

# Welcome to the second Workshop on Big data Open Source Systems (BOSS)

September 10th, 2016

Co-located with VLDB 2016

Tilmann Rabl & Sebastian Schelter

# Hands on Big Data

- 6 parallel tutorials
- 6 systems
  - Open source
  - Publicly available
- Presenters
  - System experts
- Hands on
  - This is not a demo!
- You can pick two!

# But why?

- Mike Carey
  - Doing It On Big Data: a Tutorial/Workshop
  - Driving force
- Other people involved
  - Volker Markl
  - Kerstin Forster
- Second instance
  - Last time: 8 systems
  - Tell us what you think
  - Email: [rabl@tu-berlin.de](mailto:rabl@tu-berlin.de)



# Public Voting

- 9 Submissions, 6 tutorials selected
  - Google forms vote
  - 236 votes, 137 individuals
  - Max 46, min 11 votes
- 
- **Did you vote?**

# Presented Systems

- Apache Flink



- Apache SystemML



- HopsFS & ePipe



- LinkedIn's Open Source Analytics Platform



- rasdaman

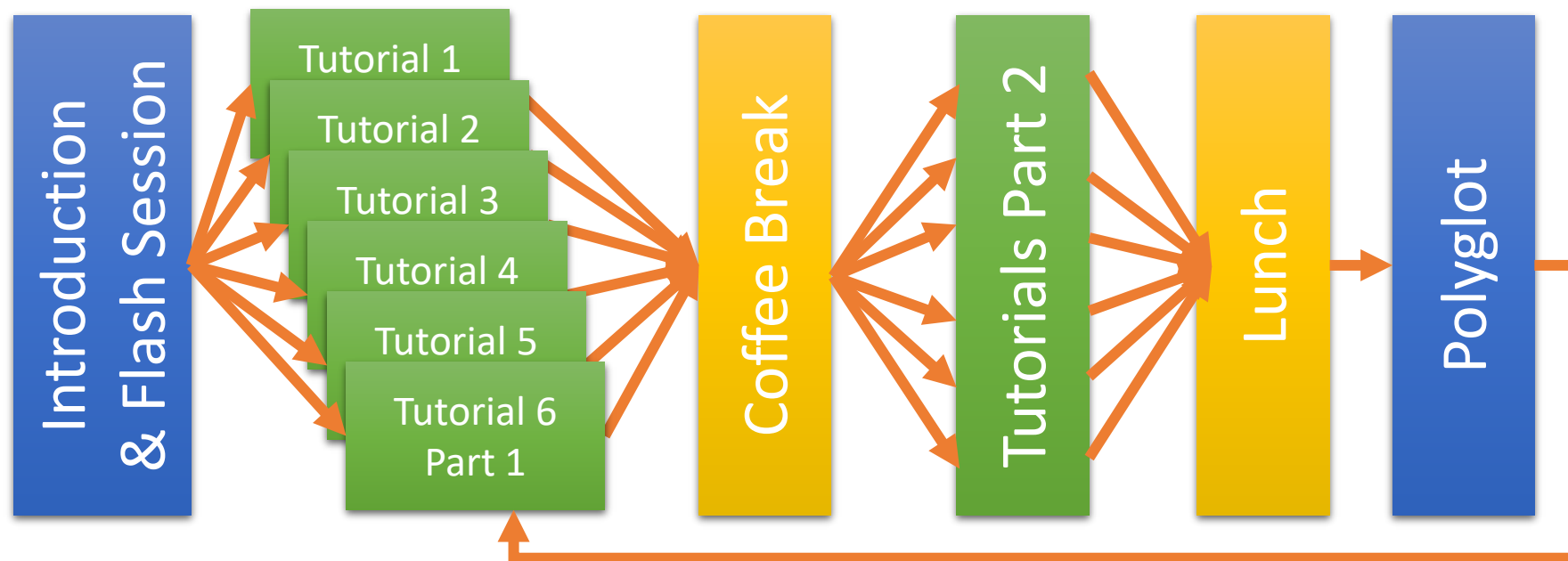


- RHEEM



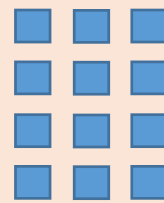
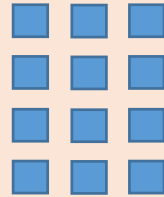
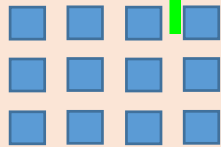
# Massively Parallel Program

- Bulk Synchronous Parallel
- People Flow
- Danger of skew!

