

# On-boarding with JanusGraph Performance

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**JanusGraph: @JanusGraph**

## Agenda

Overview – Onboarding with graph performance

JanusGraph performance evaluation scenarios

- Bulk loader performance
- Data import performance
- Query performance

Lessons learned

Q&A



## Onboarding with graph performance

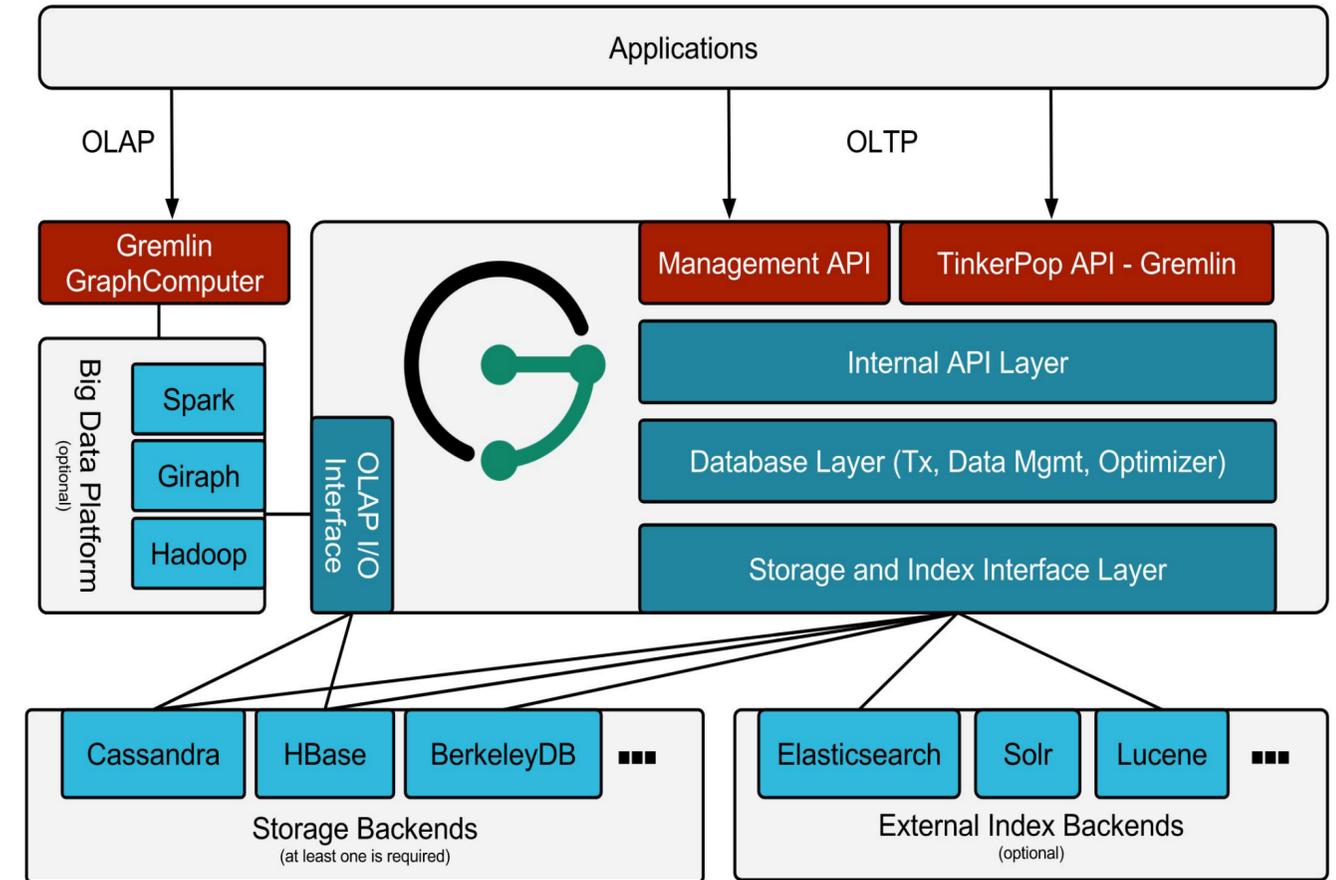
Exciting era with many new technologies!!

Onboarding users/developers to graph databases

- Typical focus areas: features and benefits, ease of use, suitability, extensibility, APIs...
- Performance is one of the most important differentiators for any application
- Is performance just for system testing?!
- Performance and scalability are key considerations for design, development, and operations

Journey to JanusGraph with a performance mind!

- Check out graph structures and traversals
- Evaluate reads and writes in high volume
- Can JanusGraph scale out for future data/user growth?
- Look for bottlenecks and provide improvements



# JanusGraph performance test environment

## Server spec

- Physical servers: x3650 M5, 2 sockets x 14 cores, 384 GB (12 x 32G) memory
- CPU: Intel Xeon Processor E5-2690 v4 14C 2.6GHz 35MB Cache 2400MHz
- Network interface: Emulex VFA5.2 ML2 Dual Port 10GbE SFP+ Adapter
- Disk: 720 GB SSD, RAID 5
- Operating system: Ubuntu 16.04.2 LTS

## Existing tools

- jMeter - load testing tool
- nmon, nmon analyser - system performance monitor and analyze tool
- VisualVM - all-in-one Java troubleshooting/profiling tool
- GCeasy - garbage collection log analysis tool

## Home grown tools

- Graph schema loader, data generator, batch importer, batch requester



## JanusGraph performance tool - Graph schema loader

Enable the graph model creation via the gremlin console or embedded in java

- Use JSON to describe your graph model
- Support:
  - Property
  - Vertex
  - Edge
  - Index

Benefit: Create schema on-the-fly without single line of code!

