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Session#15839
Friday, August 8, 2014: 10:00 AM-11:00 AM

Predictive Analytics And IT Service Management



Agenda

- What is Predictive Analytics?
- Examples
- How is predictive analytics relevant to IT Service Management?
- Typical monitoring and management paradigms
- Real time information versus historical data collection
- Univariate versus multivariate analysis
- Examples of relevant metrics
- Components of a solution
- Roadmap

What Is Predictive Analysis?

- An area of analysis that deals with extracting information from data and using it to predict future trends and behavior patterns
- Relies on capturing relationships between explanatory variables and the predicted variables from past occurrences
 - Exploit the information to predict future outcomes
- Accuracy and usability of results will depend greatly on the quality of data analysis and the quality of assumptions
- Predictive analysis is used in many facets of business
 - Common example would be credit score
 - Function of many data items
 - Income, payment history, amount of outstanding debt, etc...

Analytics Has Become Mission Critical Impacts Bottom Line Results Across All Industries And IT



Banking

- Increase account profitability

Insurance

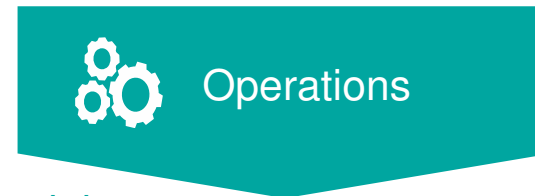
- Retain policy holders with better service & marketing

Retail

- Understand sales patterns

Telecommunications

- Reduce churn with custom retention offers



Industrial

- Predict maintenance issues before occur

Retail

- Improve store performance with P&L reports

Telecommunications

- Understand & manage network traffic

Insurance

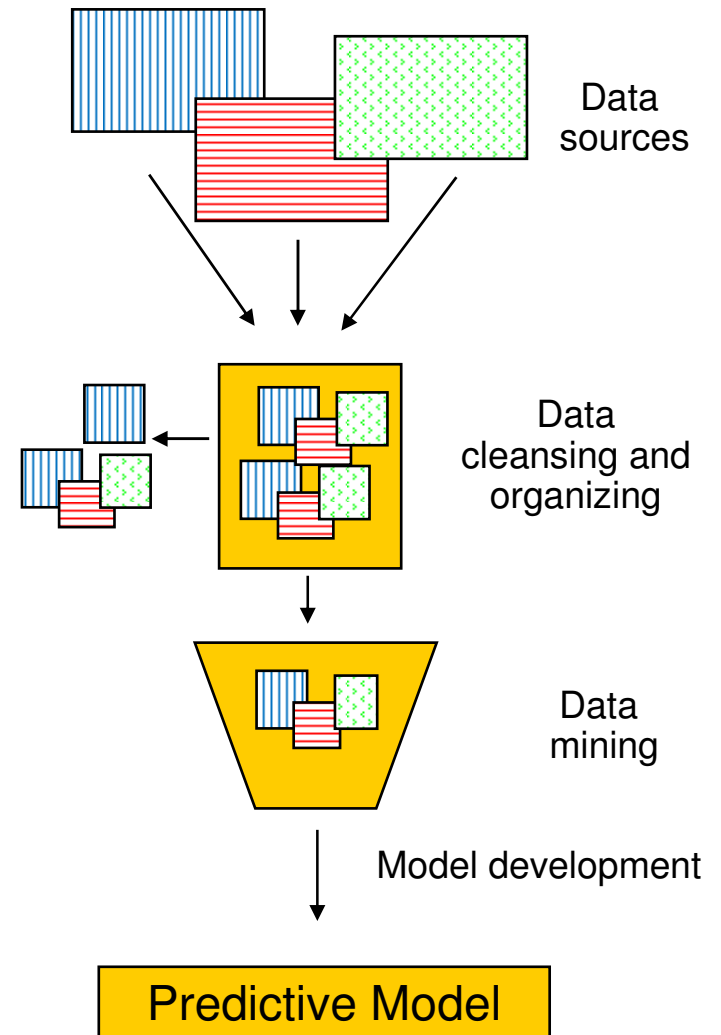
- Streamline claims process

Government

- Reduce fraud and waste

Steps In The Predictive Analytics Process

- Data organization and cleansing
 - Identify data sources
- Data Mining
 - Analysis of data to identify underlying trends, patterns, or relationships
 - Identify data to be used to develop the predictive model
- Model Development - Regression models
 - Regression modeling describes the relationship between dependent variable (the variable to be predicted) and independent explanatory variables
 - Regression models imply some level of causation (versus correlation)



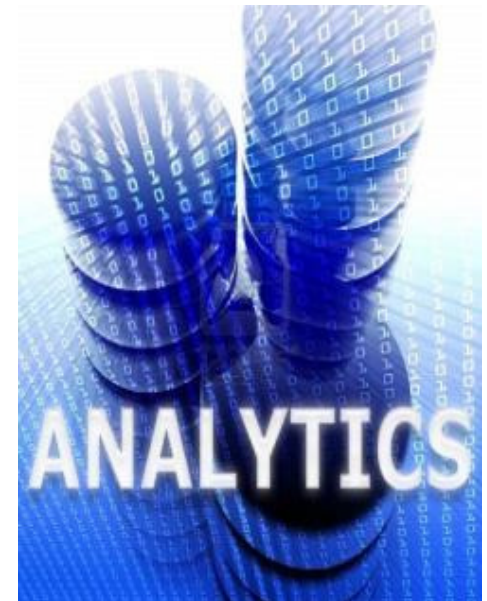
Predictive Analytics

About Regression Models And Types Of Models

- Regression models are the core of predictive analytics
- A wide variety of models can be applied
 - Linear regression model
 - Analyzes the relationship between the response or dependent variable and a set of independent or predictor variables
 - Partial or Stepwise regression
 - Modeler does not specify all the explanatory variables
 - Variables are added iteratively
 - Logit or Probit regressions
 - Allow one to predict a discrete outcome (yes/no) from a set of variables
 - Time series models
 - Used for predicting or forecasting the future behavior of variables
 - Data points taken over time may have an inherent time relation
 - Developed to decompose the trend, seasonal and cyclical component of the data
 - Many more models.....

Analytics for System z – Enhanced Search, Optimize, and Predict technology

- **Huge amount of critical IT operational data** (SMF, log, journal)
.. More than distributed-only environments.
 - Focus on problem determination and time to resolution while placing premium on availability of services and applications.
- **90% of the Fortune 1000 companies are running z** and have 'Systems of Record' dependencies for transactional processing and data serving applications .
- By 2016, **20% of Global 2000 enterprises will have IT operations analytics** architecture in place, up from < 1% today, looking to integrate across their enterprise to reduce outages (Gartner).