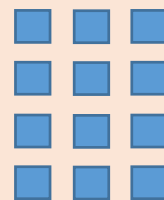
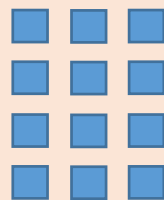
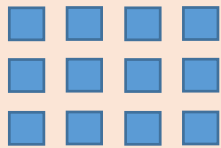


# Heterogeneous Runtime Environment

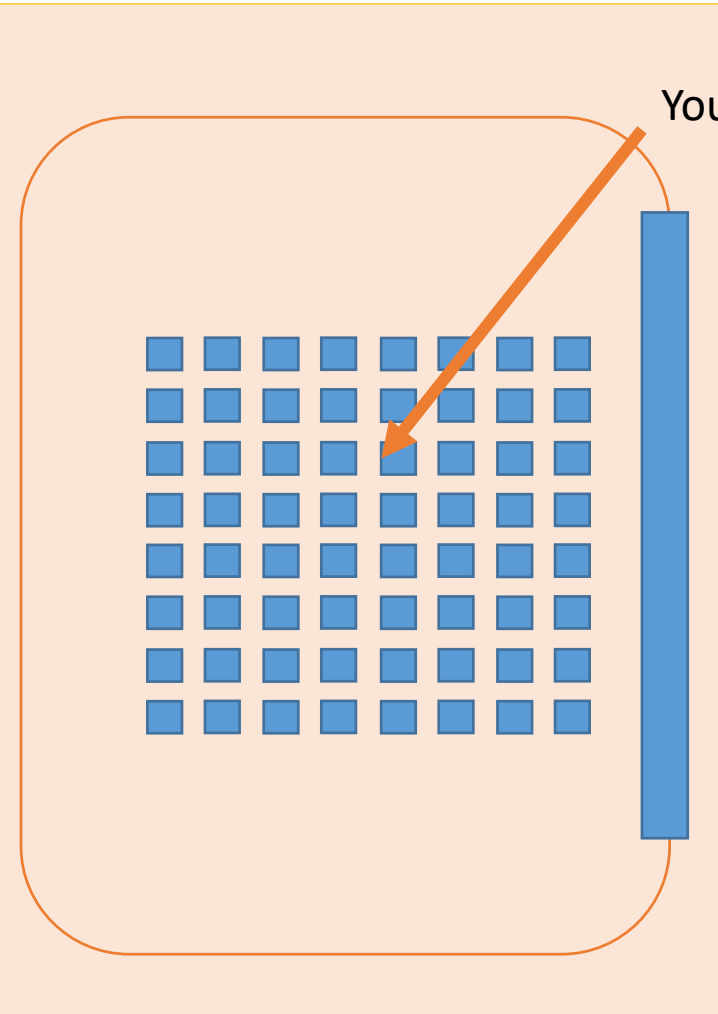
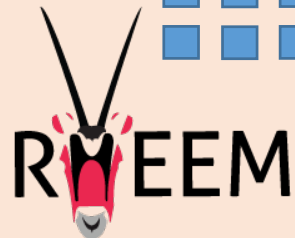
**rasdaman**  
raster data management



Maple



BBLIN



You are here

# Polyglot Session

Big Data processing using Polybase. Karthik Ramachandra (Microsoft Gray Systems Lab)

Multistore Systems: Retrospection on CloudMdsQL. Jose Pereira (Univ. do Minho & INESC)

Exploiting the data center in contemporary commodity boxes: The scaling-in approach. Jignesh Patel (Univ. of Wisconsin-Madison)

LeanBigData: Blending OLTP and OLAP to Deliver Real-Time Analytical Queries. Ricardo Jimenez-Peris (LeanXcale)



Flash Intro

# Apache Flink





# Introduction to Stream Processing with Apache Flink®

Kostas Kloudas

Vasia Kalavri

Jonas Traub

**dataArtisans**

# Overview

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- What is Stream Processing?
- What is Apache Flink?
- Windowed computations over streams
- Handling time
- Handling node failures
- Handling planned downtime
- Handling code upgrades

# A data processing engine

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Apache Flink

Apache Flink is an open source platform for distributed stream and batch processing

