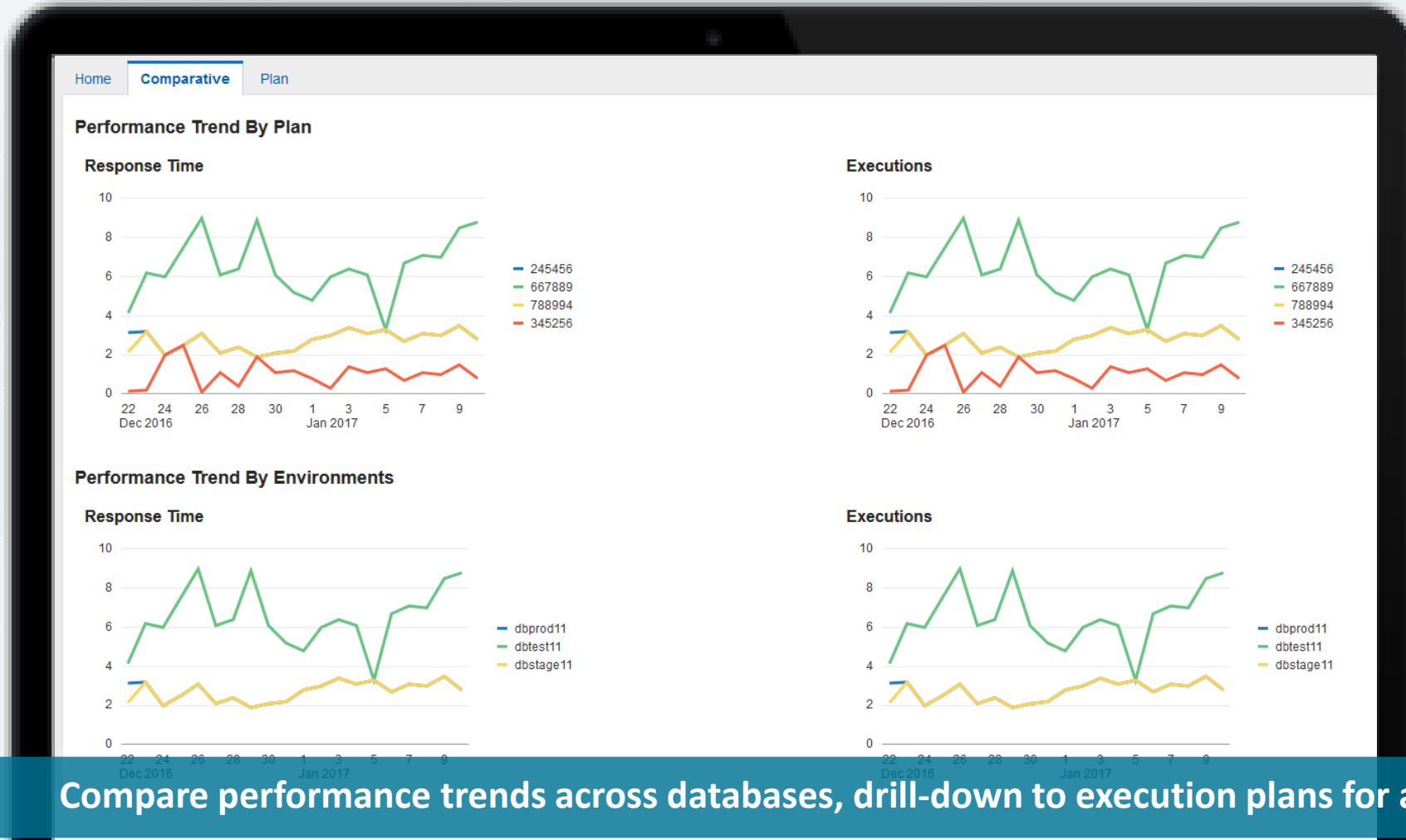
Use filters to explore and narrow down problem SQLs

