



# Middleware Framework Approach for BigData Analytics Using GPGPU

*Ettikan Kandasamy Karuppiyah*  
*(ettikan.karuppiyah@mimos.my)*  
*GPU Team @MIMOS for GTC2014*



R&D Activities carried out at  
Nvidia-MIMOS Joint Lab  
(First in South East Asia)



Innovation for Life™



# Outline



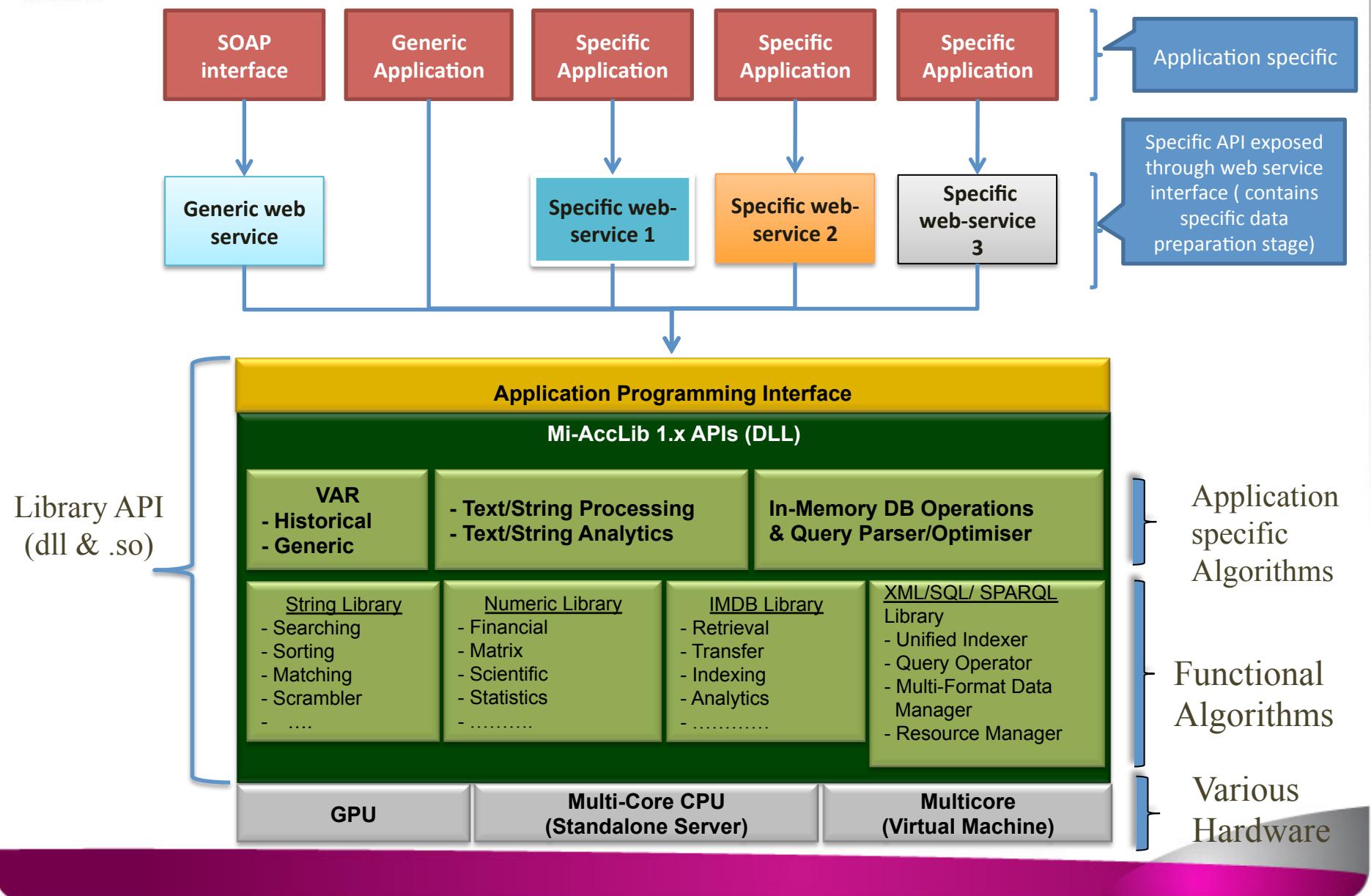
- Challenges of GPU Libraries adaptation in **BigData** Analytics
- Middleware Framework Approach
- Hiding the Computation and Exposing the Presentation
  - Computation by **GPGPU**
  - Presentation by **Visualizer**
- Performance Comparison
- Conclusion
- Future Works



# Challenges of GPU Libraries adaptation in BigData Analytics

- Most of our library users are **non-scientific** in nature
- GPGPU is seen as an "**Acceleration Co-Processor**"
- Expectation is for **ease of use** from application layer
- Libraries are treated seamlessly with independent function call
  - Preference for **simpler programming languages**
  - Java, Web service calls using SOAP, RMI, Socket connection
- **Hide the algorithmic complexity** with simple API parameters
- Structured & Unstructured Data in **xxx Gigabytes**

# Overall Architecture





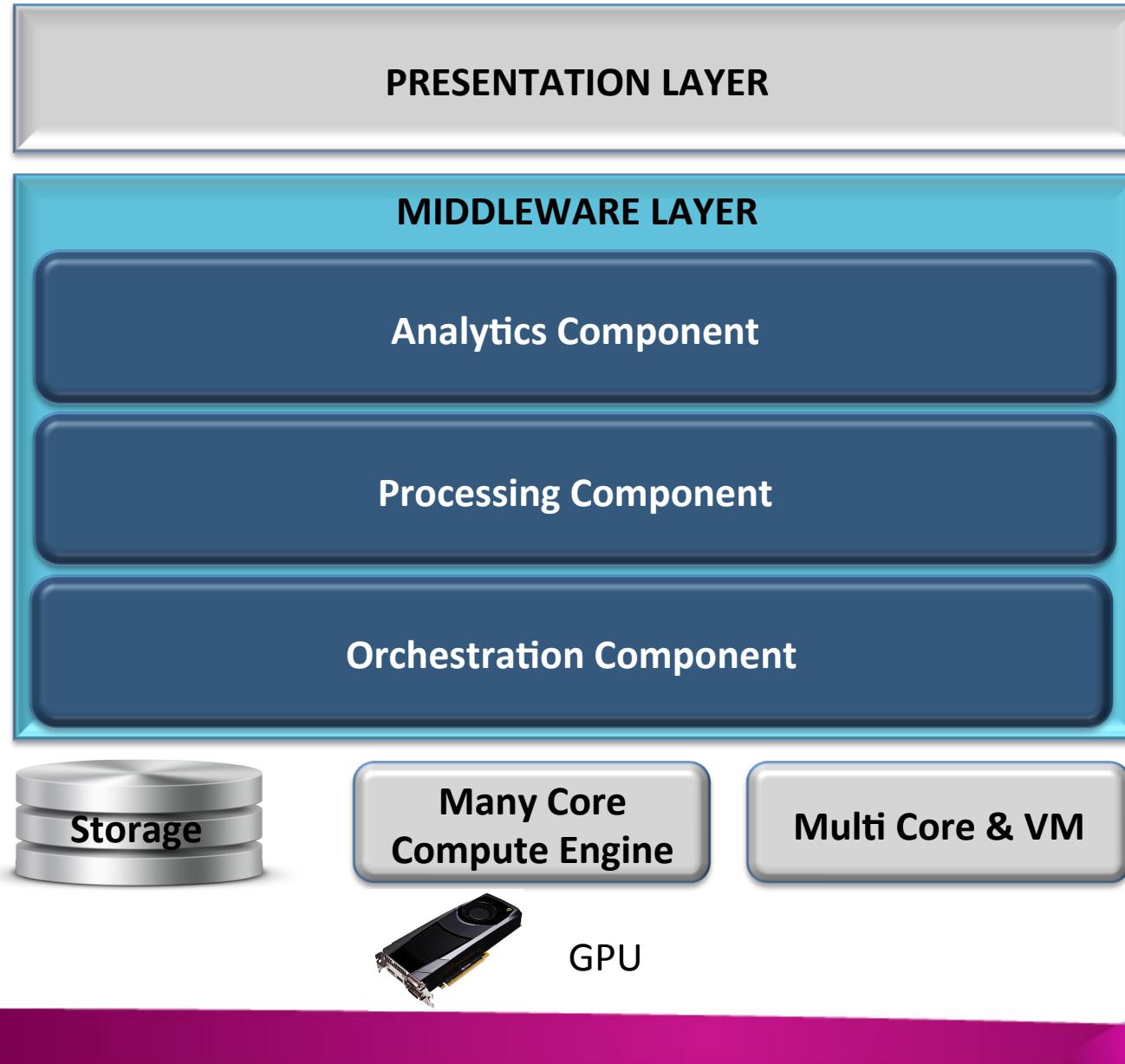
# Outline



- Challenges of GPU Libraries adaptation in BigData Analytics
- Middleware Framework Approach
- Hiding the Computation and Exposing the Presentation
  - Computation by GPGPU
  - Presentation by Visualizer
- Performance Comparison
- Conclusion
- Future Works