Examples Of Predictive Analytics Commonly Applied to IT

- Performance modeling
 - z/OS workload right sizing and load balancing
 - Model workload placement using SMF data as input
- Trending and forecasting of workload/resource utilization
 - Workload performance trends
 - Discern patterns in resource utilization
 - Capacity planning
 - The common question >> When will a critical resource reach breaking point?
- 'What If' Analysis examples
 - DB2 buffer pool analysis
 - DB2 performance trace data to determine optimal pool sizing and object placement
 - DB2 SQL and object tuning
 - DB2 Explain analysis based on DB2 Catalog statistics and SQL call changes

What Is IT Service Management?

Customers want to improve this....

Why?

... to run their business like this.

Integration

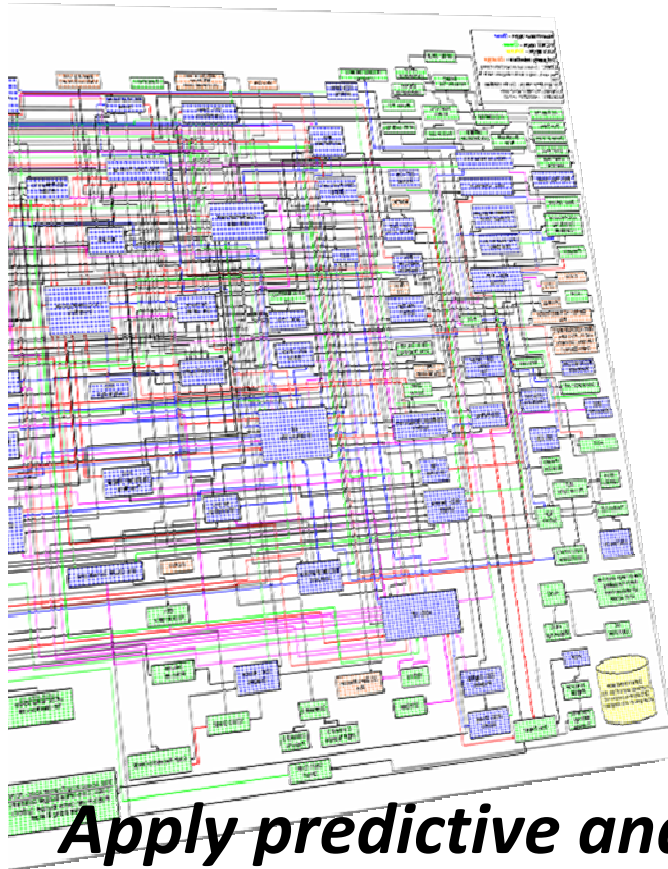
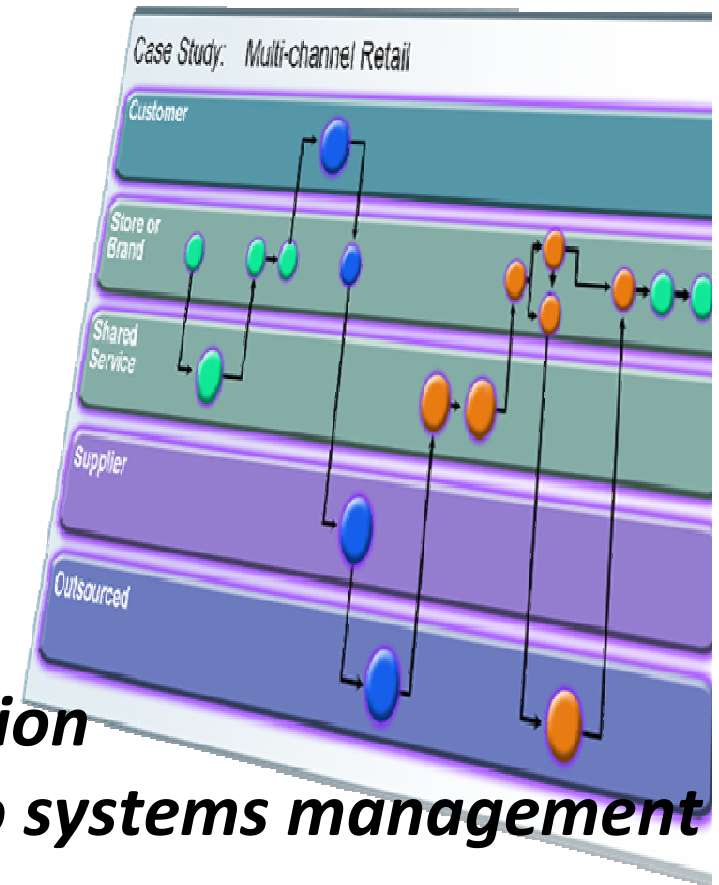
Manage Exponential Change

Reduce Complexity

Ensure Compliance

Reduce Cost

Improve Control



Focus on integration

Apply predictive analytics methods to systems management

A Goal For Many Shops Make Systems Management More 'Proactive'

- In many shops systems management tends to be done 'ad hoc'
 - Some alert generation – varies by shop
 - Some shops very alert driven – many are not
 - Often notification consists of 'call the help desk'
- Many customers want to be more 'proactive'
 - Definition of proactive may vary
 - Proactive for some installations may mean more rapid alert and notification of technical and/or business application issues
 - Proactive for some installations may mean notification **prior** to the problem
 - Alert when utilization indicates a potential issue in the future
 - Alert when I'm within 90% of the wall

The Typical Monitoring Paradigm

- Traditional monitoring strategy
 - Monitor key resources based upon established ‘best practices’
 - Resource utilization and resource bottlenecks
 - Monitor performance and availability
 - Key Performance Indicators (KPIs)
 - Examples – Response time, transaction rate, technical component, software subsystem, or business application availability
 - Monitor based on established SLA’s
 - Alert notification about performance bottlenecks and outages
 - Notification via monitoring UIs, paging, emails
- Real time monitoring versus historical
 - Real time monitoring for current utilization and status
 - Historical data collection for trending and after the fact analysis

Most shops monitor – but how predictive is it?