Application waits finding. Provides more details on drill down

Deeper SQL performance analysis



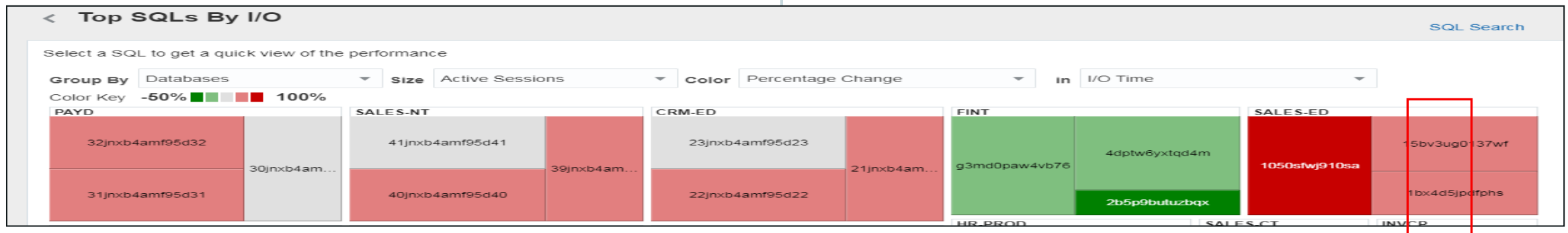
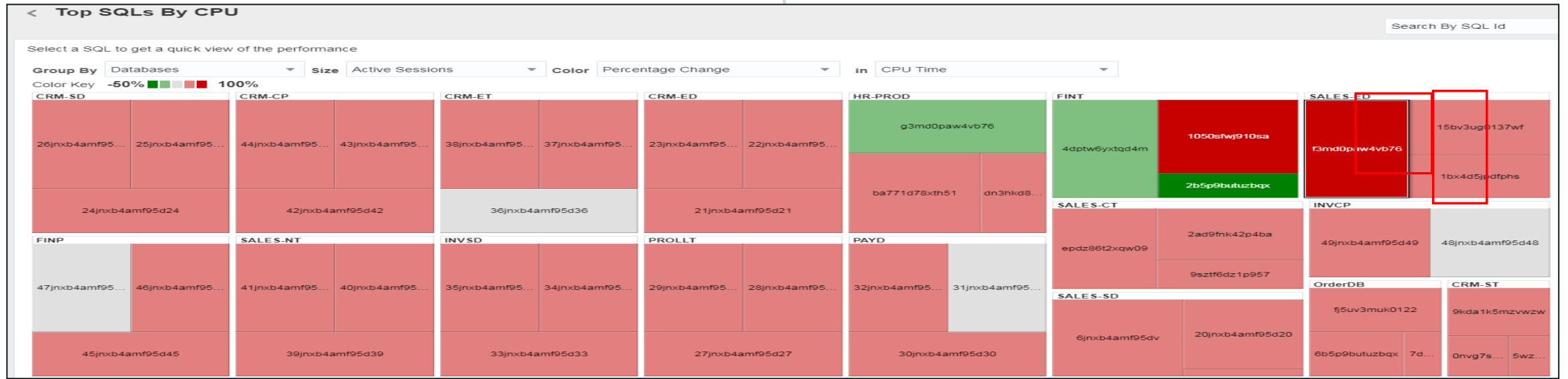
# SQL Performance Analytics



Compare performance trends across databases, drill-down to execution plans for analysis

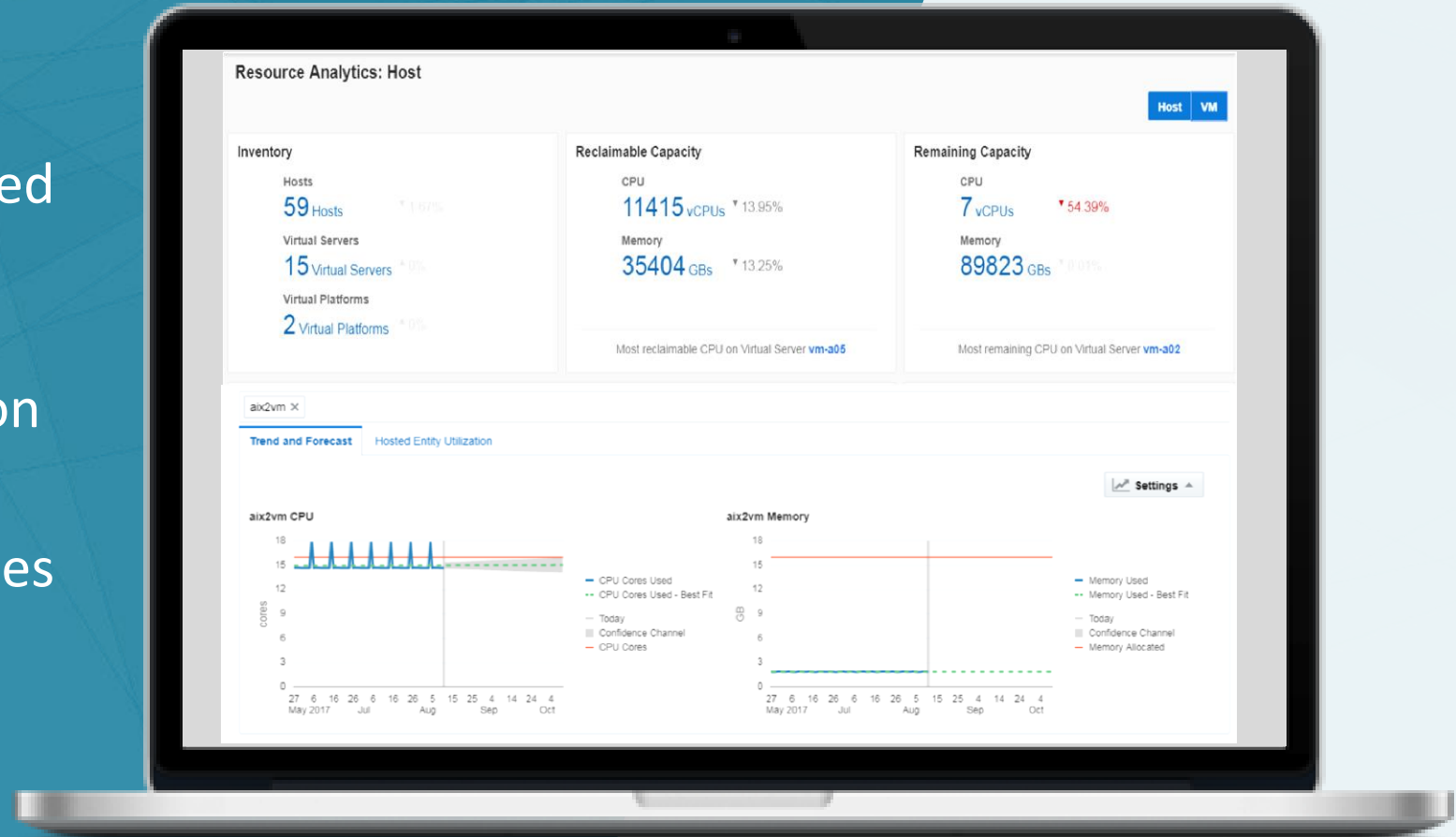
# SQL Performance Analytics

Identify Top SQLs by CPU and IO and GROUP BY various dimensions



# Utilization Analytics

- Analyze current utilization of the hardware & software
- Understand future resource requirements for host, VM based on current consumption
- Forecast future database resource requirements based on current consumption
- Consolidate additional databases or workloads on hosts