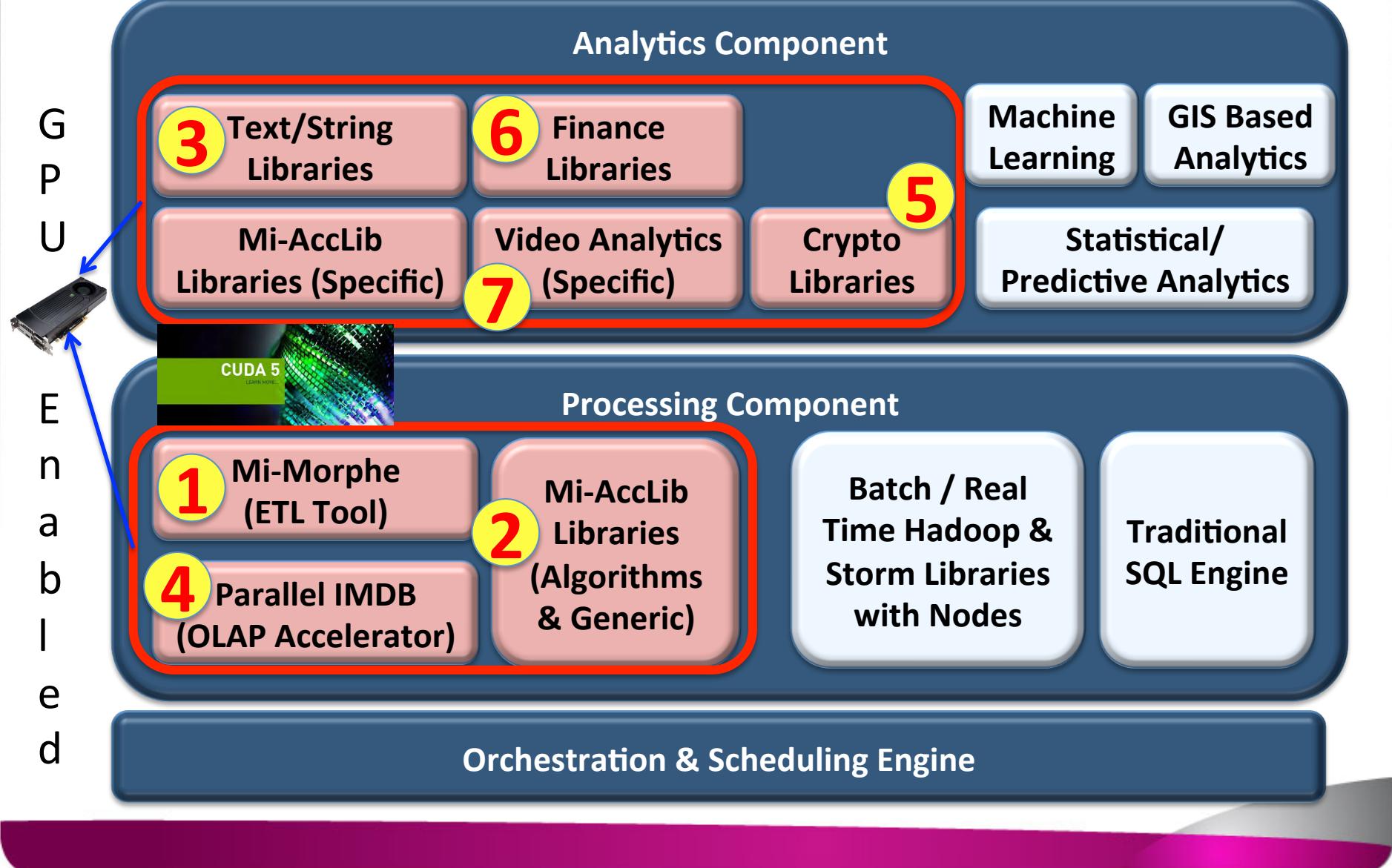


# MIMOS Middleware Framework - Layers





# MIMOS Middleware Layer





# Outline

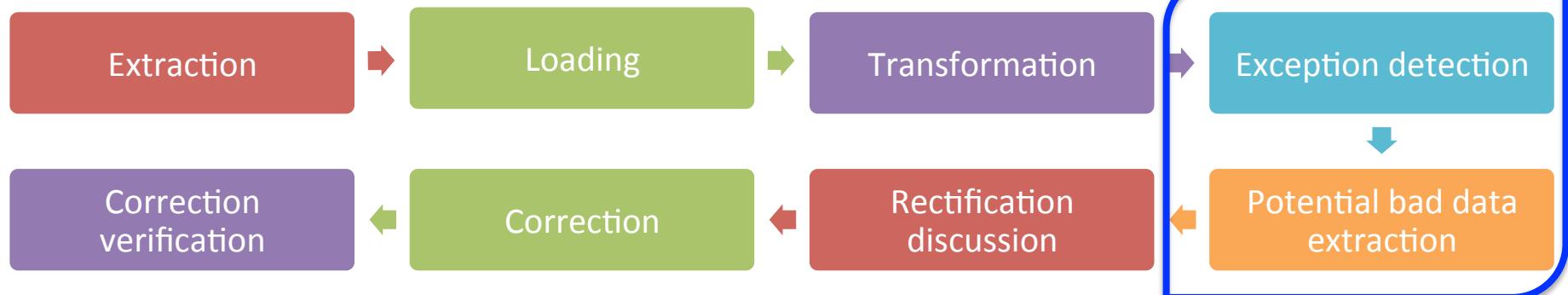


- Challenges of GPU Libraries adaptation in BigData Analytics
- Middleware Framework Approach
- Hiding the Computation and Exposing the Presentation
  - Computation by **GPGPU**
  - Presentation by **Visualizer**
- Performance Comparison
- Conclusion
- Future Works

## 1

## Use Case: Data Cleansing

- Data Detection and Rectification
- **7711 cleansing rules**
- Key 8 steps:



1

- 31 systems from heterogeneous environment:
  - Environment: UNISYS, AS400, Windows, Linux.
  - Data source: DMS1100, DB2, Informix, MS SQL, MySQL, Excel, MS Access, Foxpro and flat files.
- Big Data with Big Computation:
  - **319 source data**
  - Involves ~**1 billions records**, e.g.:
    - 15 millions employee with 150 millions of monthly contribution
    - **880,000 employer** with 65 millions of monthly contributions
    - Match against reference/valid **data with 15 million records**



**AccLib**

# Data Cleansing

**-MORPHE**

1



Source  
Database

| Name                   | datatype | Size | Scale | Precision | Nullable |
|------------------------|----------|------|-------|-----------|----------|
| COURSE_INFORMATION     | int      | 4    | 0     | 0         | true     |
| ASSESSMENT_INFORMATION | int      | 4    | 0     | 0         | true     |
| BOOK_INFORMATION       | int      | 4    | 0     | 0         | false    |
| ID                     | number   | 8    | 0     | 9         | false    |
| FIRST_NAME             | string   | 32   | 0     | 32        | false    |
| MIDDLE_NAME            | string   | 32   | 0     | 32        | false    |
| LAST_NAME              | string   | 32   | 0     | 32        | false    |
| DATE_OF_BIRTH          | date     | 4    | 0     | 0         | true     |
| NUMBER_OF_BOOKS        | int      | 4    | 0     | 0         | true     |
| NUMBER_OF_ASSESSMENTS  | int      | 4    | 0     | 0         | true     |
| ASSESSMENT_TYPE        | string   | 12   | 0     | 12        | true     |
| ASSESSMENT_TITLE       | string   | 40   | 0     | 40        | true     |
| GRADE                  | string   | 2    | 0     | 2         | true     |
| GRADE_DATE             | date     | 4    | 0     | 0         | true     |
| RETURN_DATE            | date     | 4    | 0     | 0         | true     |

Accelerated Duplicate Detection

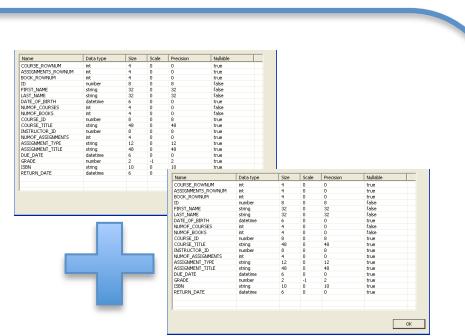
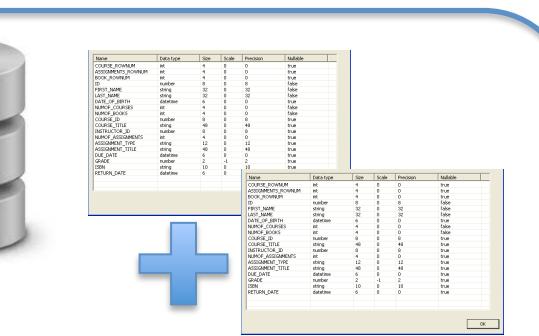


Source  
Database



| Name                   | datatype | Size | Scale | Precision | Nullable |
|------------------------|----------|------|-------|-----------|----------|
| COURSE_INFORMATION     | int      | 4    | 0     | 0         | true     |
| ASSESSMENT_INFORMATION | int      | 4    | 0     | 0         | true     |
| BOOK_INFORMATION       | int      | 4    | 0     | 0         | false    |
| ID                     | number   | 8    | 0     | 9         | false    |
| FIRST_NAME             | string   | 32   | 0     | 32        | false    |
| MIDDLE_NAME            | string   | 32   | 0     | 32        | false    |
| LAST_NAME              | string   | 32   | 0     | 32        | false    |
| DATE_OF_BIRTH          | date     | 4    | 0     | 0         | true     |
| NUMBER_OF_BOOKS        | int      | 4    | 0     | 0         | true     |
| NUMBER_OF_ASSESSMENTS  | int      | 4    | 0     | 0         | true     |
| ASSESSMENT_TYPE        | string   | 12   | 0     | 12        | true     |
| ASSESSMENT_TITLE       | string   | 40   | 0     | 40        | true     |
| GRADE                  | string   | 2    | 0     | 2         | true     |
| GRADE_DATE             | date     | 4    | 0     | 0         | true     |
| RETURN_DATE            | date     | 4    | 0     | 0         | true     |

Accelerated Data Validation with  
Reference Data



RAW DB in  
CSV Format



Results in  
CSV Format



Data Detection (e.g Algorithm used):

1. Exact match
2. Edit distance
3. Numeric Distance
4. Date Distance



AccLib

# Data Duplication e.g (1)

-MORPHE

1

-MORPHE

MIMOS DATA MIGRATION & CLEANSING TOOL (V1.5.0)

admin | 26/09/2013 11:42:34 AM |

Dashboard

Setting

Data Cleansing

Utilities

Administration

Duplicate Detail List

370120105041  
370120105041

Error Type: Duplicate Record Group ID: MOH

Process Name: Process\_DuplicateDetection\_Pesakit\_IC



Mark as valid

Delete

Save

|  | Row ID | Record Status | Merged To                        | NO_KADPENGENALANBAR | IDPEAKIT | KODHOSPITAL | NO_LAINPENGENALAN | NAMA                |
|--|--------|---------------|----------------------------------|---------------------|----------|-------------|-------------------|---------------------|
|  | 40295  |               | <input type="button" value="▼"/> | 370120105041        | 318      | 11-10090018 |                   | SABERAN BIN MOHAMED |
|  | 44890  |               | <input type="button" value="▼"/> | 370120105041        | 5247     | 11-10060020 |                   | SABERAN MOHAMED     |