<https://github.com/yhwang/janusgraph-utils>

```
1  {
2  |   "propertyKeys": [
3  |     { "name": "name", "dataType": "String", "cardinality": "SINGLE" }
4  |   ],
5  |   "vertexLabels": [
6  |     { "name": "person" }
7  |   ],
8  |   "edgeLabels": [
9  |     { "name": "favorites", "multiplicity": "MULTI" }
10 |   ],
11 |   "vertexIndexes": [
12 |     { "name": "vByName", "propertyKeys": ["name"],
13 |       "composite": true, "unique": true }
14 |   ],
15 |   "edgeIndexes" :[
16 |     { "name": "eByTime", "propertyKeys": ["time"],
17 |       "composite": true }
18 |   ],
19 |   "vertexCentricIndexes" :[
20 |     { "name": "vcByTime",
21 |       "propertyKeys": ["time"], "edge": "mentions",
22 |       "direction": "BOTH", "order": "incr" }
23 |   ]
24 }
```

# Bulk load performance – Use case and data

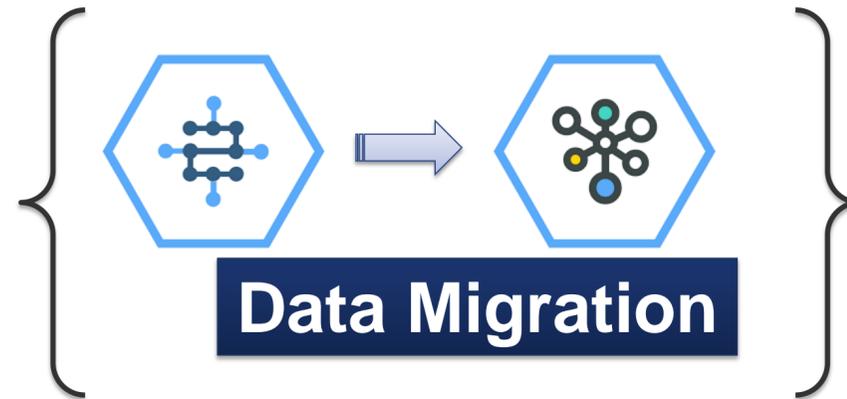
## Supported Formats

Gryo: 011110100101100101

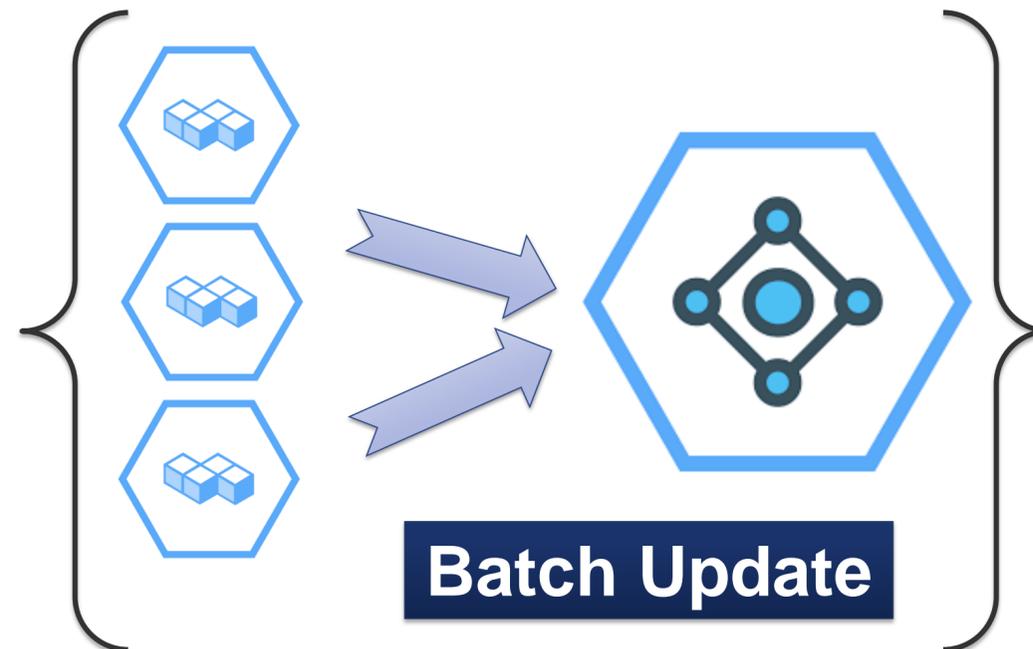
★ GraphSON: {"id": 1, "label": "...}

Script: 1:person:marko:29

★ OneTimeBulkLoader



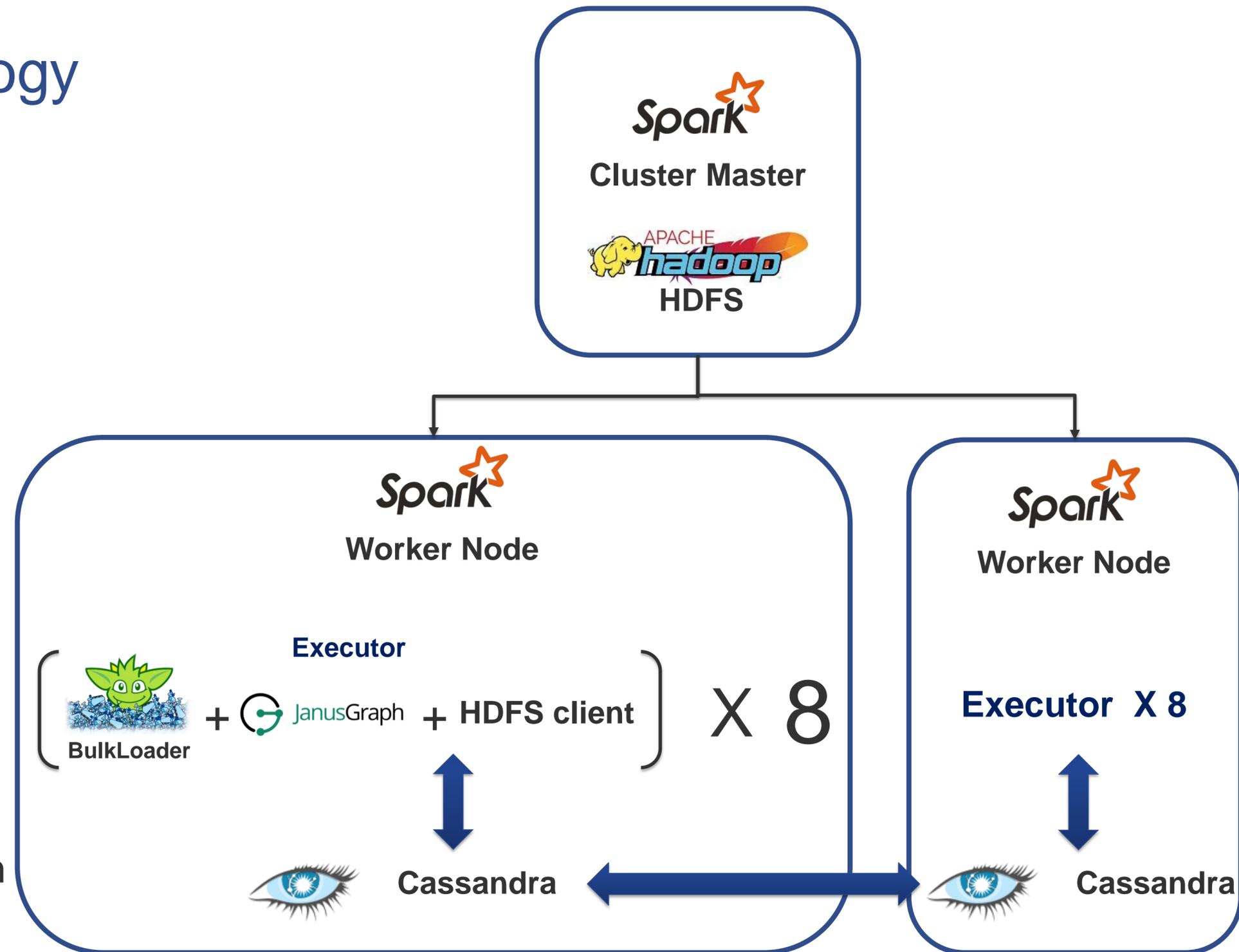
IncrementalBulkLoader



- OneTimeBulkLoader
- 128GB GraphSON file
- 31 million vertices
- 38 million edges
- 3277 propertyKeys
- 5 vertex labels
- 3 edge labels
- 78.9 properties per edge
- 18.7 properties per vertex