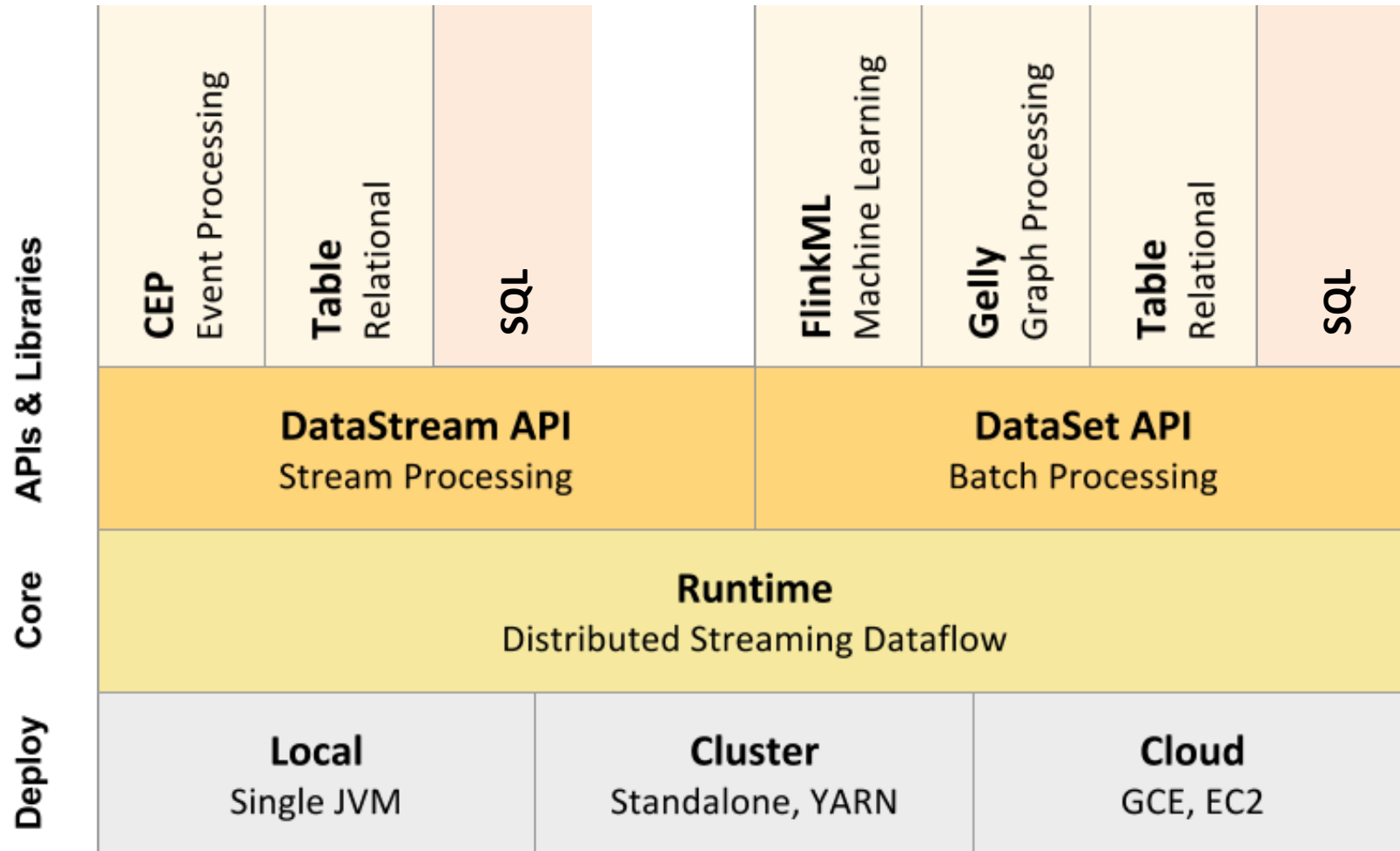
# What does Flink provide?

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- High Throughput and Low Latency
- Event-time (out-of-order) processing
- Exactly-once semantics
- Flexible windowing
- Fault-Tolerance

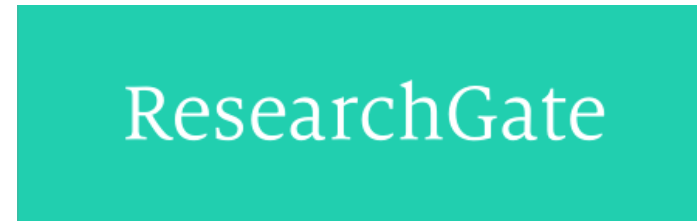
# The Apache Flink Ecosystem



# Its Users



**ERICSSON**



[...https://flink.apache.org/poweredby.html](https://flink.apache.org/poweredby.html)



# Time for demo...

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Robust Stream Processing with Apache Flink®: A Simple Walkthrough  
<http://data-artisans.com/robust-stream-processing-flink-walkthrough/#more-1181>