<  
total 2, page 1 of 1

10

Mi-Morphe – Data Cleansing Tool, accelerated by GPU for performance and cost efficiency



AccLib

# Data Duplication e.g (2)



-MORPHE

1



MIMOS DATA MIGRATION & CLEANSING TOOL (V1.5.0)

admin | 26/09/2013 11:42:34 AM

Dashboard

Setting

Administration

Duplicate Detail L

Identification number

4607**2**1025197

4607**3**1025197

Full name

Othman Md Amin

Othman **B** Md Amin

Data Cleansing > Detection Statistics

Error Type: Duplicate Record Group ID: MOH Table Name: MAKLOMAYI\_EZKARY Job Name: Job\_DuplicateDetection\_Pesakit\_IC Process Name: Process\_DuplicateDetection\_Pesakit\_IC



Mark as valid

Delete

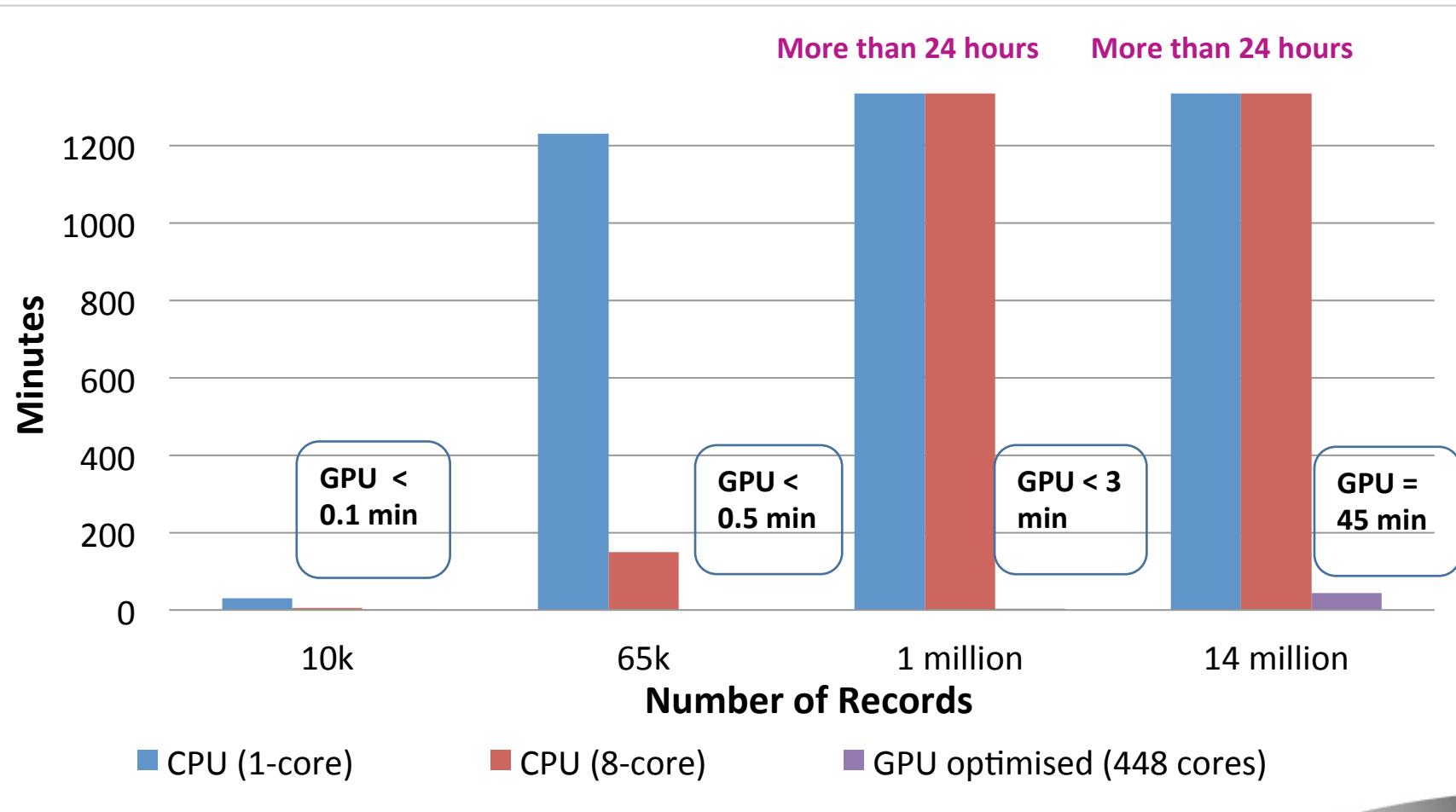
Save

|  | Row ID | Record Status | Merged To                        | NO_KADPENGENALANBAR | IDPESAKIT | KODHOSPITAL | NO_LAINPENGENALAN | NAMA           |
|--|--------|---------------|----------------------------------|---------------------|-----------|-------------|-------------------|----------------|
|  | 43273  |               | <input type="button" value="▼"/> | 460721025197        | 3479      | 11-10060020 |                   | OTHMAN MD AMIN |
|  | 40035  |               | <input type="button" value="▼"/> | 460731025197        |           |             |                   | N B MD AMIN    |

Using Edit Distance Algorithm

2

## Performance Comparison Using Edit Distance Algorithm





**AccLib**

## Fast Name Search - Growing List

3

Compares the name from the blacklisted names against all daily transactions, and MiAccLib will detect and alert the users.

The screenshot shows a demonstration interface for Tess GPU. On the left, under 'Scenario 2', there is a search input field containing 'ETTIKAN KANDASAMY' with a red dashed circle around it, and a 'Search' button below it. A callout bubble points from this input field to a text box containing the text: 'Discover specific account record based on name keyword search'. On the right, a window titled 'GPU' displays a 'Match Result'. The result shows a found record for 'ETTIKAN KANDASAMY A/L KARUPPIAH' with details: NAME : ETTIKAN KANDASAMY A/L KARUPPIAH, SEX: LEIAKI, Mobile: 017-8321231, ADDRESS: 25, JALAN, 41000, SELANGOR, LRF DATE: 25/08/2007. A blue arrow points from the word 'FOUND!' in the result to the same text in the callout bubble. Below the result, there is a 'Summary' section with statistics: Total Records: 1 Million, Keyword: ETTIKAN KANDASAMY, length is 17, Kernel execution time: 208.31 milliseconds. The bottom of the window has a 'Summary END' message.