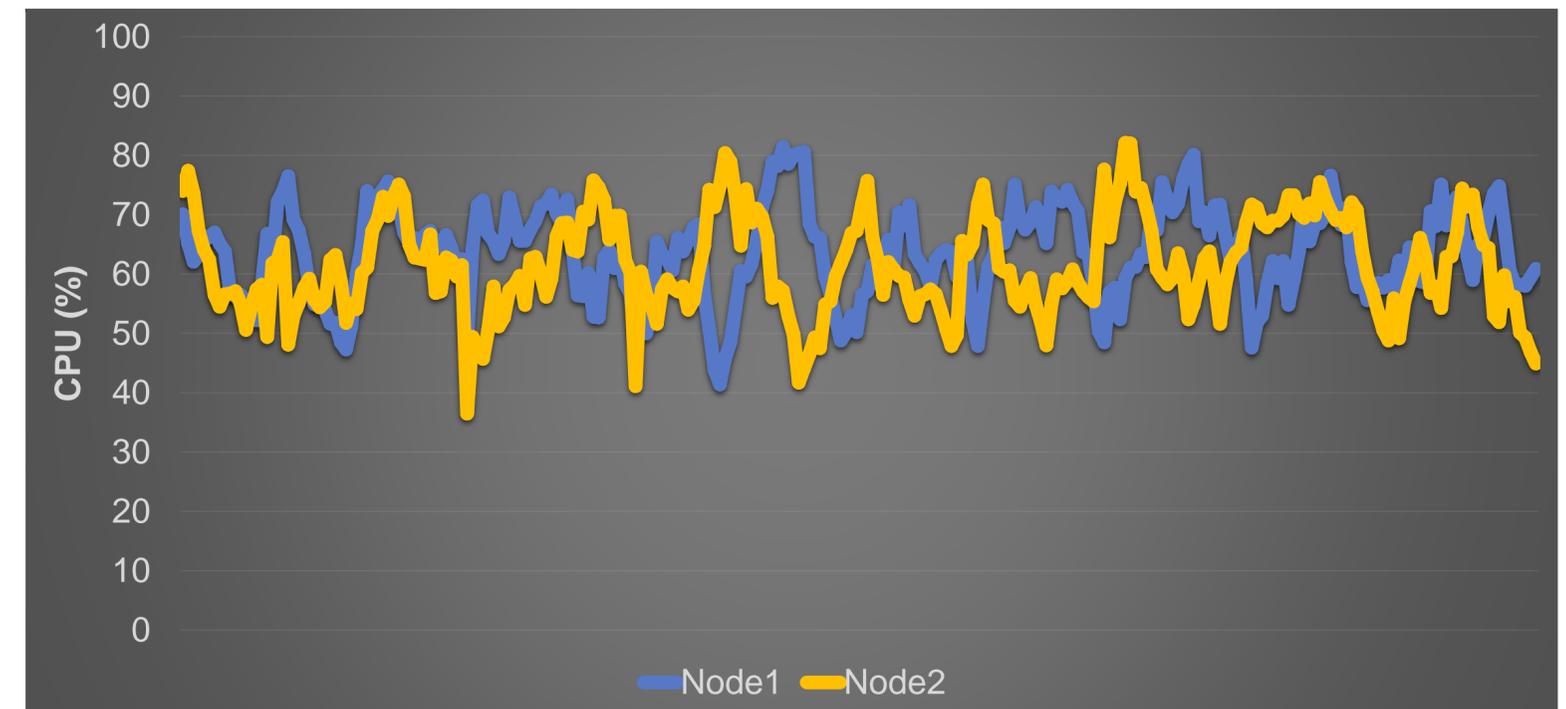
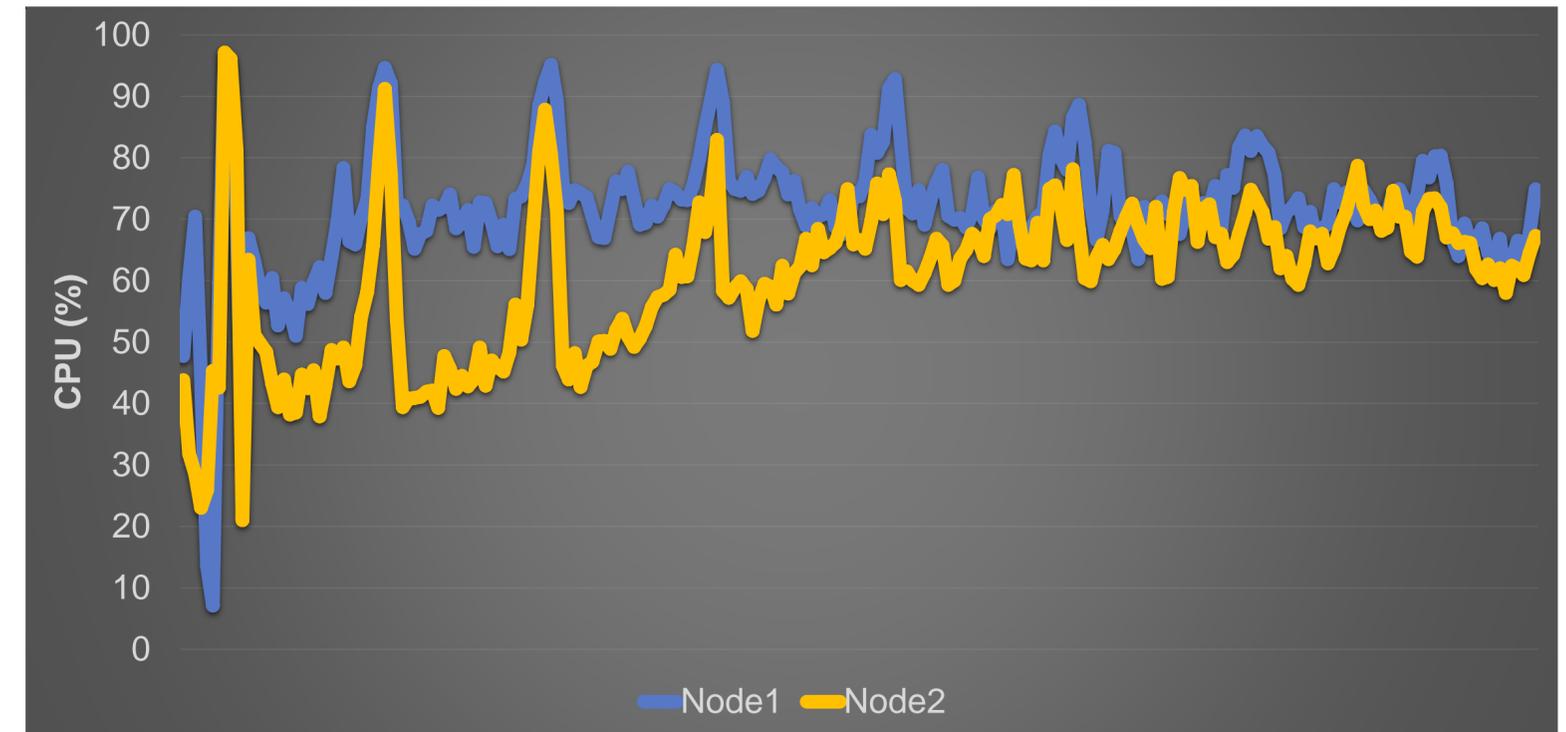
## Bulk load performance – Topology

- Spark - 1.6.1
  - Standalone Cluster
  - 2 worker nodes
  - 8 executors per node
  - 8 cores per executor
  - 2GB per executor
- Hadoop - 2.7.2
  - Use HDFS to store the GraphSON file
- Cassandra - 2.1.17
  - 2-node cluster
- Tinkerpop3 – 3.2.3
  - GraphComputer
- JanusGraph – 0.1.1
  - JanusGraphBulkLoaderVertexProgram
  - Astyanax persistence provider



## Bulk load performance – results

- Vertex:
  - 31,594,277
  - 19 mins
  - 495 records/sec per core
- Edge:
  - 38,322,731
  - 24.8 mins
  - 461.8 records/sec per core



## Data import performance – use case and data

Public Data			
	Wikimedia votes	Higgs Twitter	Panama Papers
Vertices(Million)	0.007	0.456	1.04
Edges (Million)	0.1	16	1.53
PropertyKeys	0	2	22
Vertex labels	1	1	5
Edge labels	1	4	261