# Apache SystemML





# Apache SystemML: Declarative Large-Scale Machine Learning

**Matthias Boehm**  
IBM Research – Almaden

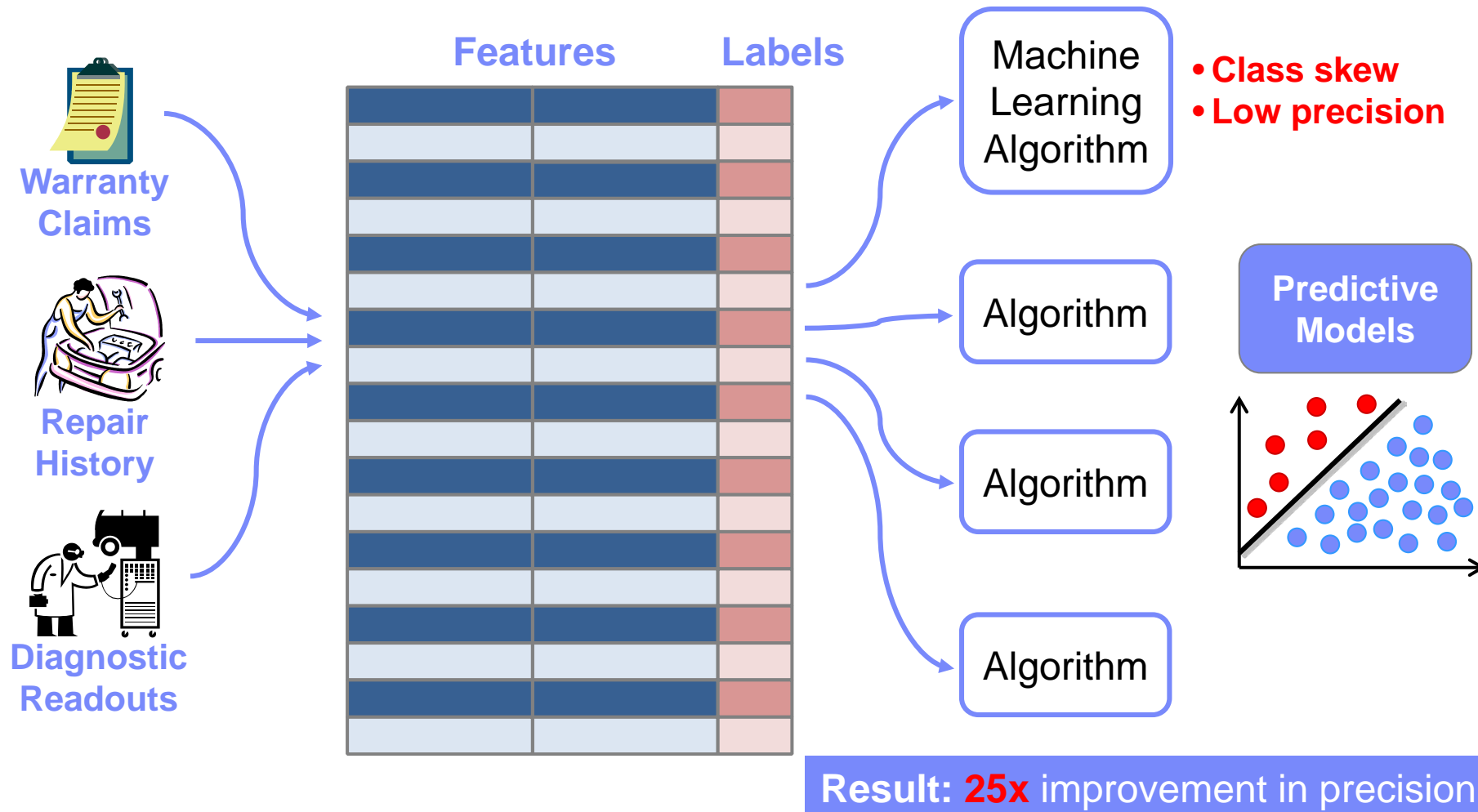
**Acknowledgements:**

A. V. Evfimievski, F. Makari Manshadi, N. Pansare,  
B. Reinwald, F. R. Reiss, P. Sen, S. Tatikonda,

M. W. Dusenberry, D. Eriksson, N. Jindal, C. R. Kadner,  
J. Kim, N. Kokhlikyan, D. Kumar, M. Li, L. Resende,  
A. Singh, A. C. Surve, G. Weidner, and W. P. Yu

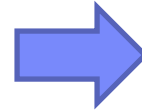
# Case Study: An Automobile Manufacturer

- **Goal:** Design a model to predict car reacquisition



# Common Patterns Across Customers

- **Algorithm customization**
- **Changes in feature set**
- **Changes in data size**
- **Quick iteration**



**Custom Analytics**

**Declarative  
Machine Learning**

# Abstraction: The Good, the Bad and the Ugly

[adapted from Peter Alvaro: "I See What You Mean",  
Strange Loop, 2015]

**Platform Independence**  
**Data Independence**      **Adaptivity**  
**Simple & Analysis-Centric**      **Efficiency & Performance**

$$q = t(X) \%*\% (w * (X \%*\% v))$$



**The Ugly: Expectations ≠ Reality**

**(Missing) Rewrites**

**Operator  
Selection**

**(Missing)**

**Size Information**  
**Data Skew**

**Complex Control Flow**

**(Implicit)  
Copy-on-Write**

**Distributed  
Operations**



**Local / Remote  
Memory Budgets**



**Latency**

**Load  
Imbalance**



**Distributed  
Storage**

➔ **Understanding of optimizer and runtime techniques  
underpinning declarative, large-scale ML**



# Tutorial Outline

- |  |       |
|--|-------|
| ■ <b>Case Study and Motivation (Flash)</b>       | 5min  |
| ■ <b>SystemML Overview, APIs, and Tools</b>      | 30min |
| ■ <b>Common Framework</b>                        | 15min |
| ■ <b>SystemML's Optimizer (w/ Hands-On-Labs)</b> | 45min |