Problem Analysis And Resolution In Many IT Environments

- Problem identification and notification may be ad hoc
 - Alert notification via phone calls, emails, or paging
- Problem analysis is often after the fact
- Problem analysis and resolution often involves rounding up the usual suspects (and getting them to confess)
- Issue resolution relies heavily on the knowledge and intuition of the technical staff
 - Knowledge of the systems and business applications
 - Understanding **complex problems** will be **multivariate** in nature

The Problem: Traditional Monitoring Approaches Have Limitations

- Many tools, data sources and metrics available
 - Many are Resource/Single Metric Focused (Univariate)
- Often many missed, or misinterpreted events
- In many shops not enough time, and/or resources to correlate completely
 - May require many people and groups to collaborate effectively
 - Many resources and no obvious resource inter-relationships

Univariate - refers to an expression, equation, function or polynomial of only one variable

Multivariate - encompasses the simultaneous observation and analysis of more than one statistical variable

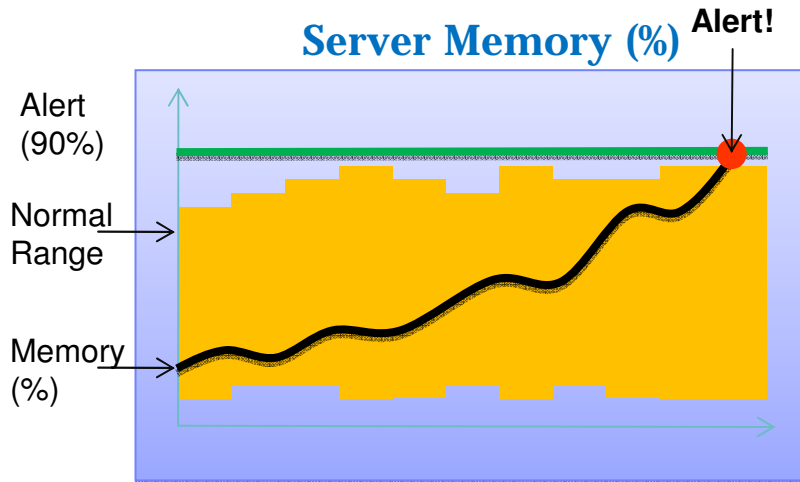


Why Multivariate Analysis?

- Multivariate analysis expands the relevance of the predictive analytic approach
 - Provides context through correlation
- Example – credit rating metrics
 - Payment history – how relevant if I do not consider other metrics?
 - Income – again how relevant if I do not consider other metrics?
- Multivariate is important for IT Service Management
 - Many business applications are composite in nature
 - Many components, platforms, core technologies
 - Many critical resources are shared and inter-related
 - Mainframes support many applications
 - Networks may support a wide array of workloads

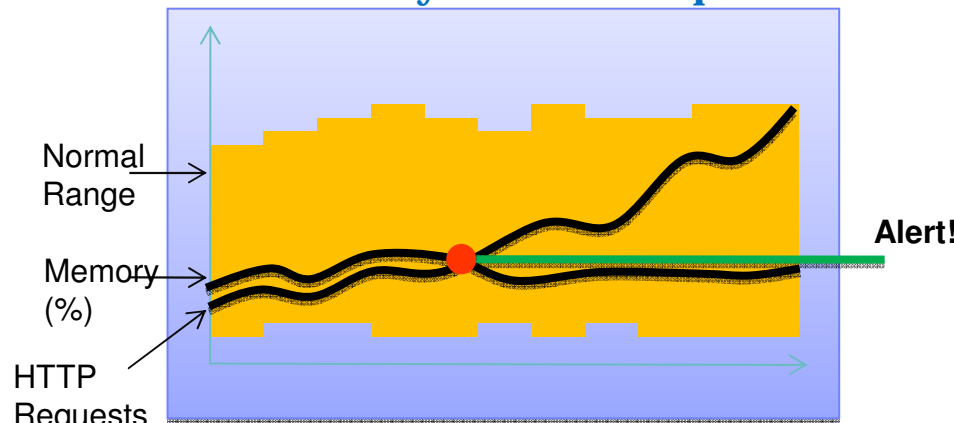
Multivariate Analysis In An IT Context – An Example

Server Memory (%)



Static Threshold = Short Warning

Server Memory + HTTP Requests



Multivariate = Alerts earlier on Deviation

Multivariate analytics detects problems sooner by detecting the deviation of metrics that normally move together.

For example:

- Memory consumption is normally correlated to HTTP requests
- But when memory deviates from HTTP Requests, as would happen with a memory leak, this indicates a problem and an alert is generated.
- The alert is generated much sooner than waiting for a static threshold violation.

This advanced warning time helps you become proactive and mitigate damage before customer service is impacted.

It also help reduce threshold alerts due to normal threshold violation correlated with HTTP Requests.