Synthetic Data							
	Small	Medium	Large	XLarge	10x Properties	50x Properties	100x Properties
Vertices(Million)	<b>0.3</b>	<b>3</b>	<b>30</b>	30	3	3	3
Edges (Million)	<b>0.3</b>	<b>3</b>	<b>30</b>	<b>300</b>	3	3	3
PropertyKeys	7	7	7	7	<b>70</b>	<b>350</b>	<b>700</b>
Vertex labels	3	3	3	3	3	3	3
Edge labels	2	2	2	2	2	2	2

## Data import performance – topology and configuration

**All-In-One-Node**

**CSV Data Generator**

+

**Schema Loader**

+

**Batch Importer**

+



**Cassandra**

JanusGraph configuration:

```
storage.backend=astyanax  
ids.block-size = 500000  
storage.buffer-size = 2560  
storage.batch-loading = true  
schema.default = none
```

BatchImporter configuration:

```
commit size = 100  
worker target size = 10000
```

## Data import performance tooling- Graph data generator

A Java application

- Vertices and edges labels
- Number of vertices and edges
- Number of properties and data types
- Native and mixed index
- Relations patterns
- Super-nodes
- Generate graph-db schema in JSON
- Generate datamap JSON for BatchImporter

<https://github.ibm.com/htchang/JanusGraphBench>

```
1 {
2   "VertexTypes": [
3     { "name": "T1",
4       "columns": {
5         "T1-P1": {"dataType": "String", "composit": true} },
6       "row": 10 },
7     { "name": "T2",
8       "columns": {
9         "T2-P1": {"dataType": "String", "composit": true},
10        "T2-P2": {"dataType": "Integer", "composit": true} },
11       "row": 10 }
12   ],
13   "EdgeTypes": [
14     { "name": "E1",
15       "columns": {
16         "E1-P1": {"dataType": "Date", "composit": true} },
17       "relations": [
18         {"left": "T1", "right": "T2", "row": 10, "supernode": {"vertices": 5, "edges": 1000} },
19         {"left": "T2", "right": "T1", "row": 10 }
20       ]
21     }
22   ]
23 }
```