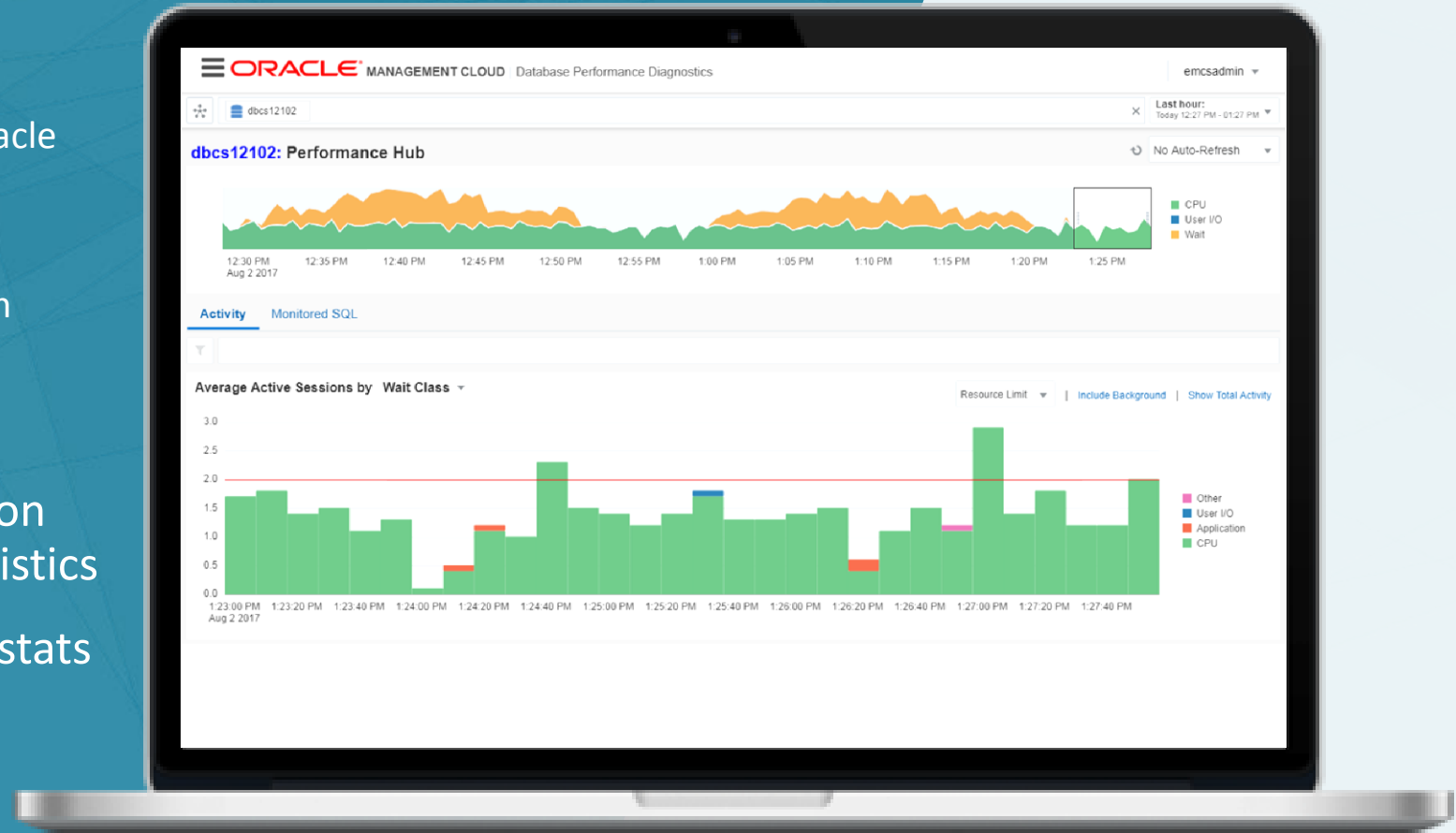




# Ad-hoc Performance Analytics

## ASH Analytics

- Performance activity data gathered sampling technique
  - Implemented in the database kernel for Oracle
  - Similar sampling technique for non-Oracle Databases
  - Efficiently handles volumes of data by down sampling appropriately
- Data sampled every 1 second
- DB time as a key measure and common currency cross databases for SQL statistics
- Active sessions for DB Activity based stats