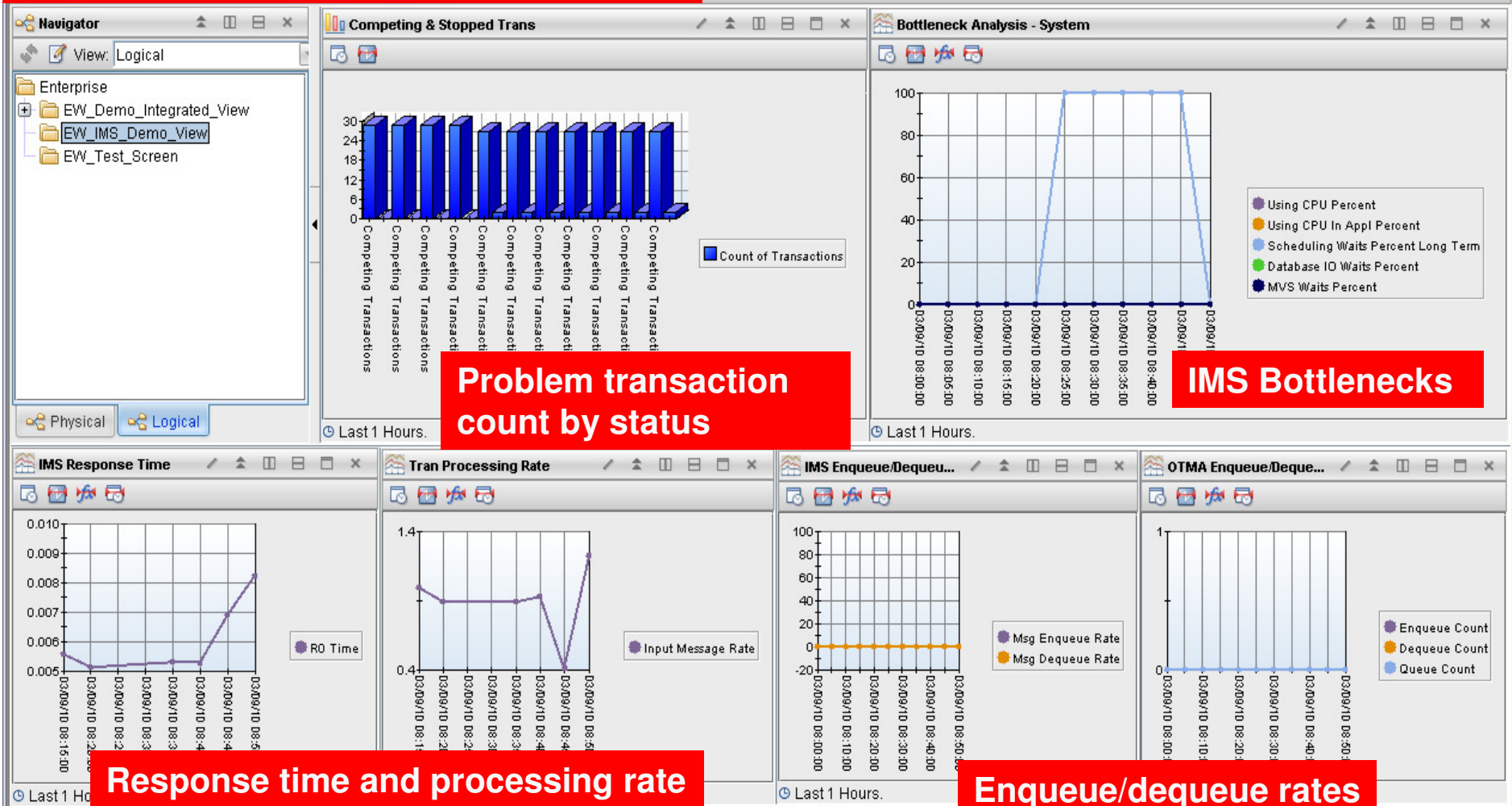
Examples Of IT- related Multivariate Metrics

- DB2 example
 - DB2 object lock conflict >>
 - long running SQL call >> high In-DB2 time >> longer thread elapsed time >> longer DB2 query time
- IMS example
 - High IMS message region occupancy time >>
 - IMS transactions queued >> longer IMS transaction scheduling time >> longer IMS response time >> lower IMS transaction processing rate
- MQ example
 - Lower MQ message input rate >>
 - Higher MQ message queue depth >> lower transaction processing rate >> longer CICS/IMS transaction response time

An Example Of Multivariate Analysis For IMS Performance

Monitor and trend multiple IMS performance metrics over time

Plot chart analysis of key IMS performance metrics



Identifying The Critical Metrics Defining The Data Sources

- Knowledge of business applications
 - Internal operational processes
 - Known issues based upon prior operational experience
 - Maintaining a history of common alerts/events
- Identify critical performance metrics as established by 'best practices' documented in commonly available sources
 - IBM documentation and IBM Red Books
 - Share, CMG, IDUG, Pulse, IOD and other user group presentations
- Define a list of the most critical metrics to track
 - Consider each component/platform for the application(s)
 - Consider various data sources
 - Monitoring, automation, console logs, application data sources

Predictive Analytics

Categories And Sources Of Information For Analysis

- Messages and events
 - System console messages
 - z/OS console messages, CICS, IMS, MQ messages
 - System message logs from open systems sources
 - Application message logs (including error messages)
 - Various abend and error messages
- Alerts
 - Alerts from various monitoring sources
- Monitored metrics
 - Real time monitoring – critical system and resource metrics
 - Historical monitoring and collection
 - Critical system and resource metrics collected for historical analysis
 - Detail and summary historical data

The Challenges Of Message Management

Operators and subject matter experts are overwhelmed with **volumes of data** that they **manually process** to determine the cause, location and scope of a problem.



- Only 3% of the data generated is operations-oriented metric data
- 97% is unstructured/semi-structured data
- An enterprise with 5000 servers generates over 1.3 TB of data per day

Messages Provide Important Input To The Analytics Process



View, track, trend, and analyze critical messages

- Messages highlight issues and events IT platforms
 - z/OS subsystem messages, application errors, abends, notifications, alerts

The Importance Of Messages For Analytics

- What is one of the most common causes of DB2 z/OS outages?
 - “What Happened to My DB2? The Top Missteps in High Availability”
<https://share.confex.com/share/121/webprogram/Session13729.html>
 - Share Conference presentation, John Tobler & Nigel Slinger

The Importance Of Messages For Analytics

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- **Missing critical messages** - a common source of DB2 outages
 - Are you monitoring all the most critical messages?
 - There are many critical messages that indicate potential issues that may impact availability

The Importance Of Alerts For Analytics

File Edit View Tools Navigate Help 07/31/2014 11:03:47
 Auto Update : Off
 Command ==> KOB SITEC* ITM Situation Status & Message log Plex ID :
 Region :