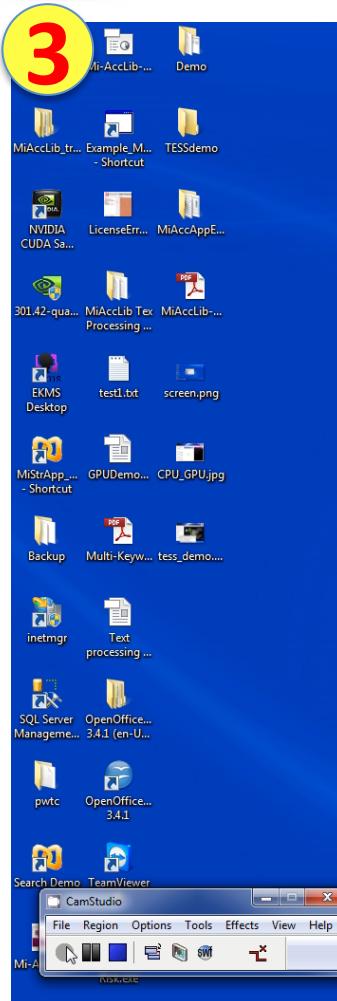


innovation for life™



TM  
**AccLib**

# Example of Text/String Analytics

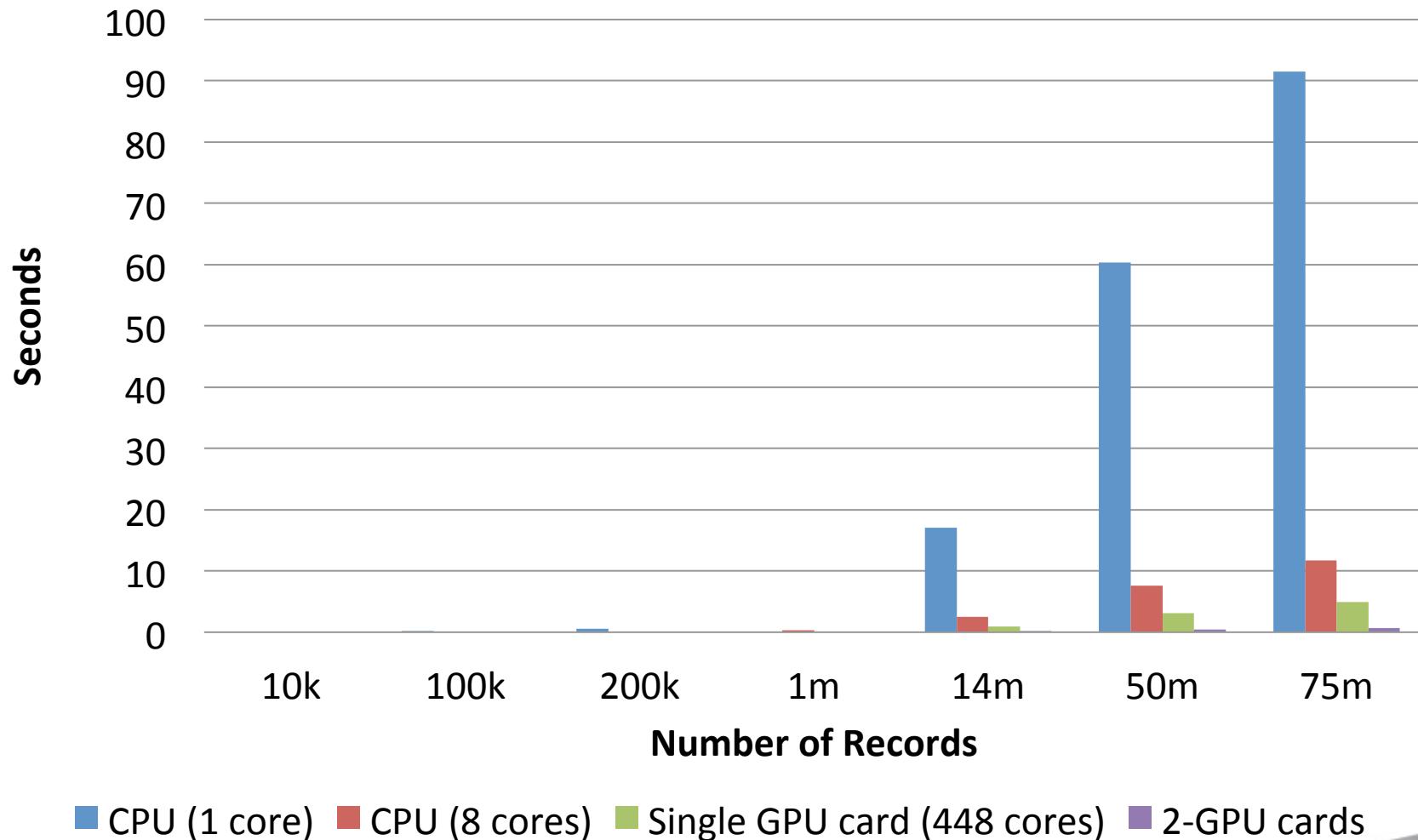


3:39 PM  
9/24/2013



3

### Performance Evaluation On CPU & GPU





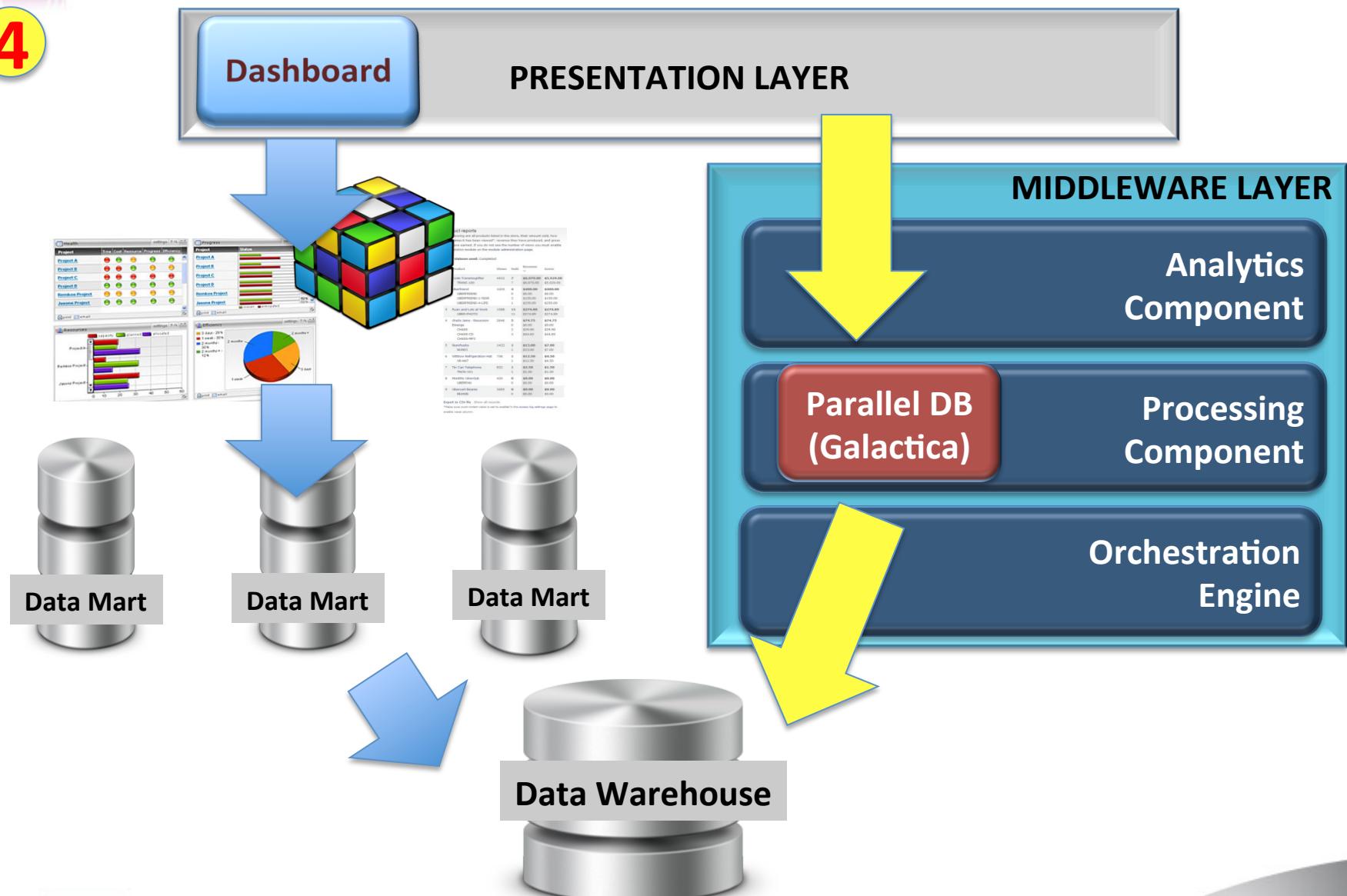
AccLib

# BI Use Case



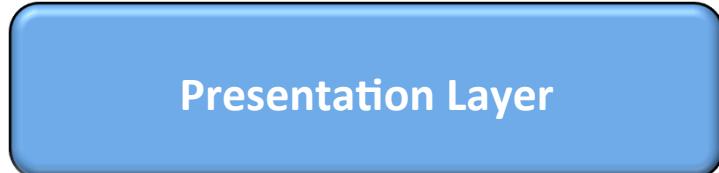
bis

4



4

- Orchestration of Heterogeneous Hardware Components
  - CPU with GPU
- Massively data parallel processing
  - Analytical algorithms
- Easy to access parallel engine
  - SQL style accessing

Presentation LayerData WarehouseBusiness Intelligence ToolGalactica EngineNVIDIA Tesla GPU Technology



4

# Galactica - Accelerated Queries Processing

Malaysian Institute of Microelectronics System (MIMOS Berhad), Malaysia.



## Motivation

Traditional databases **aren't equipped** to efficiently compute massive volume of data, and there are related costs for **storing, moving, computing** and **developing** a fast database operation system. These areas observe quick growth of large data which needs either timely analytics or batched processing. Thus, the challenge is to analyze and mine these **big data** in order to effectively exploit the information to improve efficiency and quality of service for consumers and producers alike. With size, it comes **performance issues**.

Galactica is an emerging GPU database engine that accelerating analytical computation with parallelizing queries processing and exploiting NVIDIA high performance Tesla GPUs.

## Evaluation 1: Vs PostgreSQL

### Test Data

- Using a standard and popular TPC-H benchmark
- Performing 3 different sets of query in 1GB, 10GB and 50 GB sizes.
- Comparing Galactica against one of the standard and powerful open source object-relational database system (PostgreSQL 9.3)

### Environment

- Dual Intel(R) Xeon(R) CPU X5680 @ 3.33GHz with 6 cores processors
- 22 GB RAM, WD HDD 1TB
- NVIDIA Tesla K20c and K40c
- Microsoft Windows 7 (64 Bits)
- CUDA 5.5 and 6.0

## Evaluation 2: Vs Hadoop

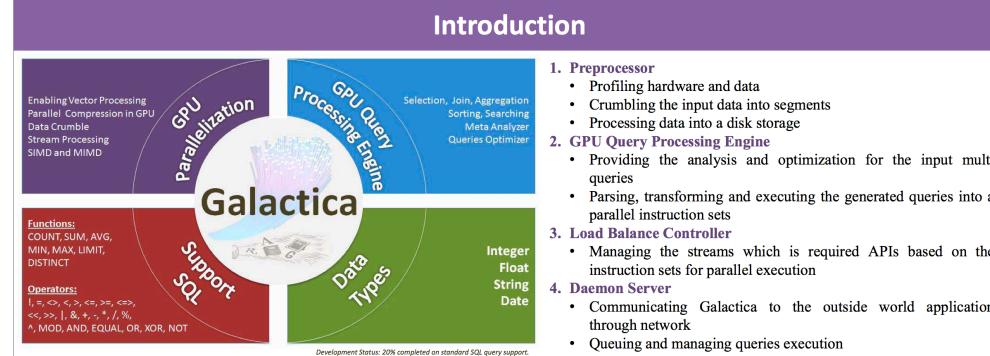
### Test Data

- Using Health Care Database with 32GB data size
- Performing 7 different sets of query
- Comparing Galactica against PostgreSQL 9.3, Hadoop Hive and Impala Hive

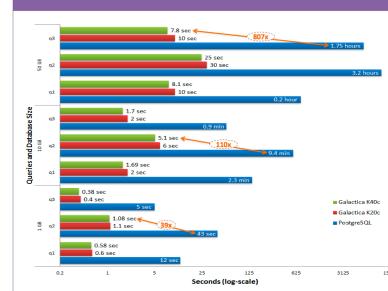
### Environment

**Hadoop:** HP DL380p G8 Server with 48 cores and 96GB RAM, 7 VM (12 cores for master node and 6 cores each for worker nodes)

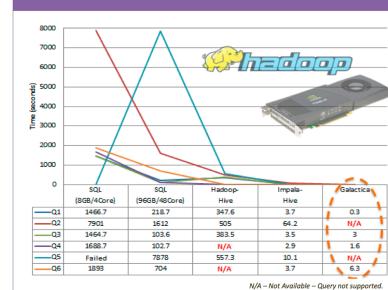
**Galactica:** Intel® Xeon® E5630 @ 2.53GHz with Quad Core Processor , NVIDIA Tesla K20c, 12 GB RAM, WD HDD 1 TB, Windows Server 2008 R2 Enterprise 64-bit



## RESULT 1



## RESULT 2



## Introduction

- Preprocessor
  - Profiling hardware and data
  - Crumbling the input data into segments
  - Processing data into a disk storage
- GPU Query Processing Engine
  - Providing the analysis and optimization for the input multi queries
  - Parsing, transforming and executing the generated queries into a parallel instruction sets
- Load Balance Controller
  - Managing the streams which is required APIs based on the instruction sets for parallel execution
- Daemon Server
  - Communicating Galactica to the outside world application through network
  - Queuing and managing queries execution

## LESSONS LEARNED

- Galactica shows the speedup of over two orders of magnitude over the same operation that had done in PostgreSQL on a multicore machine
- Galactica gained better speedup by having larger data for parallel processing
- Galactica performs on commodity data operation, also, it is an effective co-processor for performing database and query operations.
- Low cost GPU workstation has a competitive result against high end server with a distributed Hadoop system
- Parallel processing massive volume of string objects are given challenges

### Future Work

- Advancing the parallel compression engine by optimizing data transfer time
- Supporting more standard SQL queries
- Exploring distributed queries execution across GPU cluster

## ACKNOWLEDGEMENT

This research was done under Joint Lab of "NVIDIA - HP - MIMOS GPU R&D and Solution Center". This is the first GPU solution center in South East Asia established in October 2012. Funding for the work came from MOSTI, Malaysia. The authors would like to thank Prof. Simon See and Pradeep Gupta from NVIDIA for the supports.