## Data import performance tooling - Graph data batch importer

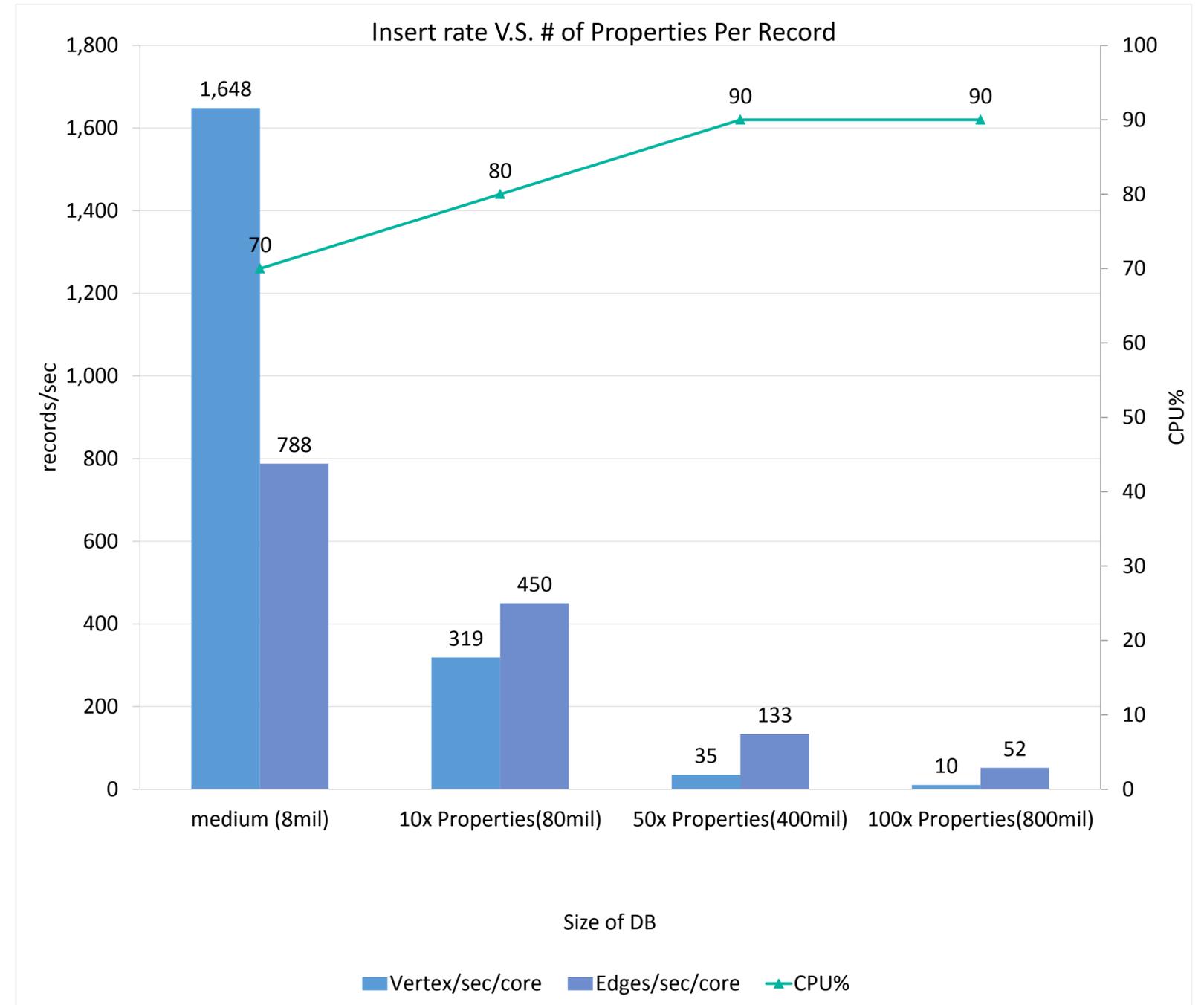
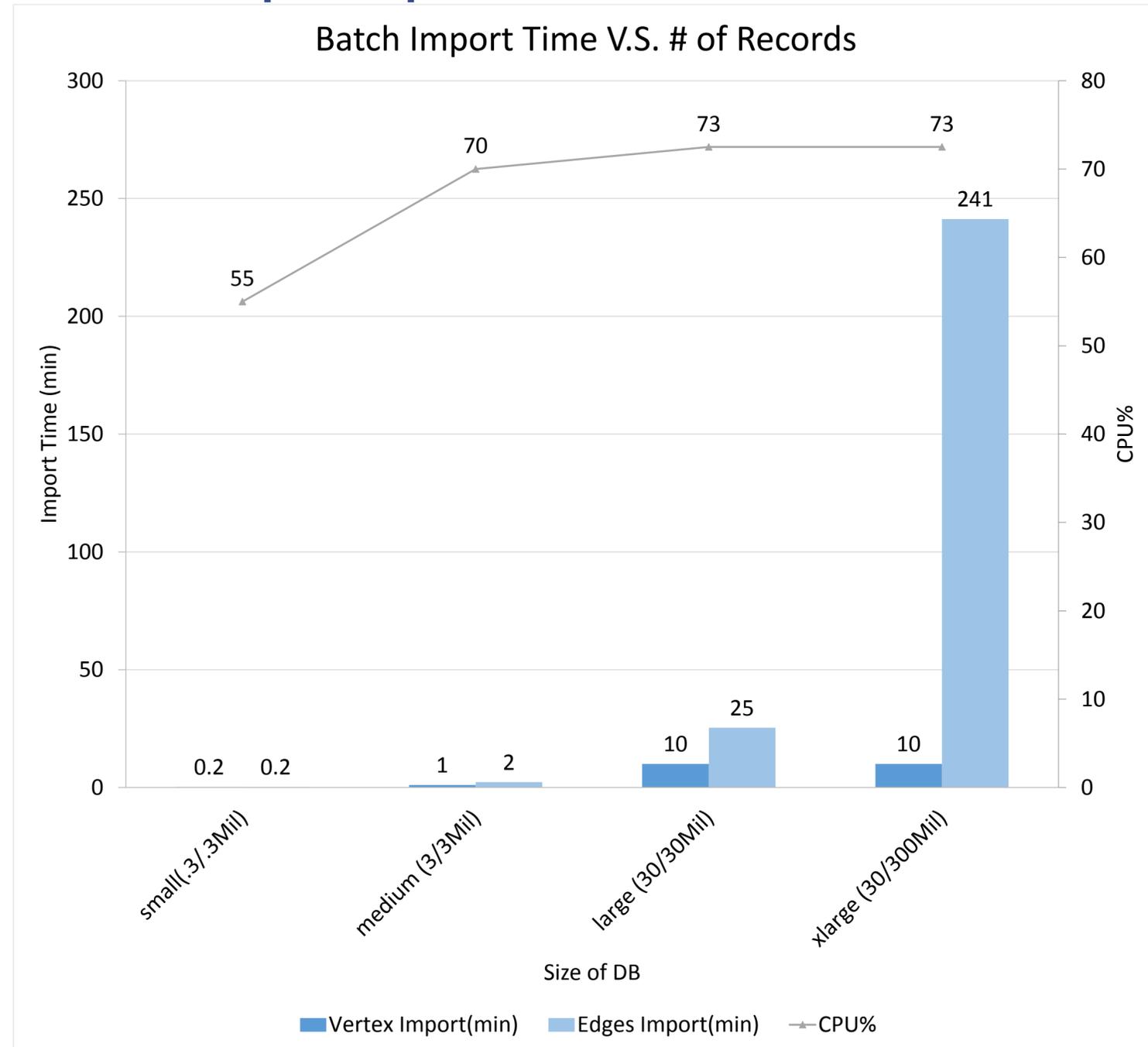
Java application to Import CSV data into JanusGraph

Features:

- Multiple Threads
- Worker record size
- Commit size
- Import schema
- Import CSV to JanusGraph with configurable data mapping

<https://github.com/sdmonov/JanusGraphBatchImporter>

# Data import performance – results



## Data query performance – use case and data

### Flight search

- All flights from airport A to airport B on a given date and time
- # of stops: non-stop, one-stop, two-stop...