# Ad-hoc Analytics Demo

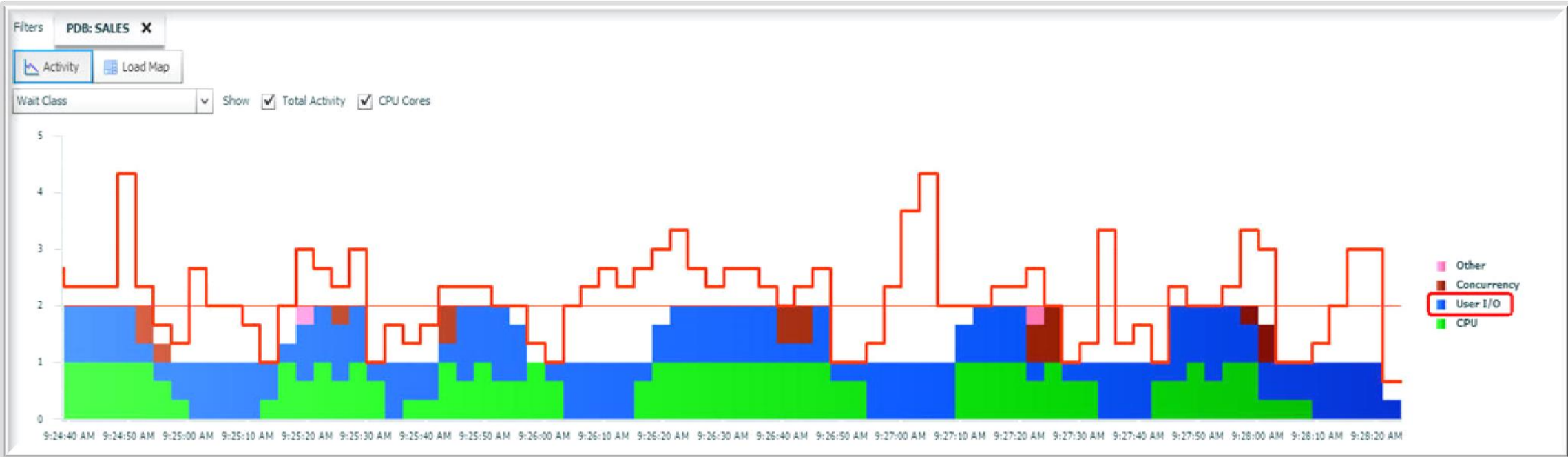
# Ad-hoc Analytics

- I have a CDB with several PDBs in it
- DBA gets complaint from some users of poor performance
- Uses ASH Analytics to diagnose problem root cause



# Reactive Performance Management

## Analyzing transient performance problems using ASH Analytics



# ASH Analytics identifies User I/O as the problem

SQL ID  by Wait Class  Schedule SQL Tuning Advisor  Create SQL Tuning Set  **Identify SQL's that are subject to User I/O**

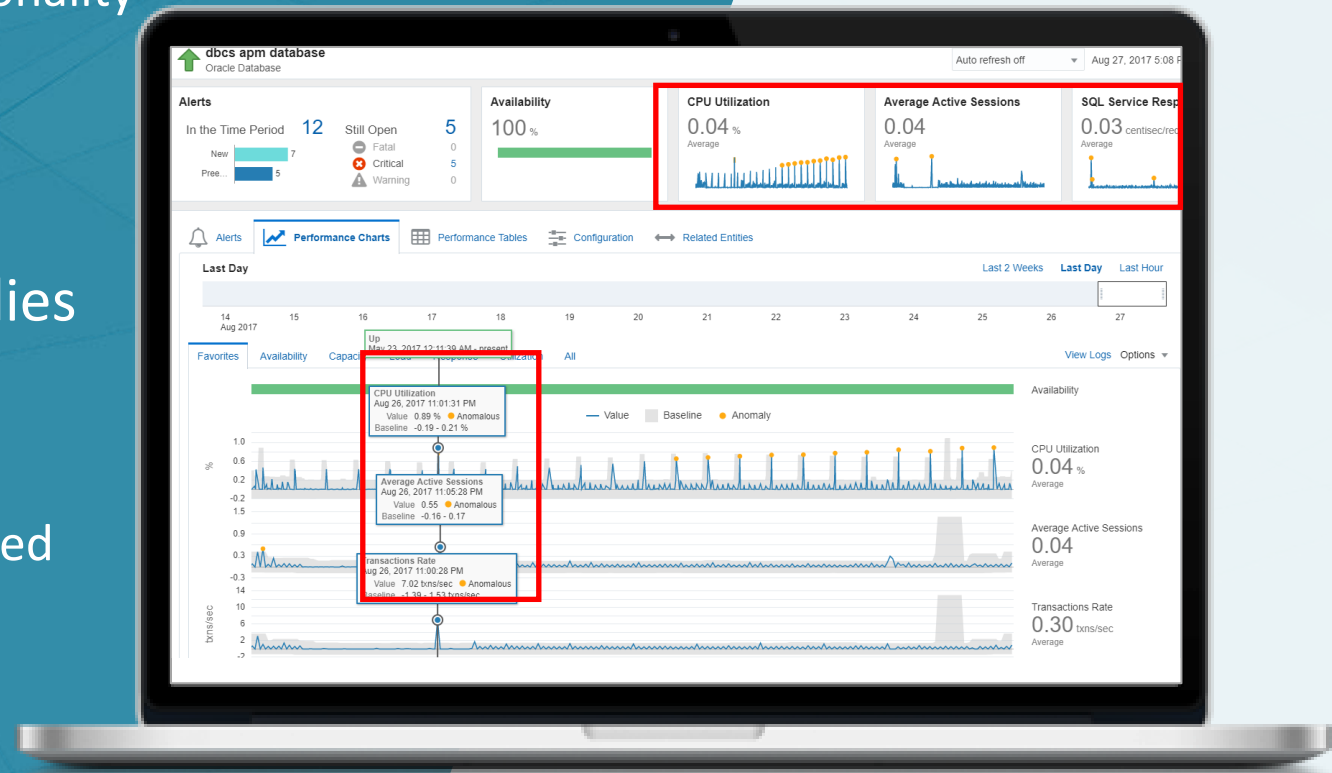
Select	SQL ID	Activity (Average Active Sessions)	User Session	
<input type="checkbox"/>	15zdzvmp3tr	2.66	2:1101,85	.03
<input type="checkbox"/>	ghmpac93jgwv	1.94	2:1184,4573	.03
<input type="checkbox"/>	anmbr78ay04w9	1.86	2:1193,139	.03
<input type="checkbox"/>	6duq7br6onpa	1.66	2:120,49	.03
<input type="checkbox"/>	8yyodhv3bnn78	1.57	2:1296,89	.03
<input type="checkbox"/>	5m48s8x3mfhd7	1.45	2:1383,365	.03
<input type="checkbox"/>	fnauxa95hvm9u	1.27	2:1393,79	.03
<input type="checkbox"/>	cdh3v5s7w00b	1.21	2:19,111	.03
<input type="checkbox"/>	3mysi9479s1d6	1.12	2:207,325	.03
<input type="checkbox"/>	gngdmdc70fqf	1.04	2:298,3995	.03