HopsFS & ePipe







# HopsFS & ePipe

Mahmoud Ismail

<maism@kth.se>

Gautier Berthou

<gautier@sics.se>

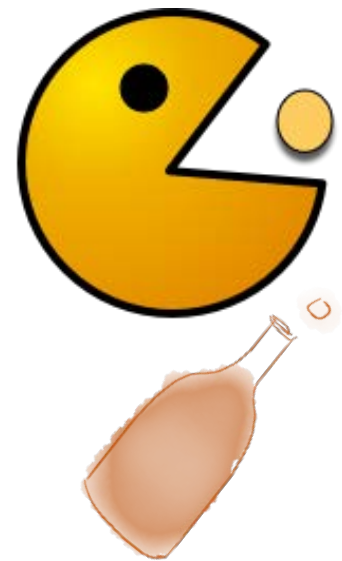
# From HDFS to HopsFS

- Scale to a million operations/sec
- Scale to billions of files/directories
- Search with sub second latency (ePipe)

# Tutorial

- Introducing Github style for Hadoop projects (HopsWorks)
- Installation of Hops on AWS using Karamel
- Managing Datasets
  - create, attach metadata, and search
- Running sample programs on HopsWorks

# Goblin & Pinot





# Open Source Analytics Pipeline at LinkedIn

Issac Buenrostro  
Jean François Im  
BOSS Workshop, 2016

**LinkedIn**®

# Large Scale Analytics

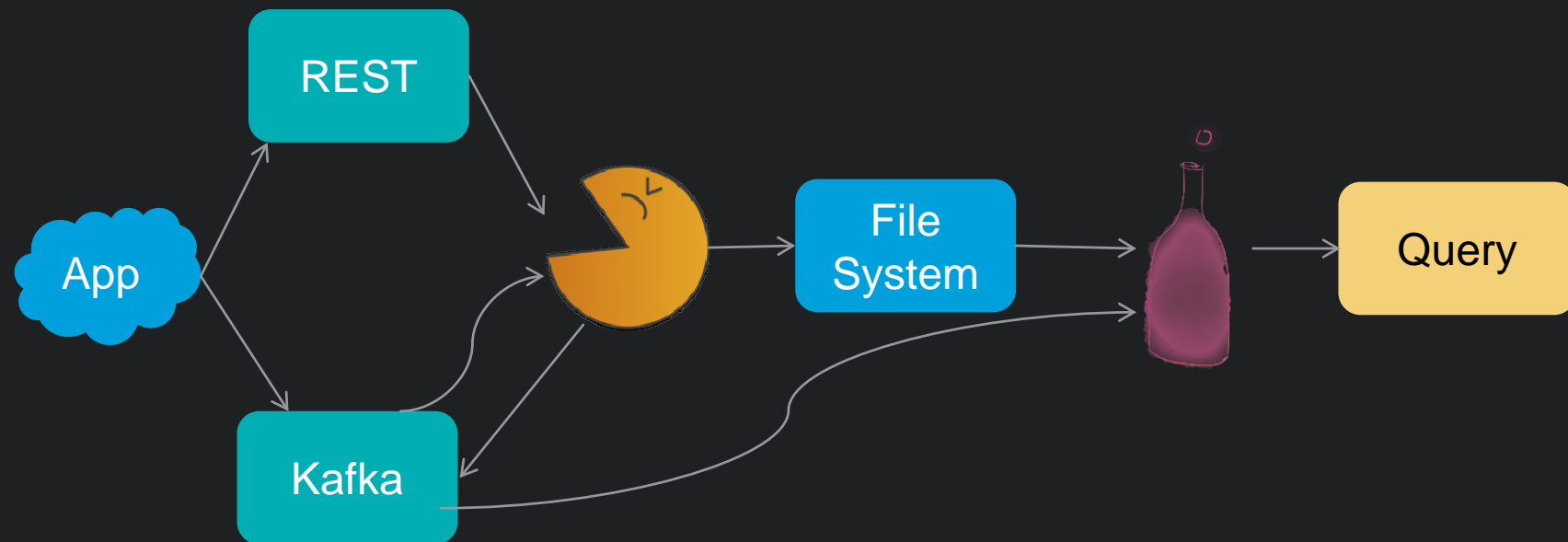
1. Analyze many TB data daily.
2. Multiple, heterogeneous sources, with varying data quality.
3. Fast querying for offline and real-time needs.
4. Integrate with other data processing jobs (MR, Hive, Spark, etc.).
5. Fault tolerance, scalability, manageability, ...

# Solution: Gobblin + Pinot



- Universal data ingestion framework.
- Extract, transform, quality check, and write data from/to a large variety of data storage technologies: HDFS, S3, Kafka, JDBC, Rest, ...
- Distributed near-realtime OLAP data store.
- Index and combine data from offline data sources (e.g. Hadoop) and real time data sources (e.g. Kafka).
- SQL query interface.