### Data spec

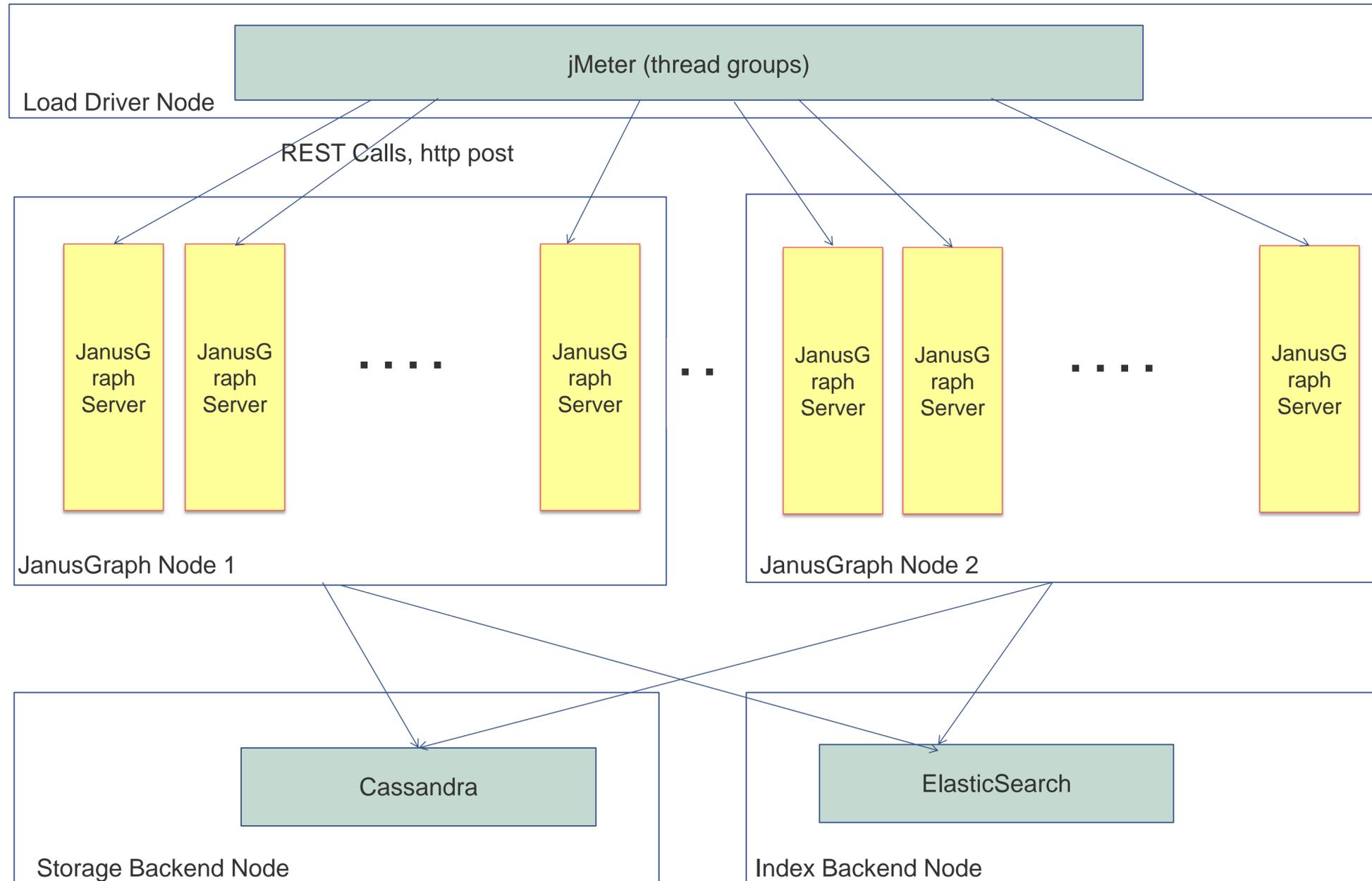
- 600+ airports, 350K+ flight schedules

### Performance analysis

- How many requests per second can JanusGraph handle?
- Can JanusGraph scale with future volume growth?