A man in a dark suit, light blue shirt, and dark tie is looking intently at a tablet device. The background is a blurred cityscape at night with bokeh lights. The image is overlaid with a teal geometric pattern.

# Anomaly Detection and Machine Learning

# Smart Monitoring with Anomaly Detection

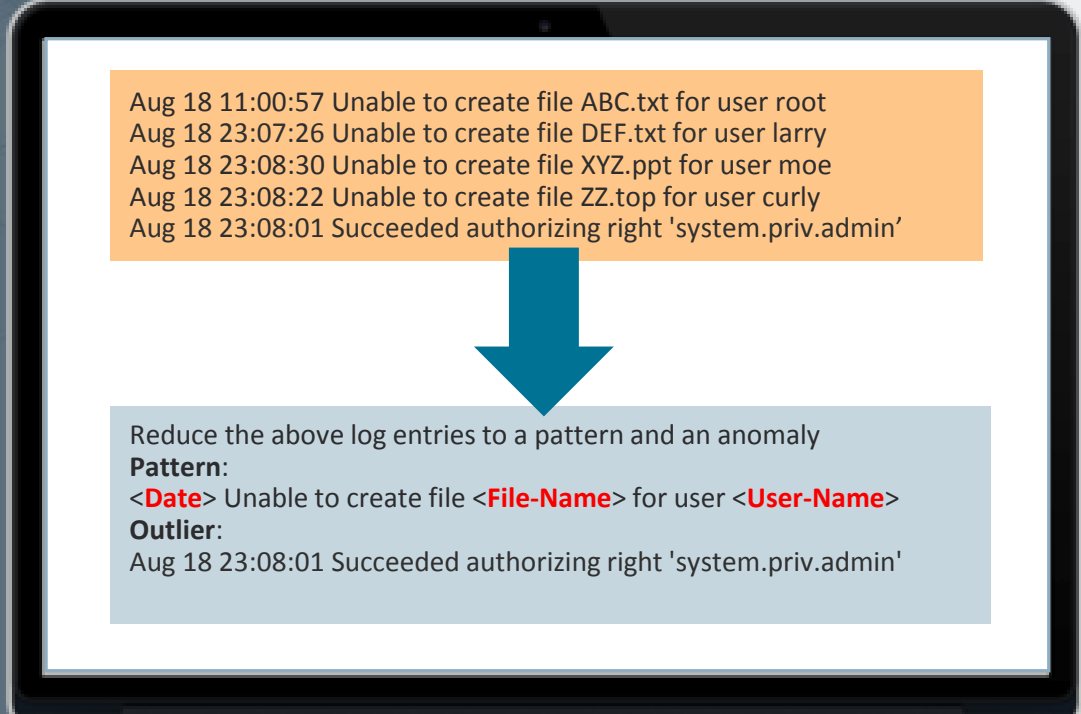
- Baselines automatically calculated to determine normal behavior
  - Tracks and adjusts for daily and weekly seasonality
    - For example, daily seasonality: Load from 9-10 am is expected to be higher than 6 pm – 7 pm
    - Weekly seasonality: Load on Mondays 9 am – 10 am is expected to be higher than Fridays 9 am – 10 am
- Auto-detection of performance anomalies
  - Anomaly = value outside expected baseline
  - Alert when performance is abnormal
  - Metrics from related entities, highly correlated with metric alert



# Diagnose Errors Using Machine Learning

## Analyze and explore log data efficiently

- Specialized machine learning algorithms enable smart clustering of log events based on common signature
  - Reduce millions of log events into smaller set
  - Enables rapid troubleshooting by quickly identifying outliers and anomalies
  - Identify constants and variables in log records; bucketize variables for analysis
  - Topology-aware log exploration
    - Example: Cluster log records from application server and associated databases
  - Show trend of each clustered group; correlate clustered events that show similar trends
    - Example: Storage block corruption log records and DB write errors rising at the same time



```
Aug 18 11:00:57 Unable to create file ABC.txt for user root
Aug 18 23:07:26 Unable to create file DEF.txt for user larry
Aug 18 23:08:30 Unable to create file XYZ.ppt for user moe
Aug 18 23:08:22 Unable to create file ZZ.top for user curly
Aug 18 23:08:01 Succeeded authorizing right 'system.priv.admin'
```

Reduce the above log entries to a pattern and an anomaly

**Pattern:**

<Date> Unable to create file <File-Name> for user <User-Name>

**Outlier:**

Aug 18 23:08:01 Succeeded authorizing right 'system.priv.admin'