## CONTACT INFORMATION

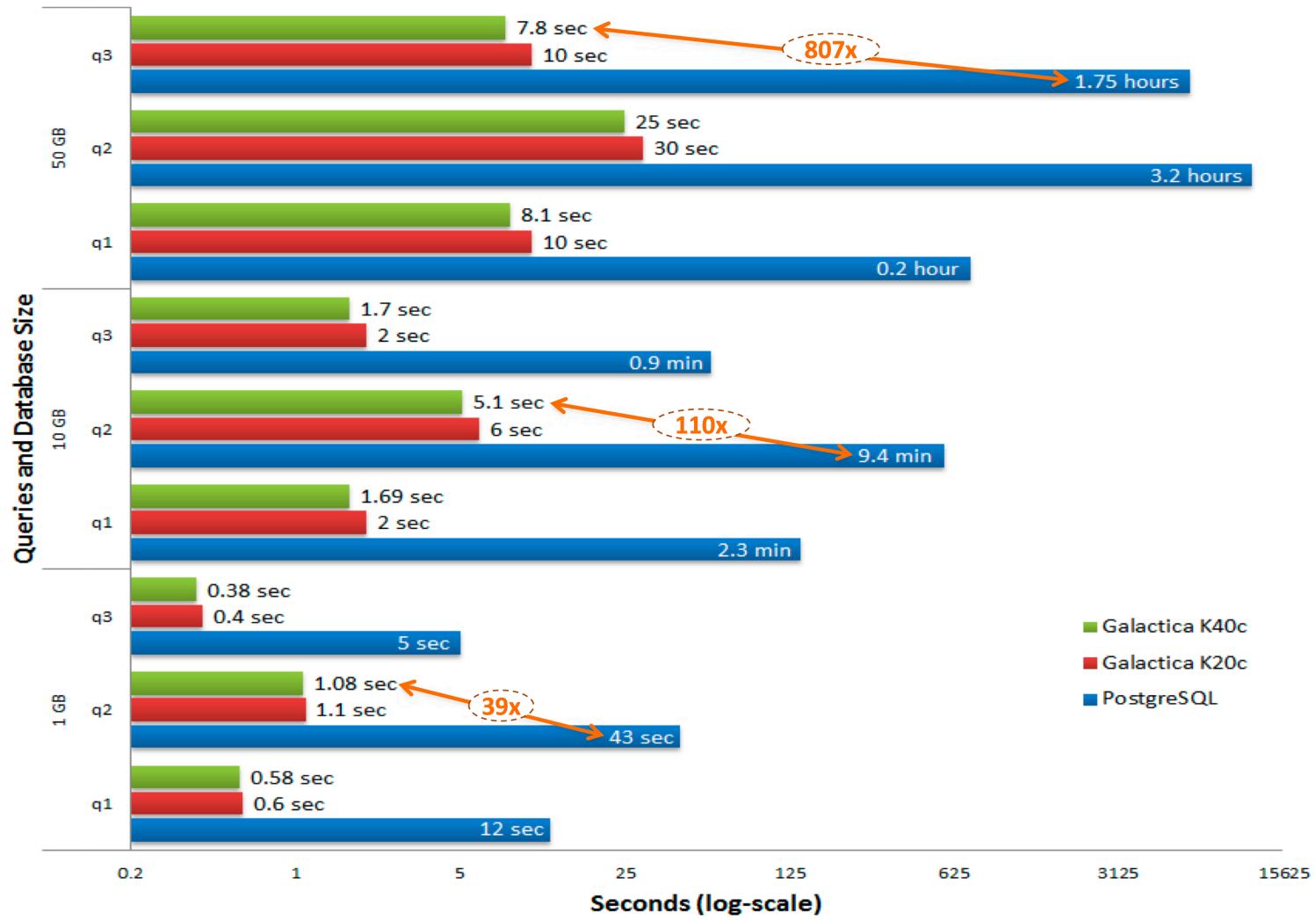
- Author :** Yong Keh Kok  
**Email :** kk.yong@mimos.my  
**Website :** <http://gpu.mimos.my>
- Company :** MIMOS Berhad (Malaysia)  
**Accelerative Technology Lab - ATL**



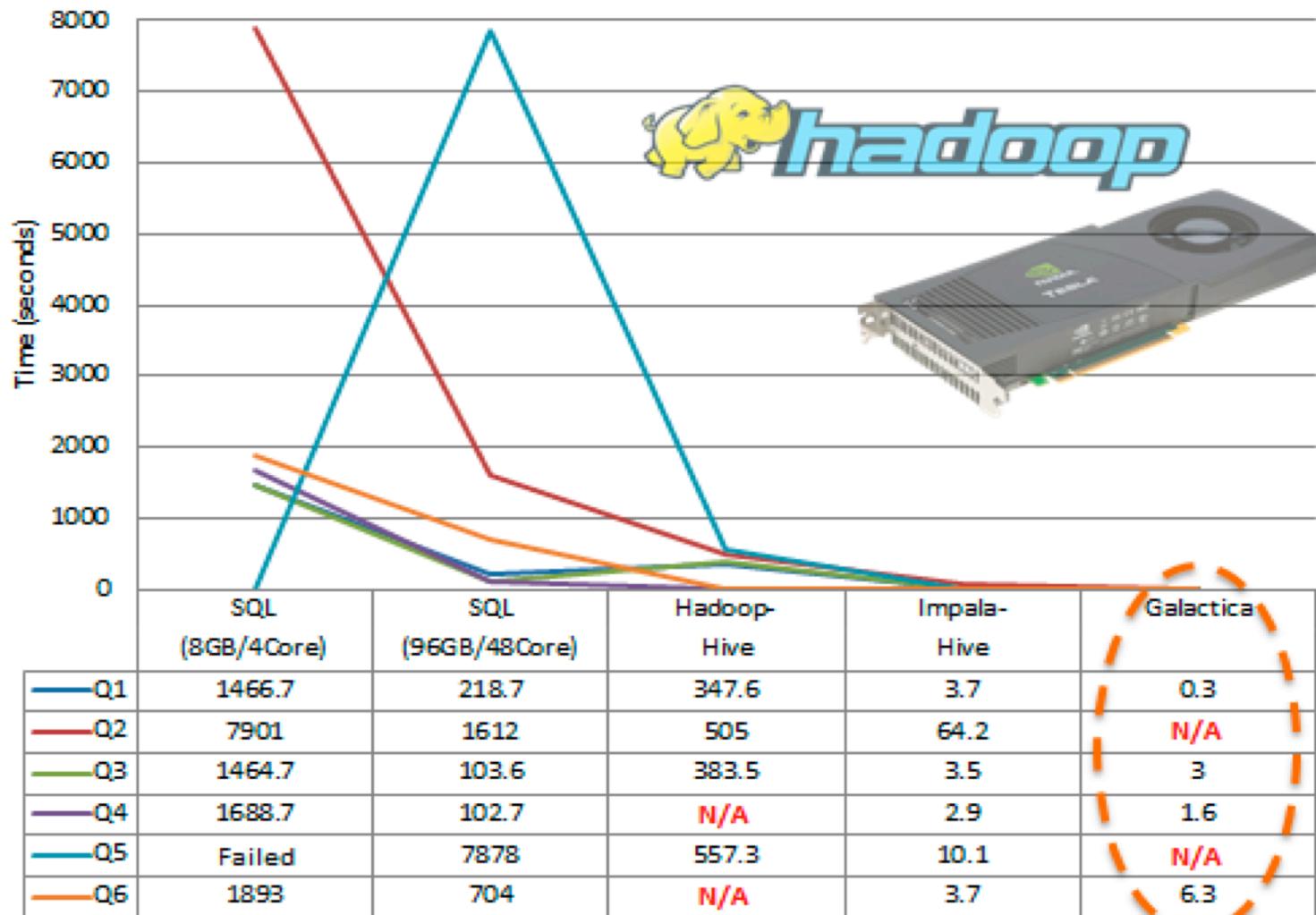


4

# RESULT 1



# RESULT 2



N/A – Not Available – Query not supported.