Situation Event Status

Columns 3 to 3 of 8 Rows 1 to 12 of 23

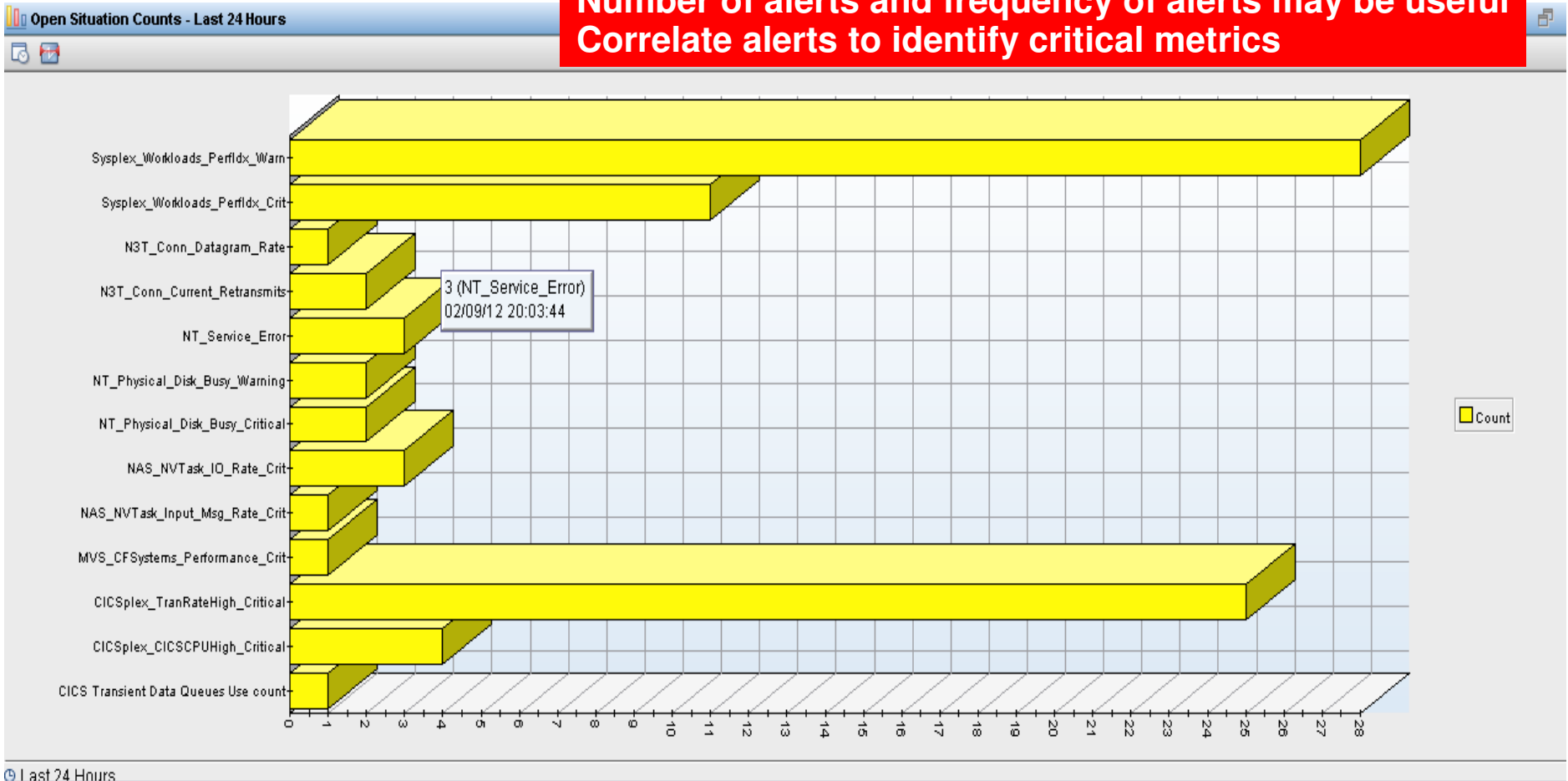
ΔSTATUS ▽	ΔSITUATION NAME ▽	ΔMSN Event Source ▽
_ Open	zOS_Service_Class_Warning	ESYSPLEX: MVSE: MVSSYS
_ Open	Linux_AMS_Alert_Critical	zbx-scala-p01:LZ
_ Open	Linux_Low_percent_space	zbx-scala-p01:LZ
_ Open	Linux_System_Thrashing	ext6lnx:LZ
_ Open	Linux_AMS_Alert_Critical	zbx-scala-p01:LZ
_ Open	ZIBM_STATIC139_DD02D19A09A4415	CXEGDSST: MVSE: STORAGE
_ Open	Connection_DataBackup	TCPIP: MVSE
_ Open	Linux_AMS_Alert_Critical	zbx-scala-p01:LZ
_ Open	POT_Missing_Workload_DEMQGET	
_ Open	Linux_Low_percent_space	
_ Open	Linux_AMS_Alert_Critical	
_ Open	KHD_Error_Critical	

Alerts may come from a variety of platforms and sources

Don't Overlook Alerts

Alerts Can Provide Valuable Metrics

Alerts may be a useful source of metrics for analysis
Number of alerts and frequency of alerts may be useful
Correlate alerts to identify critical metrics



Real Time Monitoring Provides A Starting Point For Analysis

Real time monitoring provides a view of current utilization, status, and alerts

Alerts

Data

DB2 Distributed threads

Originating System ID	Correlation ID	MVS ID	D
DB1S:MVSA:DB2	db2jcc_appli	MVSA	D

CICS Response time

System ID	CICS Region Name	Group Number	Group Type

DB2 network

Application Name	Origin Node	Response Time	Resp Tin Vari
DSNADIST	TCPIP:MVSA	0.00	
DSNADIST	TCPIP:MVSA	0.00	

CICS network

Origin Node	Application Name	Response Time
TCPIP:MVSA	CICSAOR3	0.00
TCPIP:MVSA	CICSWUI	0.00

Provides a view of current status, but is not necessarily 'predictive' in nature

IMS Response time

IMSID	RTA Group Name	RTA Group Number	Input Queue Time	Proce Tir
IMSB	SYSTEM	0	0.000171	0.00
IMSB	SYSTEM	0	0.000171	0.00
IMSB	SYSTEM	0	0.000171	0.00
IMSB	CLASS 1	1	0.000171	0.00
IMSP	CLASS 1	1	0.000171	0.00
IMS			1171	0.00

IMS network

Origin Node	Foreign IP Address	Foreign Port	Byte Rate
TCPIP:MVSA		0	0
TCPIP:MVSA		0	0
TCPIP:MVSA		0	0
TCPIP:MVSA		0	0
TCPIP:MVSA		0	0
TCPIP:MVSA		0	0

Alerts

Commands

Situation Event Console

Severity	Status	Owner	Item	Source	Impact	Opened

Take Action

Action Name: <Select Action>

Other Examples Of Common z/OS Critical Performance Metrics

WebSphere MQ

Queue depth
Message send/receive rate
DLQ depth
Channel status and performance

CICS

Transaction response time
Transaction rate
Region CPU rate
File I/O count
String waits
Abend messages

z/OS

System CPU rate
Paging rate
WLM Performance Index
DASD I/O MSR time and rate
Critical console messages

WebSphere

Method call count and elapsed time
Heap size
Garbage collection
Connection pool utilization

Network

Network Connection status and performance
Network interface utilization

Historical Data Analysis

Helps Identify Critical Metrics, Trends, Usage Patterns And Potential Issues

EW System CPU History - TTMT-BASEWIN2K3 - SYSADMIN

File Edit View Help

Navigator View: Physical

- DASD MVS
- DASD MVS Devices
- Enclave Information
- Enqueue, Reserve, and Lock Summary
- LPAR Clusters
- Operator Alerts
- Page Dataset Activity
- Real Storage
- System CPU Utilization**
- System Paging Activity
- Tape Drives
- User Response Time
- WLM Service Class Resources
- z/OS UNIX System Services Overview