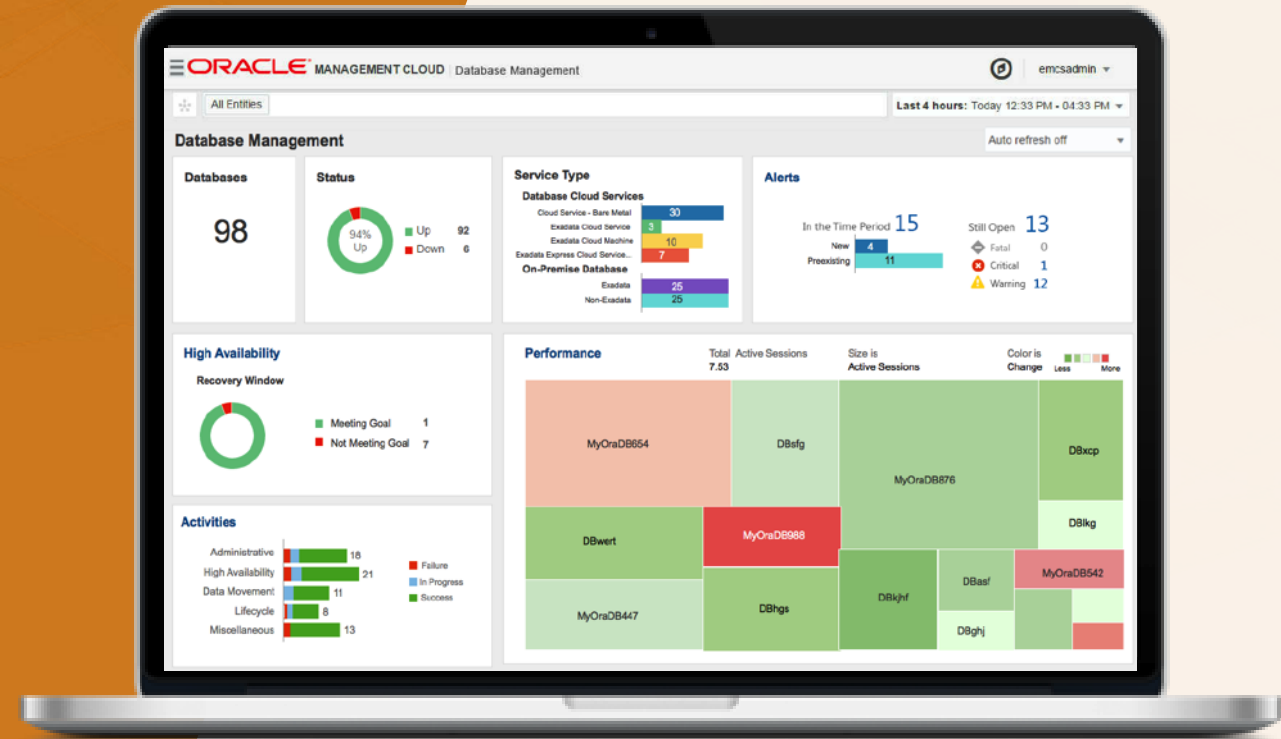
ORACLE®

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# Hybrid Cloud Management

# Fleet Management

- Single pane of glass management view for all databases – on-premise and cloud
- Highlight active services, services with problems (alerts, failed backups), workload spikes, workflow status, etc.
  - Identify needle in the haystack - outliers based on CPU, I/O, memory and other important statistics
- Drill-down to respective single service pages for active management operations, troubleshooting and diagnostics
- Support for active operations at fleet level
  - E.g., set an init.ora parameter for all databases supporting an application



# High Availability

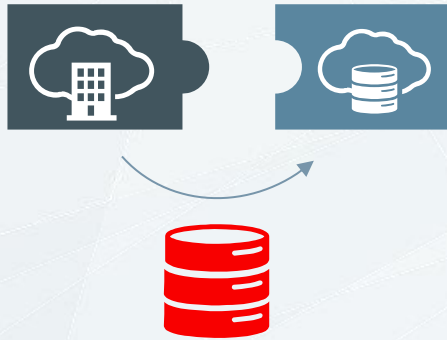
- High availability fleet page
  - Protect your data by enabling business rules
  - Availability status of all managed databases
  - Backup/recovery related alerts for drill down
  - Identify databases that need attention – if meeting recovery window and unprotected data window goals
  - Supports Active operations at fleet level
    - Example: Backup all development databases as a single operation