AccLib

# Data Visualization



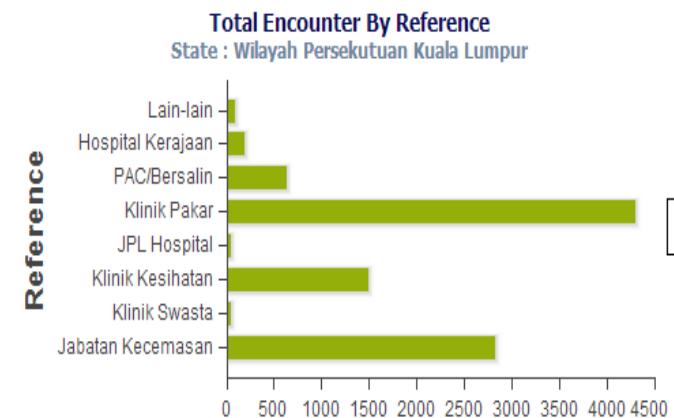
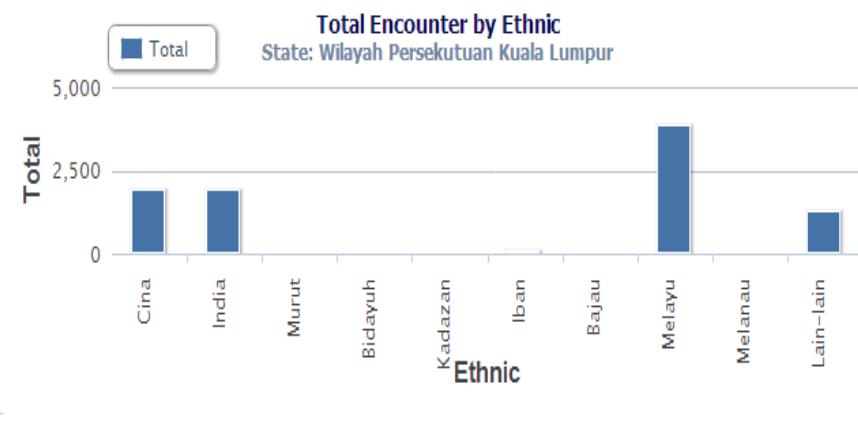
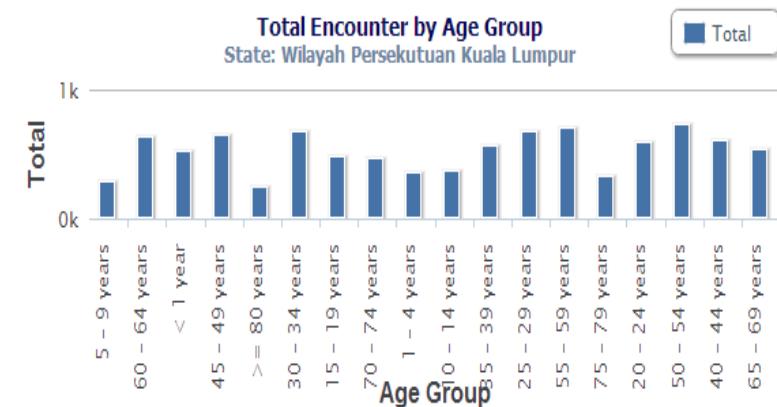
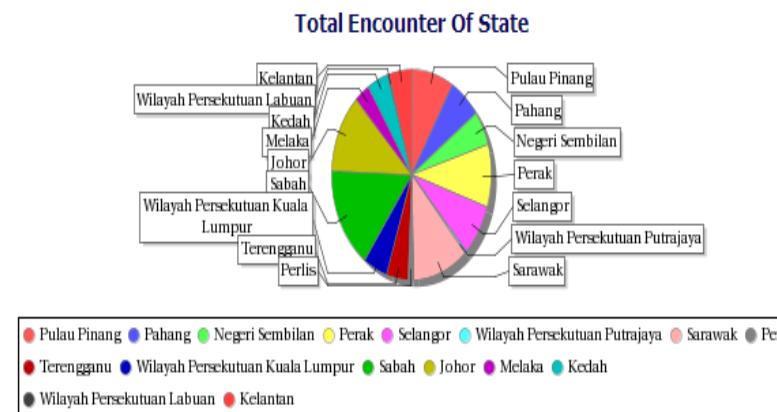
bis

4  
bis

User

Document browser DOC\_COMP\_HDW\_SMALL

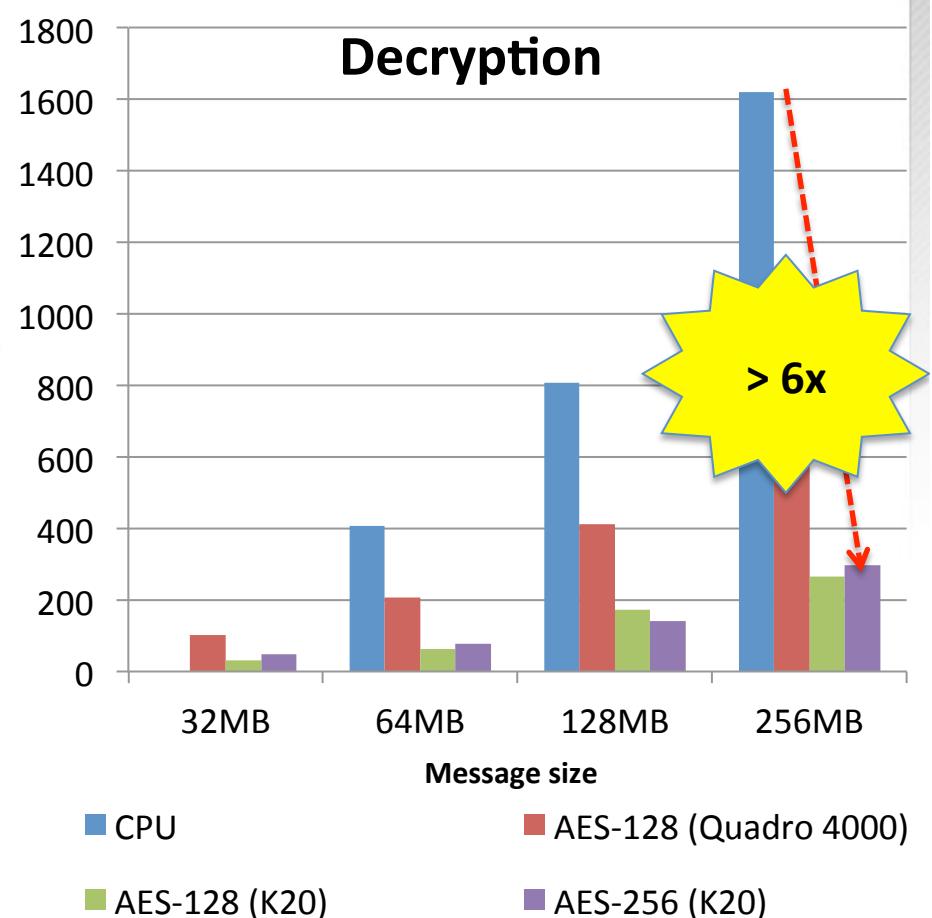
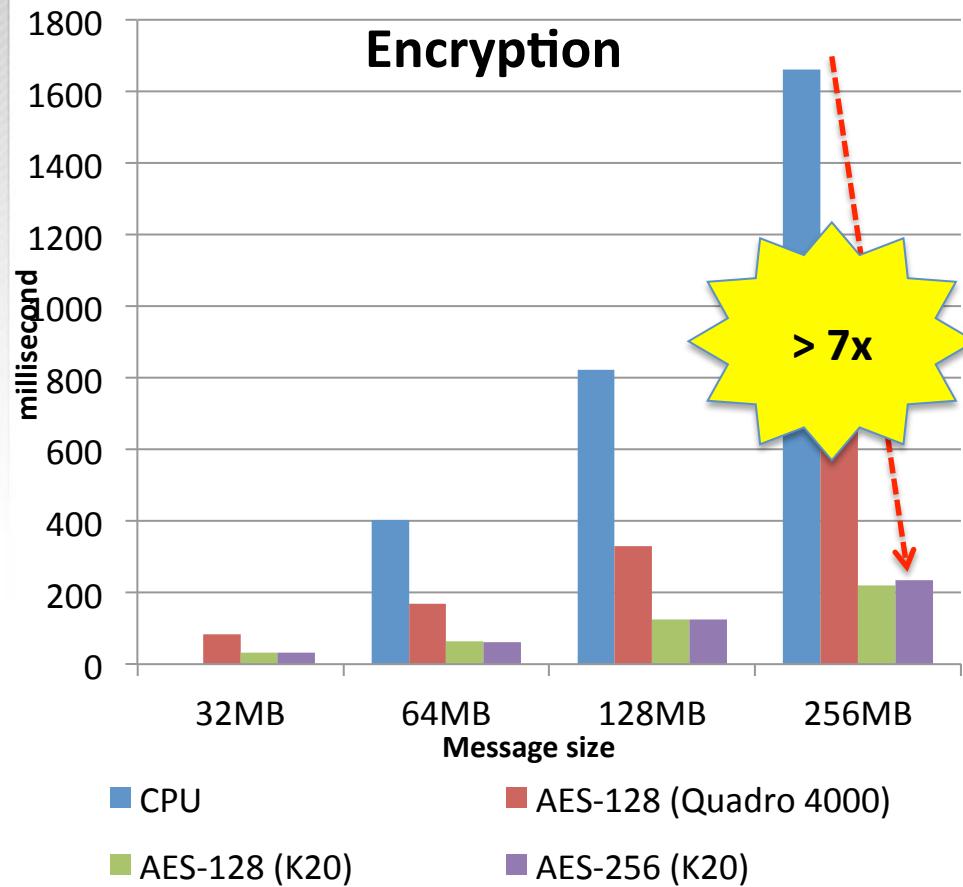
File Info Shortcuts





5

Advanced Encryption Standard(AES) 128-Bit and 256-Bit Performance Evaluation on K20 GPU card



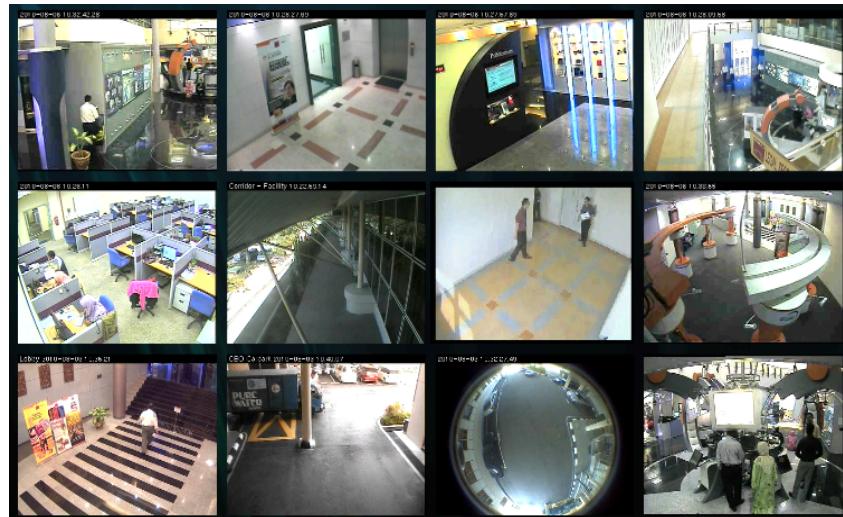
\* ECB = electronic code book;