System CPU Utilization

	Average CPU Percent	RMF MVS CPU Percent	RMF LPAR CPU Percent	Total TCB%	Total SRB%	Average IFA Percent	Average IFA on CP Percent	Average zIIP Percent	Average zIIP on CP Percent	MVS Overhead	4 Hour MSUs	HiperDispatch Management	Partition LCPD%	Partition PCPD%
Real time	38	11.5	32,767.0	12	2	0	0	0	0	3	Unavailable	Unavailable	17	17

System CPU Utilization Interval History

Recording Time	Average CPU Percent	RMF MVS CPU Percent	RMF LPAR CPU Percent	Total TCB%	Total SRB%	Average IFA Percent	Average IFA on CP Percent	Average zIIP Percent	Average zIIP on CP Percent	MVS Overhead	4 Hour MSUs	HiperDispatch Management
05/26/11 01:00:00	9	11.5	32,767.0	9	2	0	0	0	0	3	Unavailable	Unavailable
05/26/11 01:15:00						0	0	0	0	3	Unavailable	Unavailable
05/26/11 01:30:00						0	0	0	0	3	Unavailable	Unavailable
05/26/11 01:45:00						0	0	0	0	3	Unavailable	Unavailable

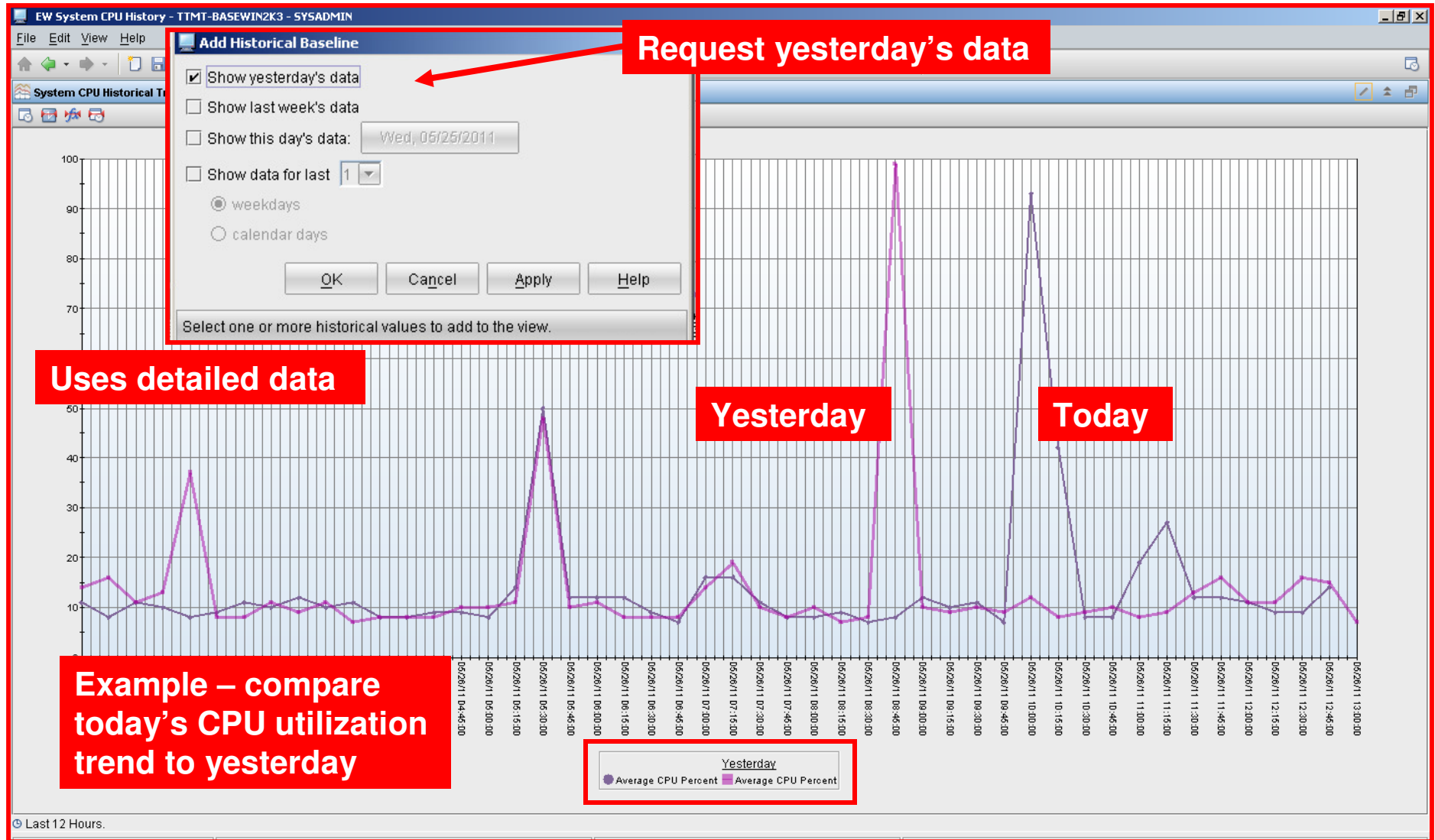
Last 12 Hours.

System CPU Historical Trend

History plot chart
Average CPU over the past 12 hours

Last 12 Hours.

Another Example - Historical Baseline Data To Compare Past Trends To Current Trends



Predictive Analytics Often Begins With History Historical Data Collection Considerations



- Historical data collection varies in cost and quantity
 - CPU, memory, and software process cost of collection
 - Cost of data storage and retention
 - Cost of retrieval and post processing
 - Ease of review and analysis
- Some historical data will be more relevant and useful than other data
 - Consider the context, nature, and meaningfulness of the data

Types Of Historical Monitoring Data

- Know the nature and characteristics of the history data being collected
- Detail data
 - Data that documents/measures detail of a specific event
 - Often high quantity data and the most detailed for analysis
 - May pose the greatest challenge in terms of cost, retention, post processing
 - Examples – DB2 Accounting records, CICS SMF 110 records, IMS log records
- Summary data
 - Data that summarizes underlying detail data
 - Either an aggregation or an averaging of underlying detail records
 - May be useful for longer term trending and analysis
 - Reduces quantity of data and reduces cost of retention, post processing
 - Less detail may mean less diagnostic value