# Data Movement

Managed Workflows facilitate workload movement from on-premise to cloud

## Deploy



### Move To Oracle Cloud

**Lift and Shift** workloads to Oracle Cloud with continuous and scheduled refresh of data from test master

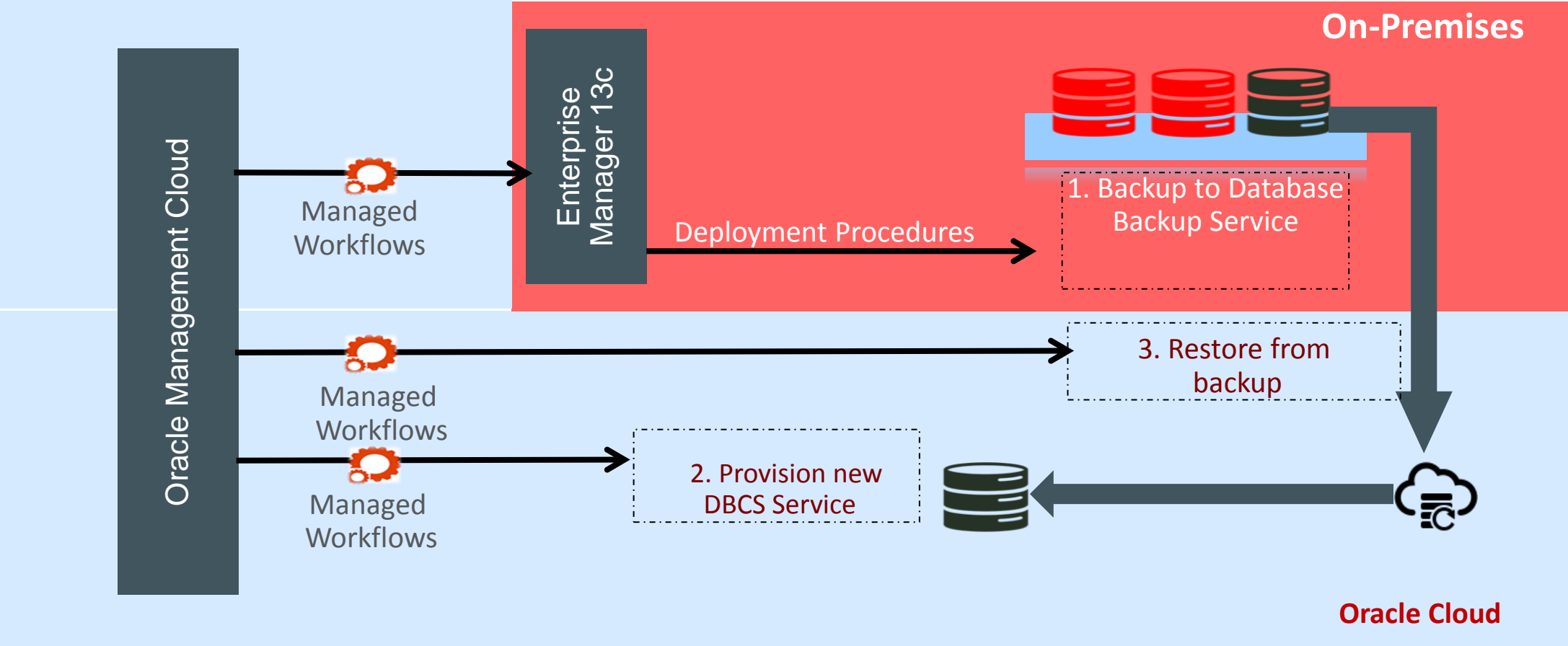
## Create



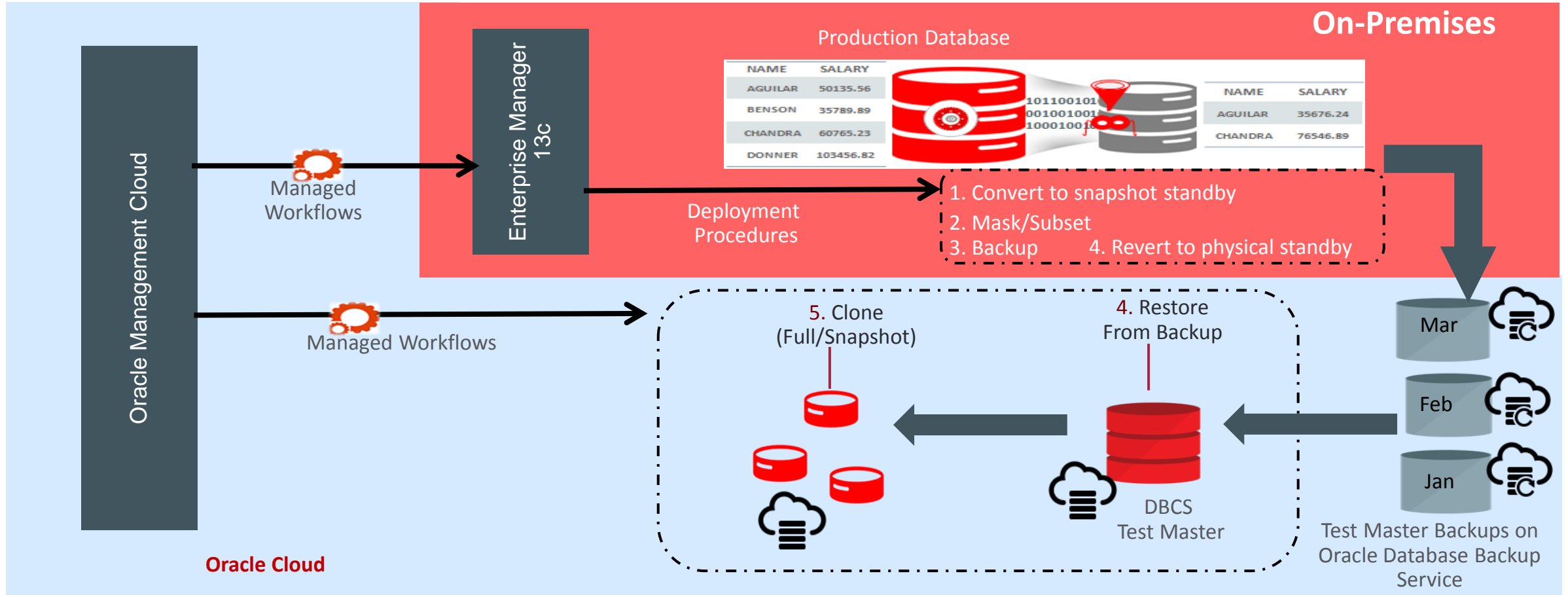
### Test/Dev Creation

**Clone** production systems to cloud, track cloning lineage, data masking and TDE support for sensitive data

# Lift and Shift from On-premise to Cloud



# Test/Dev Creation and Data Refresh





# Modern DB Management Using ML and Analytics

## Comprehensive Monitoring

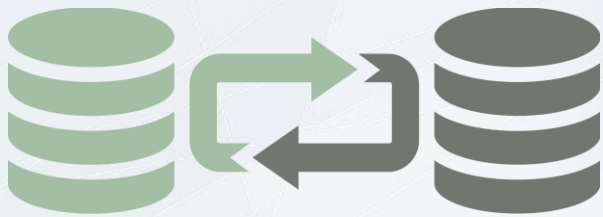


Gain 360-degree insight into the Oracle DBCS performance, availability & capacity planning

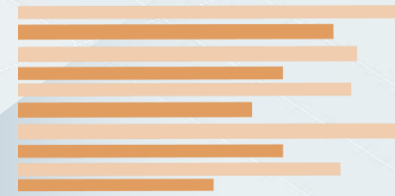