# Video Analytics Implementation in GPU

7

## Intelligent Surveillance Platform



### Video Analytics

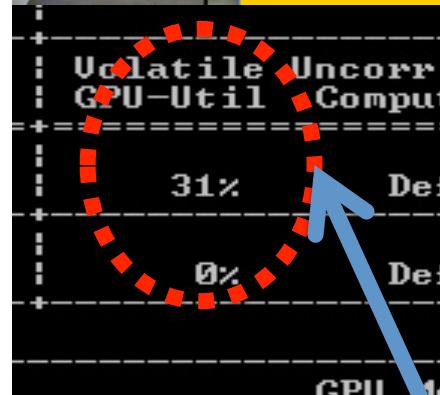
- Intrusion detection
- Loitering Detection
- Slip and Fall Detection
- Unattended Object Detection
- Object Removal Detection



# Video Analytics Implementation in GPU

7

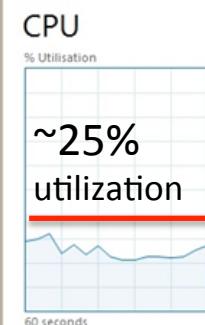
## 35 cameras implementation



```
Administrator: Command Prompt
c:\Program Files\NVIDIA Corporation\NUSMI>nvidia-smi.exe
Fri Sep 06 17:26:57 2013
NVIDIA-SMI 5.320.49 Driver Version: 320.49
GPU Name TCC/WDDM Bus-Id Disp.A Volatile Uncorr. ECC
Fan Temp Perf Pwr/Usage/Cap Memory-Usage GPU Util Compute M.
0 Tesla K20c TCC 0000:02:00.0 Off 354MB / 4799MB 31% Default
30% 34C P0 61W / 225W
1 Tesla K20c TCC 0000:03:00.0 Off 13MB / 4799MB 0% Default
30% 34C P8 16W / 225W

Compute processes:
GPU PID Process name
0 5932 ...U_Test\iSpyApplication\bin\x86\Release\iSpy.exe 338MB

c:\Program Files\NVIDIA Corporation\NUSMI>
```



Intel(R) Xeon(R) CPU E5-2680 0 @ 2.70GHz

Region of Interest during intrusion





7

# Resource Utilization for MiAccVaLib (Single & Multiple Camera)

| Process Frame Size | CPU Utilization | Processing VA Time per frame in GPU | GPU Utilization* | GPU Memory Utilization | No. of Cameras |
|--------------------|-----------------|-------------------------------------|------------------|------------------------|----------------|
| 512                | 1.6 - 1.8%      | ~4.7ms                              | 6 - 7%           | 113MB                  | 1 camera       |

| System              | CPU Utilization | Processing VA Time per frame | GPU Utilization | GPU Memory Utilization | Total time processing time per frame | No. of Cameras |
|---------------------|-----------------|------------------------------|-----------------|------------------------|--------------------------------------|----------------|
| CPU + GPU/ per card | ~35%            | 3.1ms                        | 40%             | 7.3%                   | 12ms                                 | ~35 camera     |

Transfer Rate **CPU to GPU =**  
**5.53GB/s**

(for 256KB it takes about 45.5ms)

Transfer Rate **GPU to CPU =**  
**5.01GB/s**

(for 64KB it takes about 13ms)

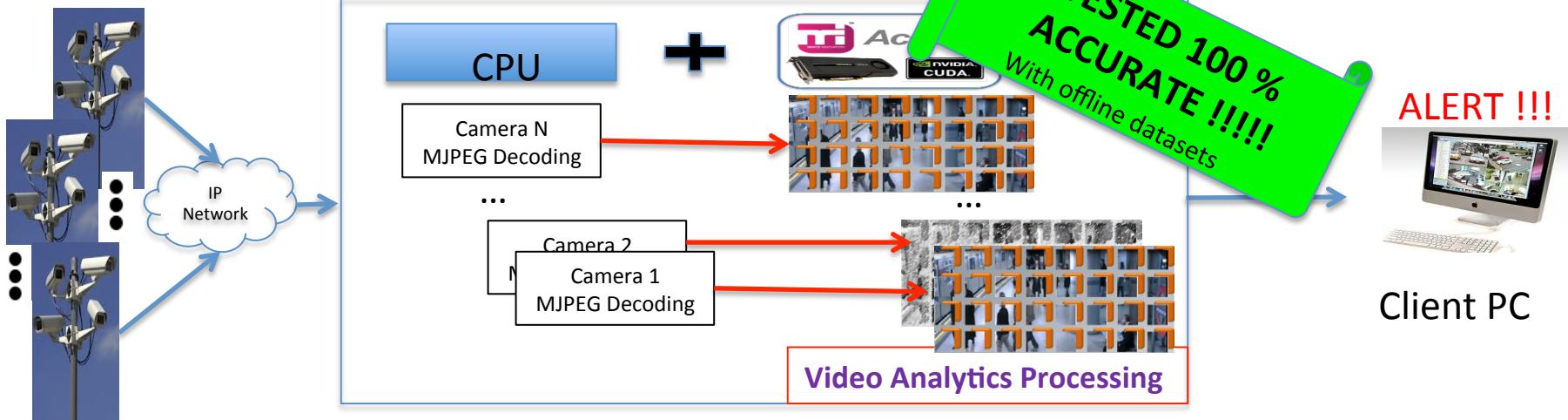
Transfer throughput is similar when using frame size 512x512

\*GPU Utilization is dependent on the image scene.



# GPU VA Library

## Surveillance Server



Video  
Analytics  
Processing

CPU



R

Parallelization of  
the VA algorithms

- Previous data dependency
- Efficient memory management.
- Algorithm Decomposition

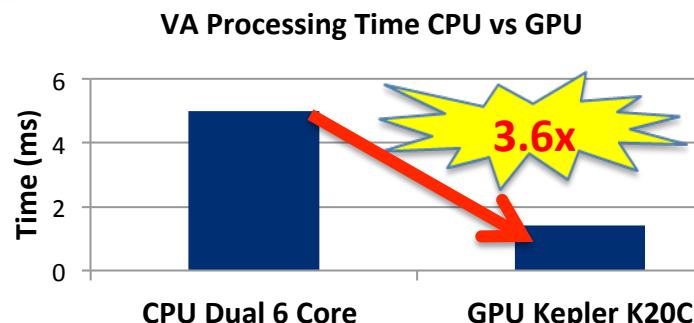
CPU + GPU

D

|                        |   |
|------------------------|---|
| Background Subtraction | AccBackgroundSubtractionFrameDiff, AccCompMotion, AccUpdateBackground, AccCompShadow, AccRGB2HSV  |
| Morphing Process       | AccMorphFilterVariable  |
| CCL                    | AccConnectComponentLabel  |
| Region Analyzer        | AccExtractPropertiesCentroid, AccExtractPropertiesSize, AccExtractPropertiesBB, AccExtractPropertiesHWRatio, AccExtractPropertiesOrientation, AccExtractPropertiesHProject, AccExtractPropertiesSkew, AccRegionLabelUpdate, AccCompOverlap, AccPropUpdate, AccCombineBlob |
| Filters                | AccFlickerFilter, AccRegionFilter   |
| Detection              | AccVAParallelIntrusionDetection   |



# GPU VA System Results

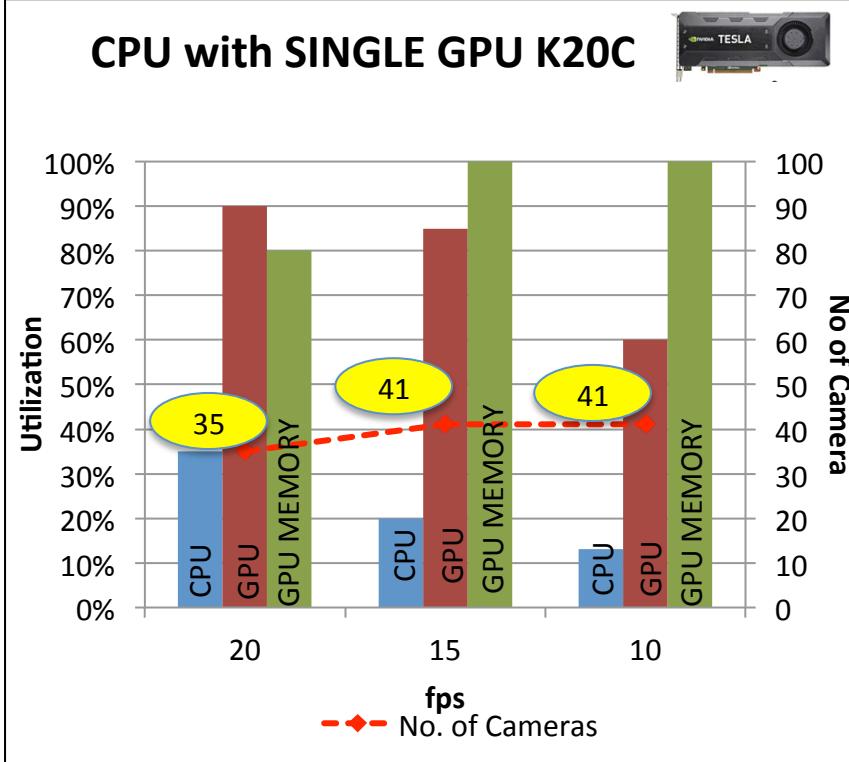


## MJPEG & MPEG Supported

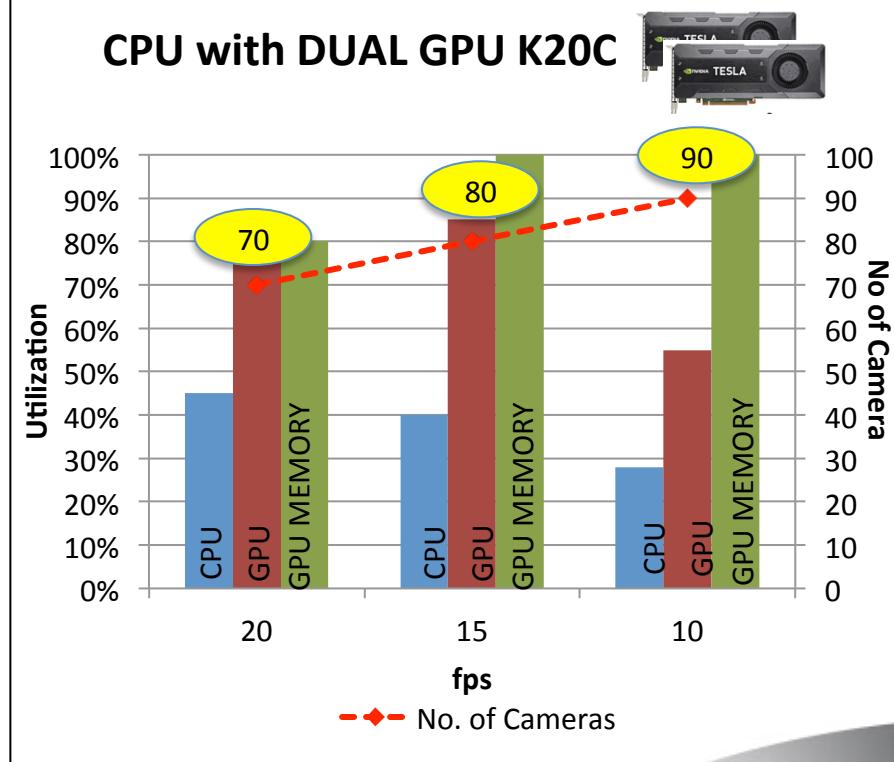
| Tasks                   | CPU + GPU  | * CPU Utilization |
|-------------------------|------------|-------------------|
| Network Stream In       | CPU        | 10%               |
| Decompression           | CPU        | 5%                |
| <b>Video Analytics</b>  | <b>GPU</b> | <b>35%</b>        |
| Streaming Out & Display | CPU        | 50%               |