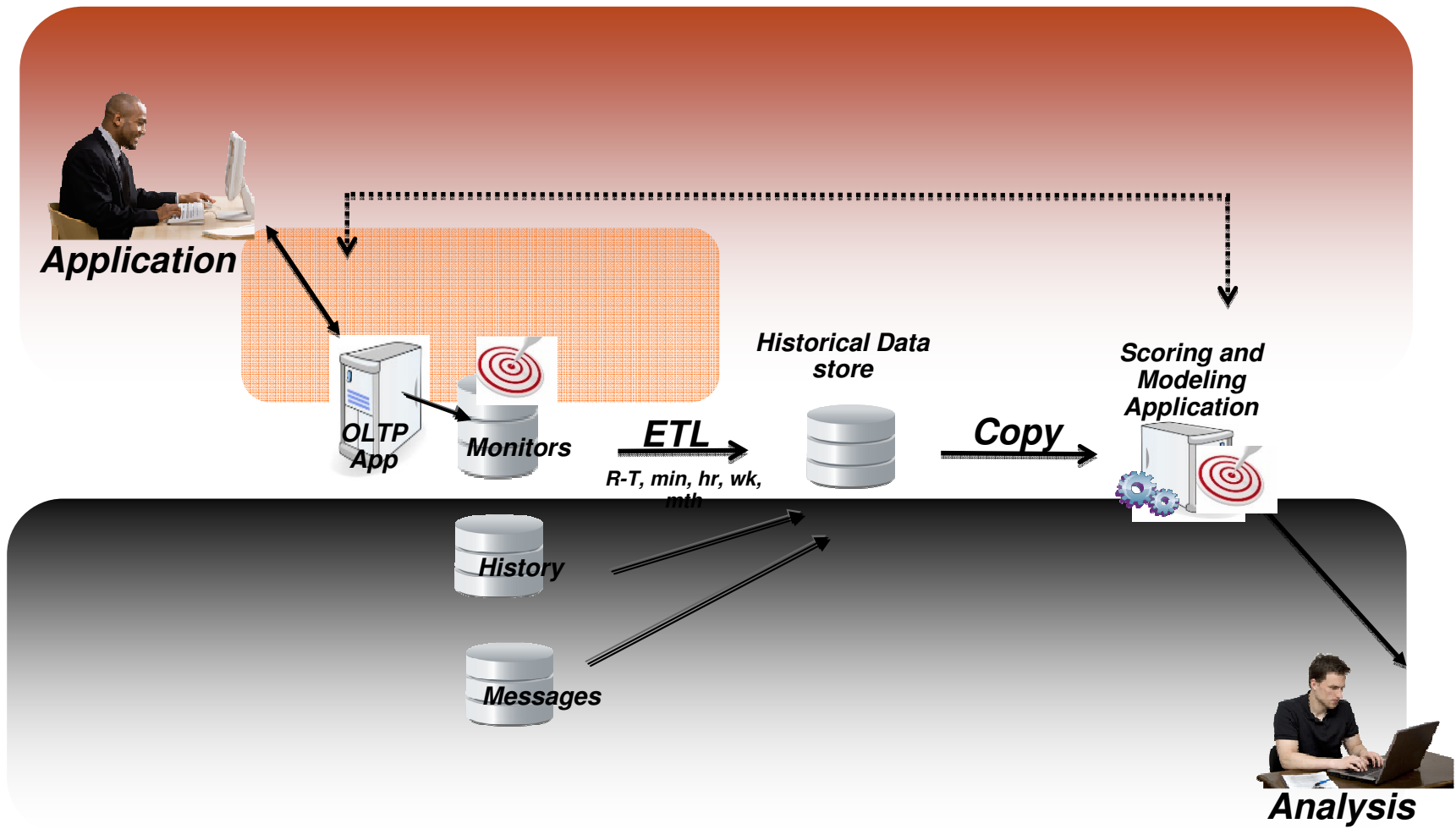
Types Of Historical Monitoring Data - continued

- Interval data
 - History data that includes an encapsulation of one or multiple events to a specified time interval
 - The data will include all activity within that given time interval
 - Useful for problem analysis and trending analysis
 - Examples – DB2 statistics records
- Snapshot data
 - Typically a point in time snapshot of activity
 - Snapshots are usually based on a specified time interval
 - Snapshots may be taken of types of history (detail, summary, or interval)
 - Snapshots will show activity at time of the snapshot, but may/may not reflect activity between snapshots
 - Useful for problem analysis and trending analysis
 - Useful as an aid in setting alert thresholds
 - Examples – snapshot history captured by performance monitoring,

The Components Of An IT Service Management Solution Built On Predictive Analytics

- ***Methodology consists of 3 core components***
 - Analytic data sources
 - Events, message logs, real time monitoring collection and analysis, historical performance metrics
 - Modeling and analysis component
 - Analytic engine to analyze, correlate and 'score' information
 - Reporting and visualization
 - View and display output of the analytic process
 - View actual versus 'predicted' outcomes