# In This Workshop







Find out more:



<https://github.com/linkedin/gobblin>  
<http://gobblin.readthedocs.io/>  
[gobblin-users@googlegroups.com](mailto:gobblin-users@googlegroups.com)

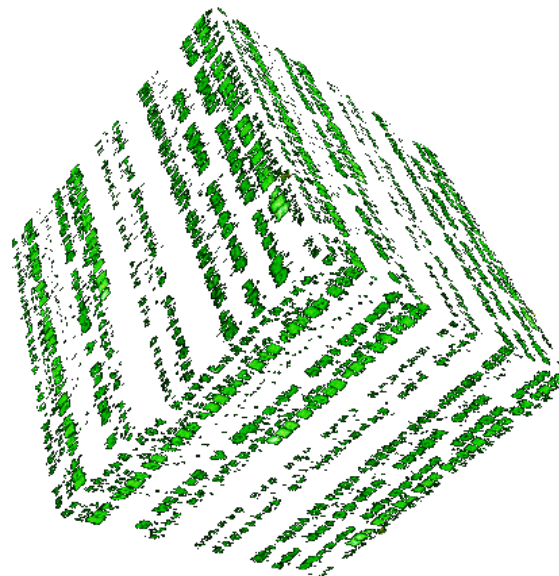


<https://github.com/linkedin/pinot>  
[pinot-users@googlegroups.com](mailto:pinot-users@googlegroups.com)

<https://engineering.linkedin.com/>

rasdaman





# rasdaman @ BOSS'16

New Delhi, India, 09-sep-2016

Dimitar Mišev <misev@rasdaman.com>

Jacobs University | rasdaman GmbH

[gamingfeeds.com]

# Array Analytics Research @ Jacobs U

- Large-Scale Scientific Information Systems research group
  - Flexible, scalable n-D array services
  - [www.jacobs-university.de/lis](http://www.jacobs-university.de/lis)
- Most visible results:
  - Pioneer Array DBMS, rasdaman
  - Standardization: OGC Big Geo Data, ISO SQL



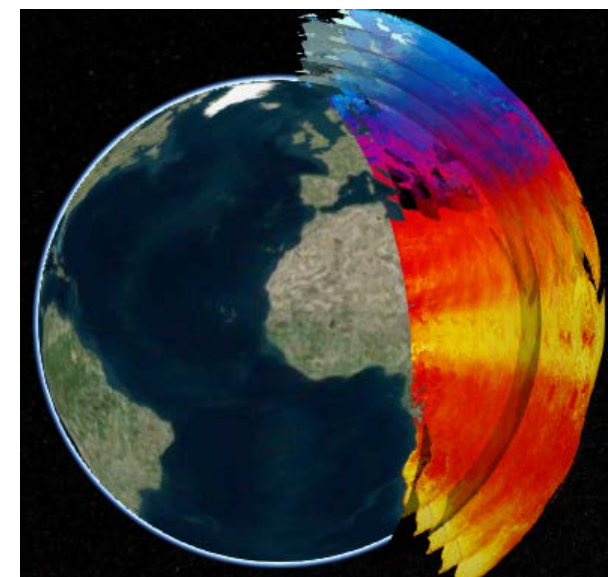
# rasdaman: Agile Array Analytics

- „raster data manager“: **n-D arrays in SQL**
  - [VLDB 1994, VLDB 1997, SIGMOD 1998, VLDB 2003, ...]
- Array Algebra [NGITS 1998]
  - SQL/MDA [SSDBM 2014, DOLAP 2015]
- Scalable, parallel „tile streaming“ architecture
- 130+ TB installations in operational use



# Tutorial outline

- Installation & deployment
  - RPM/DEB, VM download, build from source
- Data modelling and concepts
  - What kind of data is supported?
- Query language
  - Typical array analytics queries, hands on
- Storage management
  - Single array datacubes can reach hundreds of TB
  - Learn how rasdaman scales to such volumes
- Domain application: Geo services