\* Reference to 10fps

CPU with SINGLE GPU K20C



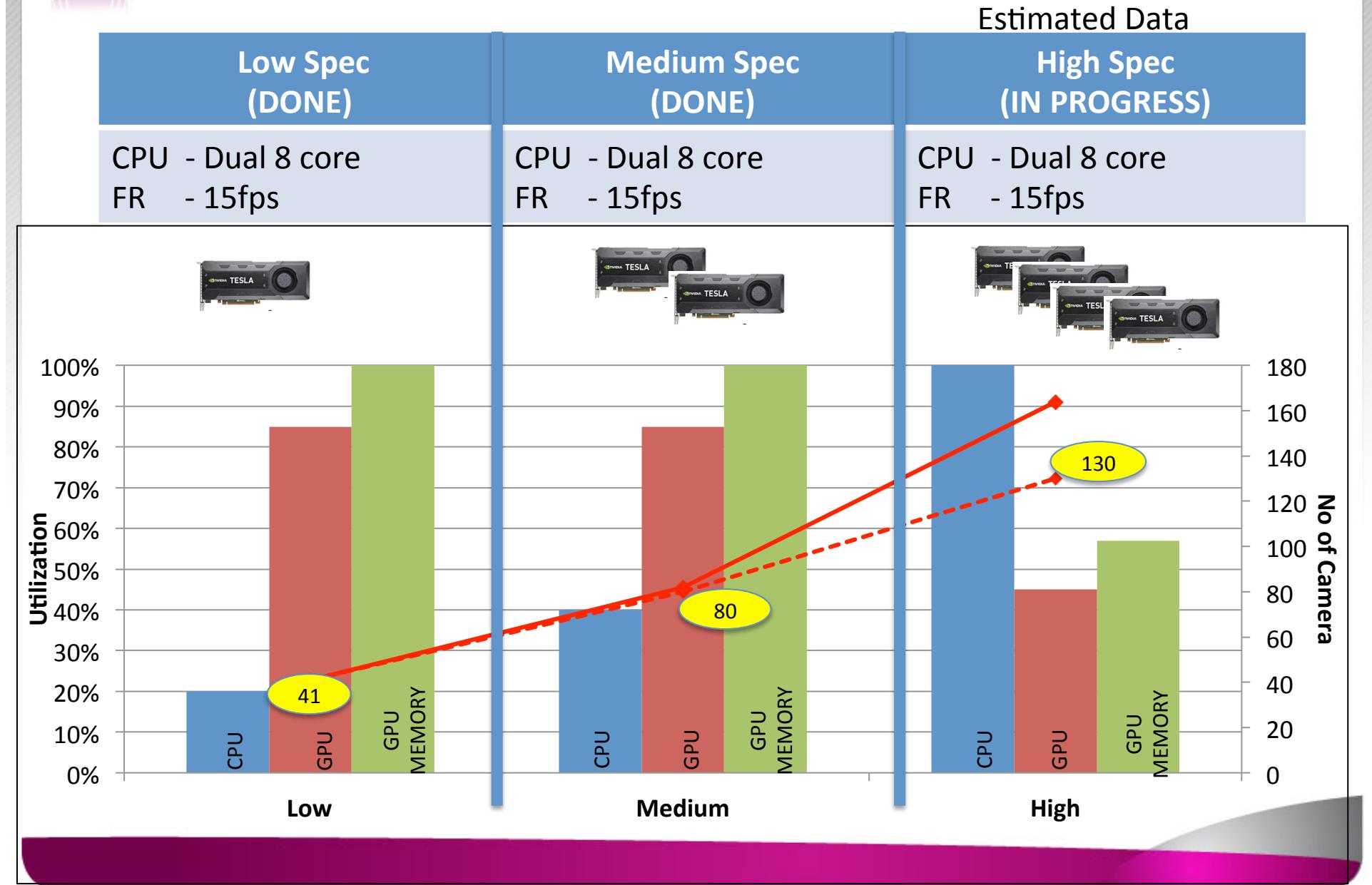
CPU with DUAL GPU K20C



\* Data taken on system server CPU - Dual 8 cores



# Proposed System Configuration





# System Savings & Roadmap

| No. | Items             | Setup Cost<br>(RM '000) |                             | Annual<br>Maintenance<br>(RM '000) |                             |
|-----|-------------------|-------------------------|-----------------------------|------------------------------------|-----------------------------|
|     |                   | CPU<br>50 nodes         | CPU<br>+<br>GPU<br>10 nodes | CPU<br>50 nodes                    | CPU<br>+<br>GPU<br>10 nodes |
| 1   | Space Rental      | 0                       | 0                           | 136.5                              | 52.92                       |
| 2   | Infrastructure    | 250.5                   | 190                         | 15                                 | 13                          |
| 3   | Utilities         | 0                       | 0                           | 469.2                              | 192                         |
| 4   | IT Equipment      | 700                     | 780                         |                                    |                             |
|     |                   |                         |                             |                                    |                             |
|     | <b>Total Cost</b> | 950.5                   | 970                         | 620.7                              | 257.92                      |
|     | <b>Savings</b>    |                         |                             | <b>-19.5</b>                       | <b>362.78</b>               |
|     | <b>% Savings</b>  |                         |                             | <b>-2</b>                          | <b>58</b>                   |





**AccLib**

# Mimos Accelerator Libraries

POPULAR GPU-ACCELERATED APPLICATIONS

Accelerated computing has revolutionized the HPC industry. Today there are over two hundred applications across a wide range of industries already optimized for GPUs to help you accelerate your work.

| APPLICATION                                | DESCRIPTION   | LATEST VERSION AND SUPPORTED FEATURES   | MULTI-GPU SUPPORT |
|--|---|---|-------------------|
| Axon Benfield Pathwise™                    | Specialized platform for real-time hedging, valuation, pricing and risk management  | Spreadsheet-like modeling interfaces, Python-based scripting environment and Grid middleware  | Yes               |
| Hanweck Associates                         | Real-time options analytical engine [Volera]  | Real-time options analytics engine  | Yes               |
| Murex MACS Analytics Library               | Analytics library for modeling valuation and risk for derivatives across multiple asset classes.  | Market standard models for all asset classes paired with the most efficient resolution methods (Monte Carlo simulations and Partial Differential Equations)   | Yes               |
| Numerical Algorithms Group (NAG)           | Random number generators, Brownian bridges, and PDE solvers   | Monte Carlo and PDE solvers   | Single only       |
| RMS  | Catastrophic risk modeling for FSI (earthquakes, hurricanes, terrorism, infectious diseases)  | Risk analytics  | Yes               |
| Tanay ZX Lib (Fuzzy Logic)                 | Financial analytics and data mining library   | Monte Carlo simulations, pricing of vanilla and exotic options, fixed income analytics, data mining   | Yes               |
| SciComp, Inc                               | Derivative pricing [SciFinance]   | Monte Carlo and PDE pricing models  | Single only       |
| Xcelerit SDK and Xcelerit Quant            | Software toolkit for implementing high performance Monte-Carlo derivative pricing   | Monte Carlo simulations, linear algebra, n-body simulations, spectral methods   | Yes               |
| Synerscope's Synerscope Data Visualization | Visual big data exploration and insight tools   | Graphical exploration of large network datasets including geo-spatial and temporal components   | Single only       |
| QuantAlea's Alea.cuBase F#                 | F# package enabling a growing set of F# capability to run on a GPU.   | F# for GPU accelerators   | Yes               |
| Altimesh's Hybridizer C#                   | Multi-target C# for hybridizing GPU or CPU code to GPU or Multi-Core  | Xeon  | Yes               |
| MiAccLib Global Risk                       | Regulatory compliance and enterprise wide risk transparency package   | Risk Analytics  | Yes               |
| MiAccLib                                   | High Speed Multi-Algorithm Search Engine library providing high speed text string search with scalability of searching text and/or keywords on hundreds millions of records and/or text data. | Version 2.0, Exact Text match Search, Approximate/Similarity Text Search, Wild Card Text Search, Proximity & Percentage Text Search, MultiKeyword and MultiColumnMultiKeyword Text Search, RadixSort Text | Yes               |

**Release 1.0**  
(new functionalities  
under development & verification for  
MiAccLib2.0)



# Outline



- Challenges of GPU Libraries adaptation in BigData Analytics
- Middleware Framework Approach
- Hiding the Computation and Exposing the Presentation
  - Presentation by GPGPU
  - Computation by Visualizer
- Performance Comparison
- Conclusion
- Future Works



# Conclusion

- GPU Libraries needs to be written with understanding of users' specific needs
- Users prefer to treat GPU as an hardware accelerator, especially in non-scientific community
- Performance gain by using GPU certainly applauded
- Challenge is to write generic libraries, solving many specific problems!



## Future Work

- MiAccLib will be continuously enhanced, supported and released in coming version, ver2.0.



# Back-up