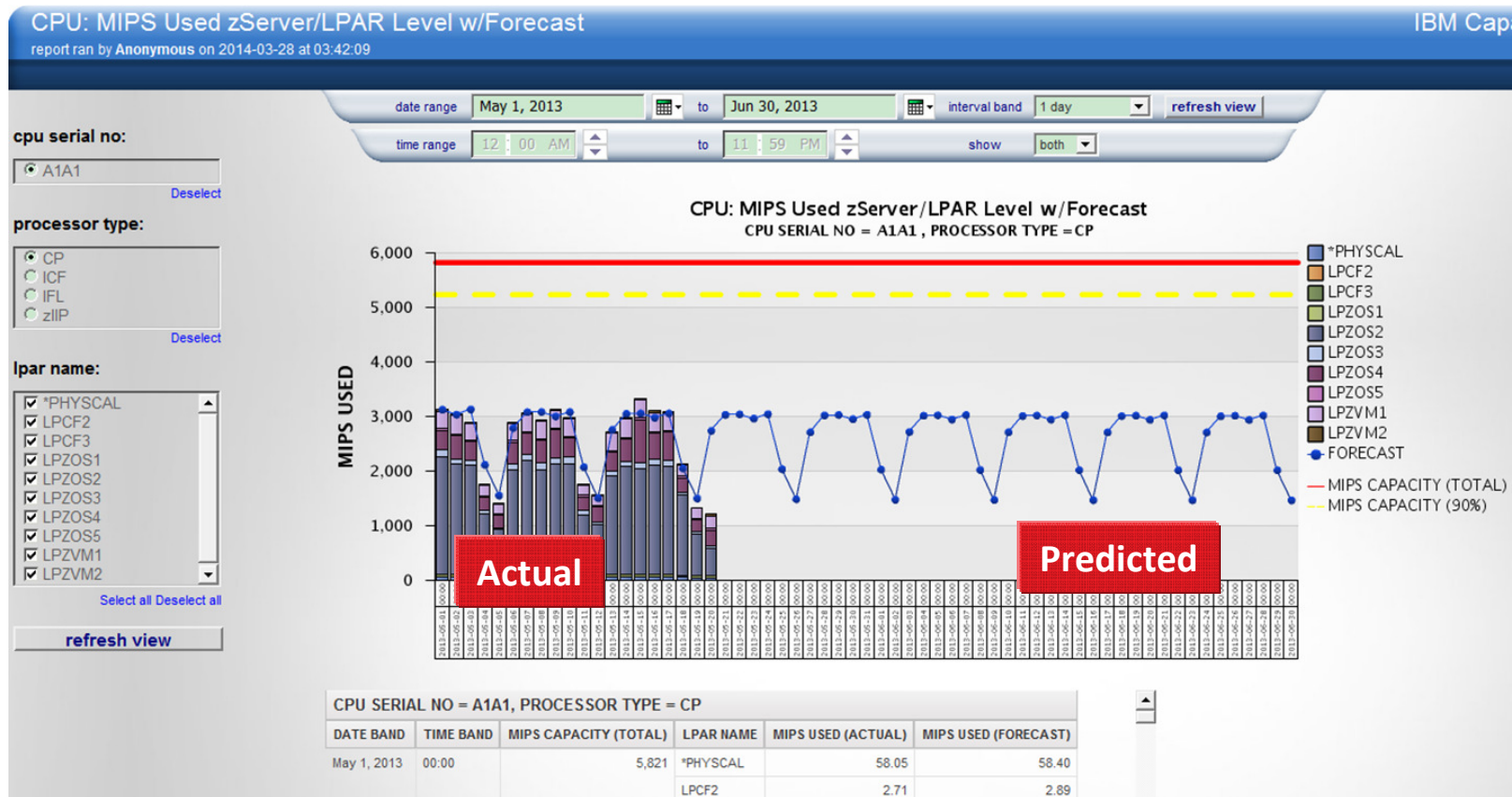
Understanding the Process Of Collection And Scoring



Reporting And Visualization

Answers the questions

- Will current capacity support usage demands 6 months from now? One year from now?
- Are there any cyclical or seasonal trends that indicate a need for additional capacity?



An Example IBM Solution

Capacity Management Analytics - zCMA

- **Capacity Management Analytics**
 - Combines the following
 - TDSz for historical collection
 - SPSS for modeling and scoring
 - Cognos for visualization
- **System/Workload Characteristics, Performance and Trending**
 - What's driving demand?
 - Capacity constraints causing bottlenecks and what's being impacted
 - Anomalies occurred that impacted resource usage and/or performance
- **System/Workload Optimization, Prediction and Forecasting**
 - Available capacity to move workloads / applications to alleviate bottlenecks
 - Balance resource usage across servers/LPARs/VMs and defer capacity upgrade



Thank You!!

Check Out My Blog

http://tivoliwithaz.blogspot.com

The screenshot shows a browser window titled "Tivoli With A z - Microsoft Internet Explorer" displaying a blog post. The browser's address bar shows "http://tivoliwithaz.blogspot.com/". The blog header features the title "Tivoli With A z" in a large, stylized blue font, with a sub-header: "This is a blog to discuss what is happening in the area of IBM z/Series, Tivoli, OMEGAMON monitoring, System Automation, and other relevant IBM Tivoli technology for z/OS performance and availability management." A profile picture of Ed Woods, an IBM Corporation employee, is shown to the right of the header.

The main content of the blog post is dated "Friday, February 5, 2010" and titled "OMEGAMON DB2 Near Term History". It includes two screenshots of OMEGAMON DB2 terminal output. The first screenshot shows the "NEAR-TERM HISTORY" menu with options for "COLLECTION OPTIONS", "RECORD INFORMATION", and "CURRENT STATUS". The second screenshot shows a table of "NEAR-TERM HISTORY DATA COLLECTION RECORD INFORMATION" with columns for "Record Type", "Count", "Timestamp of First Record", and "Timestamp of Last Record".

The text of the blog post explains that OMEGAMON DB2 has a useful Near Term History (NTH) function. It states: "NTH provides an easy way to be able to retrieve and review DB2 Accounting and Statistics records from the past few hours of DB2 processing. The data is stored in a set of VSAM files allocated to the OMEGAMON collection task. How far back the history goes depends upon the size of the files and the amount of data being written to these files. Now some of the data volume is driven by the DB2 workload activity. Accounting records are typically written when a DB2 thread terminates processing, and it is the Accounting data that is often looked at by the analyst when studying what DB2 applications have been doing. Statistics records are created on a time interval basis. Usually, you will have much more accounting data than statistics data. Also, OMEGAMON has the ability to pull in additional trace IFCIDs to get information on things such as dynamic SQL activity."

Below the text, there is a paragraph: "To understand the amount of data being gathered by NTH, there are displays that show the number of records written to the NTH files, by type. In the example I show, you see an example of common NTH settings/options, and then you see the record count in the NTH record information display. If you look carefully you see that 'Perf-Dyn SQL' has a lot of records written relative to the other record types. This is a good way to understand the impact of enabling certain collection options, such as dynamic SQL collection, and see how many trace records are being gathered, as a result."

The post concludes with "Posted by Ed Woods at 3:13 PM 0 comments". To the right of the main content, there is a sidebar with the author's name "ED WOODS" and a bio: "I'm an IT Specialist with IBM Corporation supporting Tivoli Performance solutions on z/OS. Please note that comments made on this blog are my own, and do not necessarily reflect the position of IBM Corporation." Below the bio are links to "View my complete profile", "Links To My Articles", and several article titles: "DB2 Thread Situations", "OM XE For Mainframe Networks", "Situation usage and best practices", "Situation best practices - part 2", "Article on policy automation", "Article on monitoring DB2 dynamic SQL", and "IMS historical performance analysis". At the bottom of the sidebar, there is a "Useful Links" section with links to "Link to IBM Tivoli product information", "Link To Tivoli User Group", "Link to OPAL", and "Tivoli System z Blog".