RHEEM





Zoi Kaoudi  
Sebastian Kruse  
Jorge Quiané

*Turning a Zoo into a Circus*

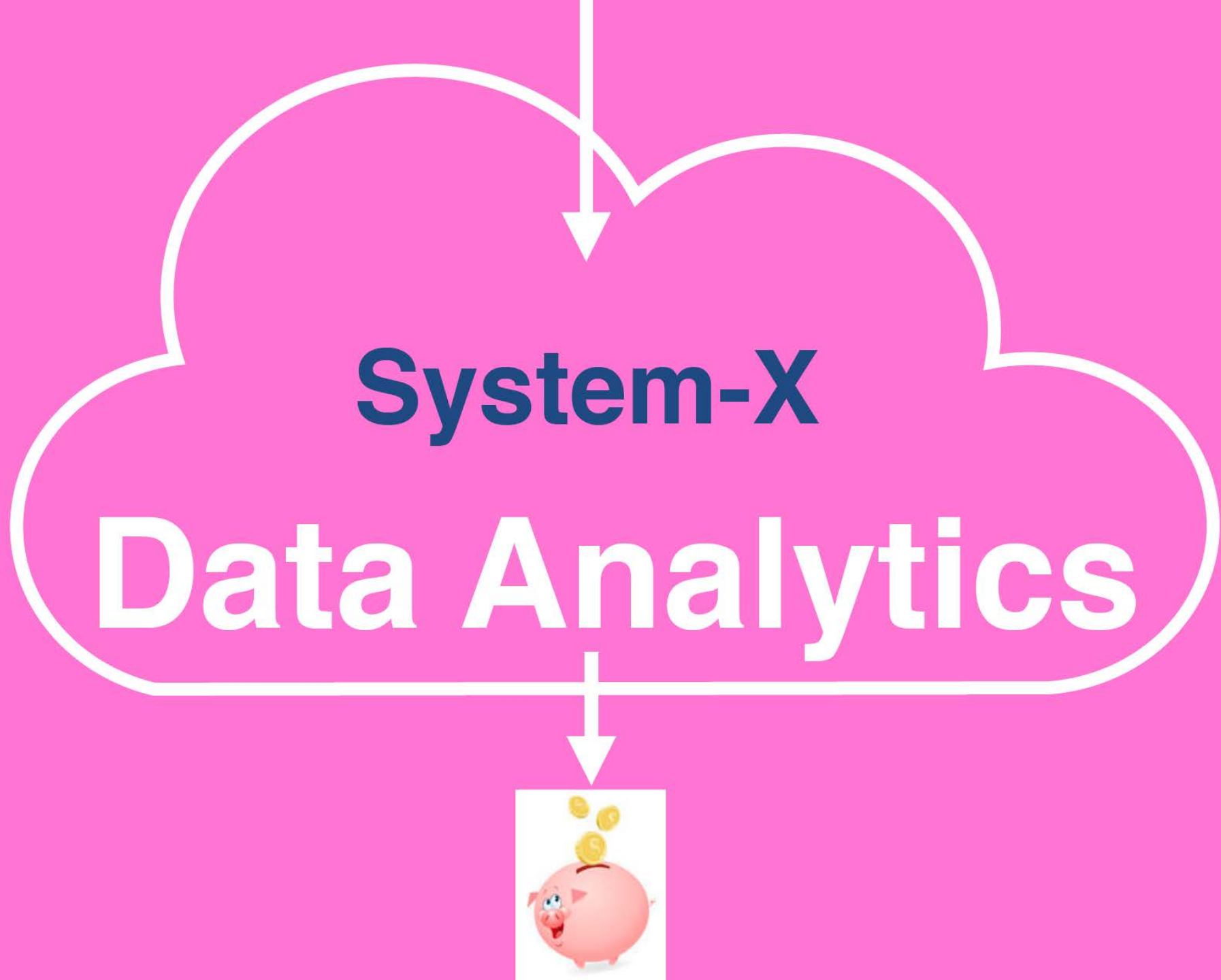


REEEM





**Data Analytics**





Data  
Scientist  
- sexy job -



# Big Data Landscape 2016

## Infrastructure



## Analytics



## Applications



## Cross-Infrastructure/Analytics



## Open Source

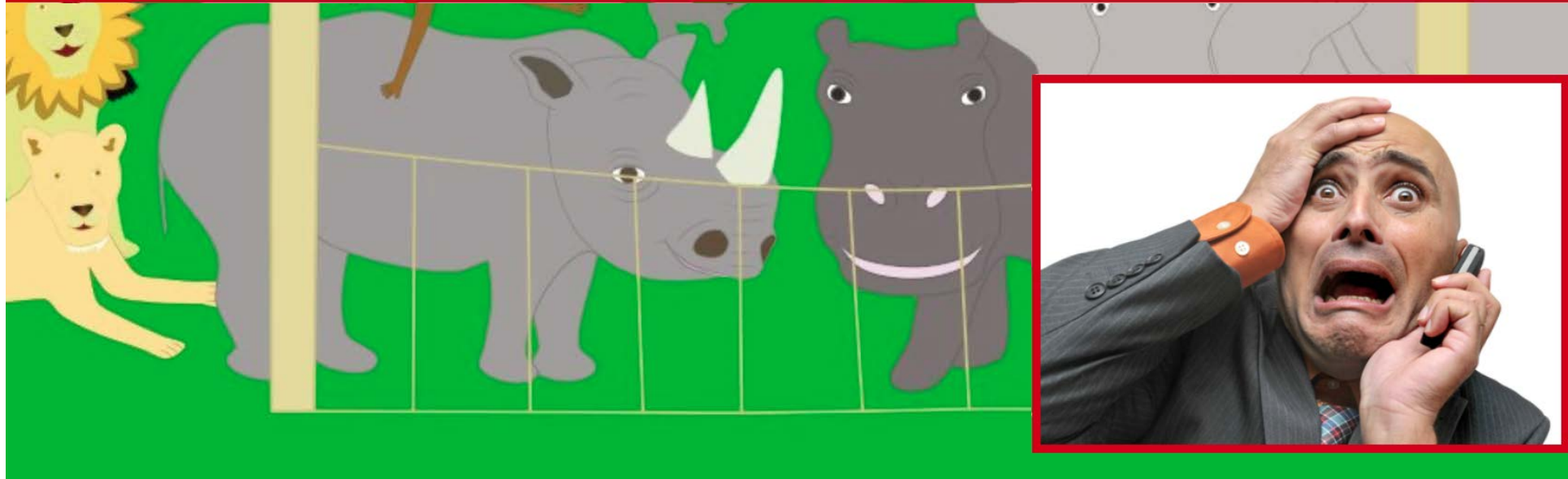