Designed to support IT operations, DevOps, LOB, and C-level executives

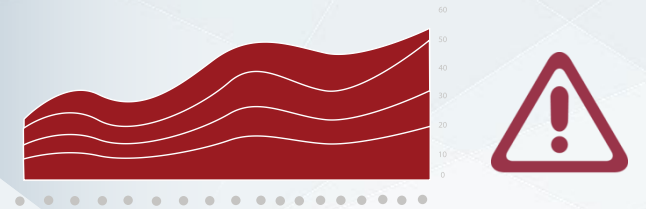
## Hybrid cloud management



## Real-time Analytics



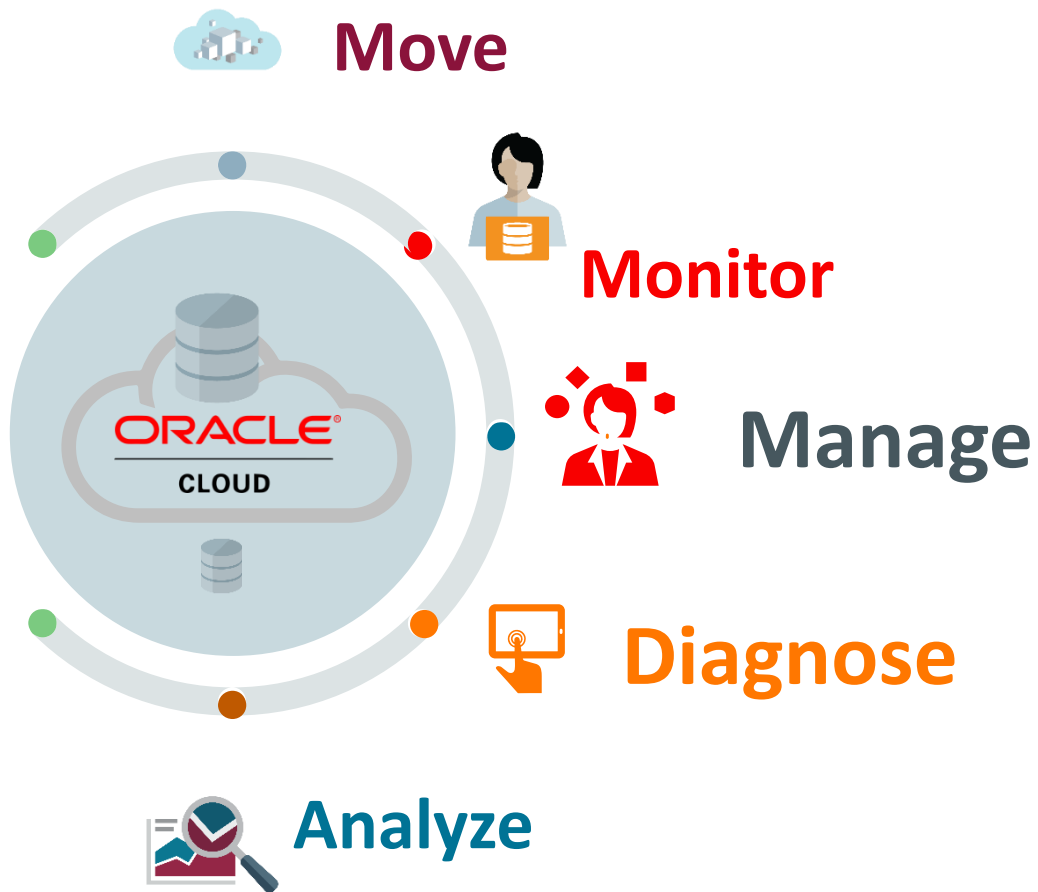
## Anomaly Detection through ML



## Hybrid Cloud Management



# DB Management: Solution Overview



## Analyze



- Performance Analytics for database
- Predict and plan for future demand
- Forecast future database resource requirements based on current consumption
- Reduce total cost of ownership

# New Capabilities for Autonomous Database

- Move databases from on-premise to cloud using automated managed workflows
- Monitor key application metrics with alerting and anomaly detection
- Diagnose and improve application SQL logic
- Analyze logs, performance and utilization trends based on historical data