## Data Sources & APIs





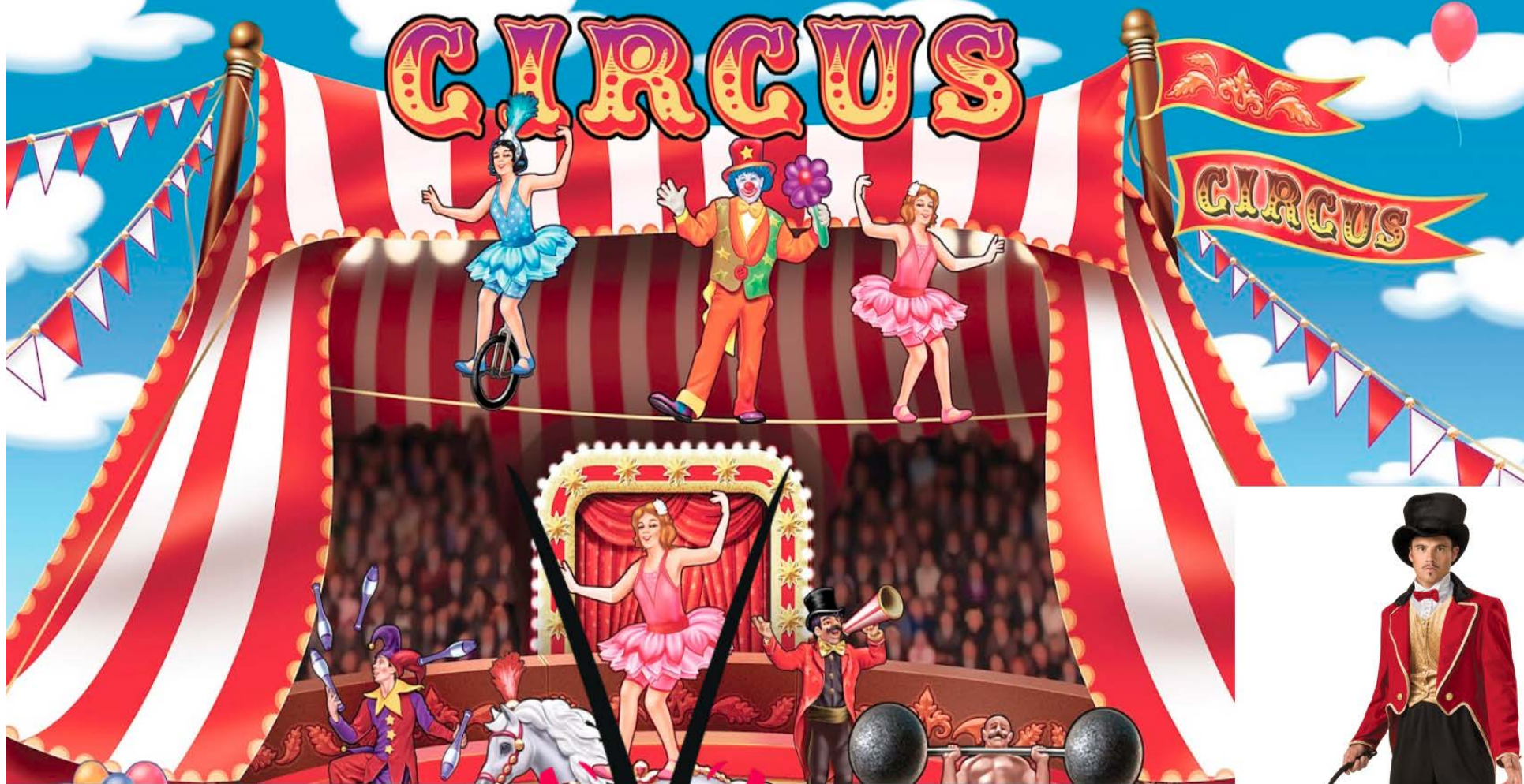
**Anything but sexy!**











# RWEEM

**A Cross-Platform Data Processing Framework**

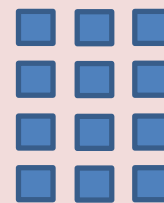
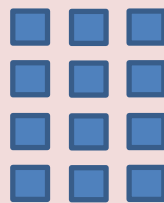


# Let's go!

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raster data management



Maple



● BBLIN



Intro & Polyglot