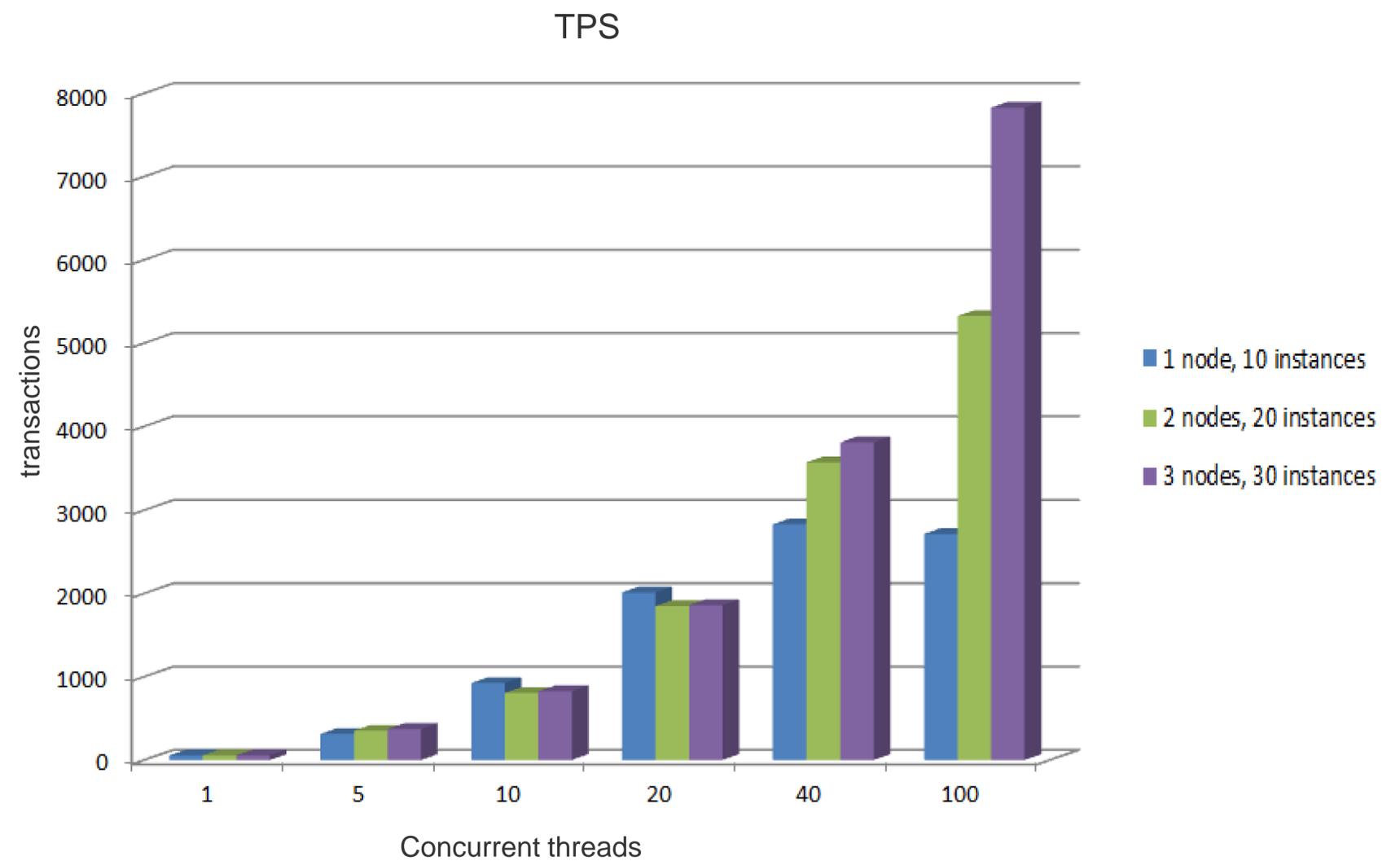
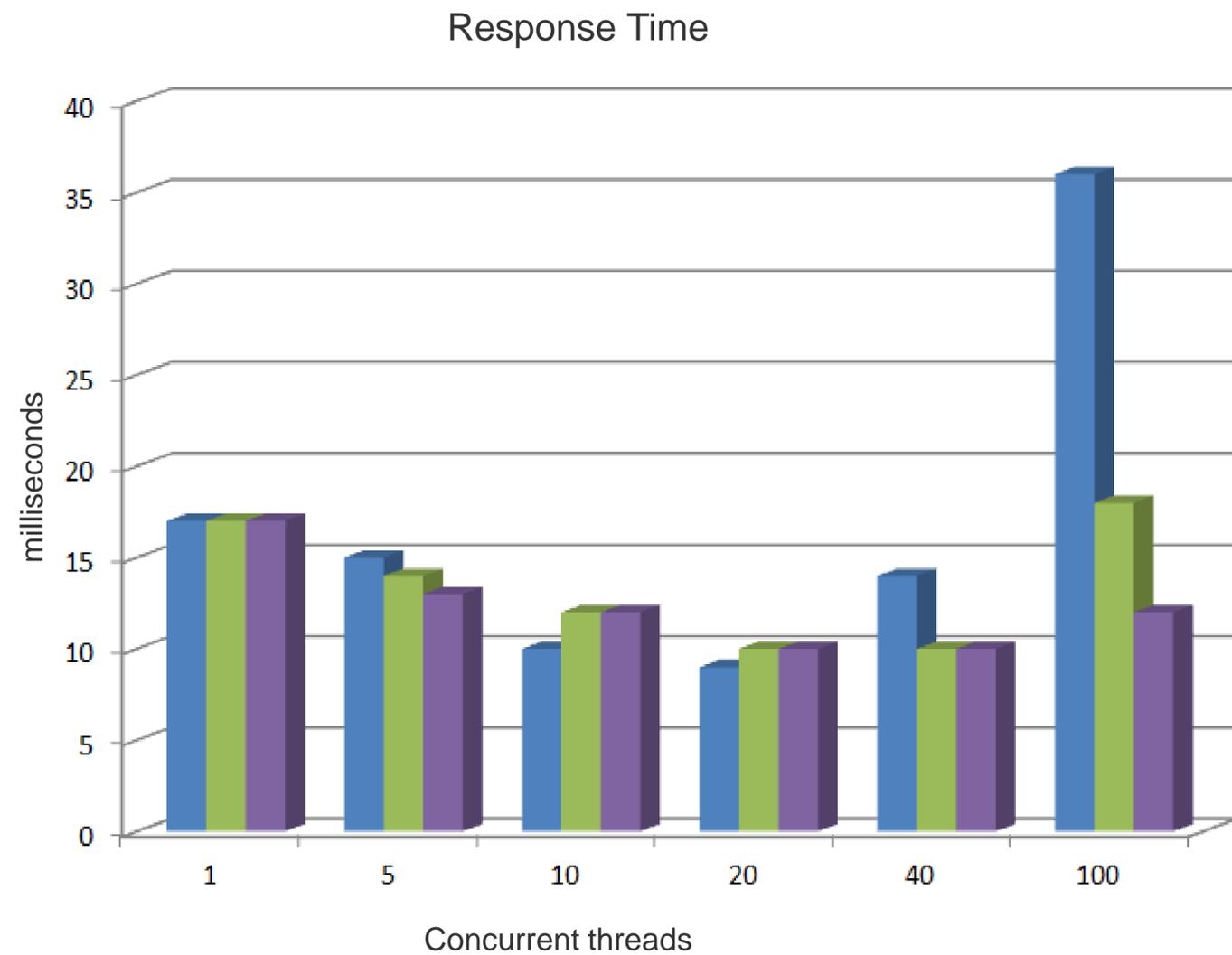
# Data query performance - Topology and configuration



- JanusGraph server with REST
- 1 or 10 instances per server
- Astyanax persistence provider
- threadPoolBoss: 2
- threadPoolWorker: 20
- Java heap: -Xms512m -Xmx8G
- Concurrent threads (users): 1, 5, 10, 20, 40, 100, 200
- Think time: 0 ms
- Run duration: 5 minutes
- Multiple test configurations
  - 10 instances on 1 node
  - 20 instances on 2 nodes
  - 30 instances on 3 nodes

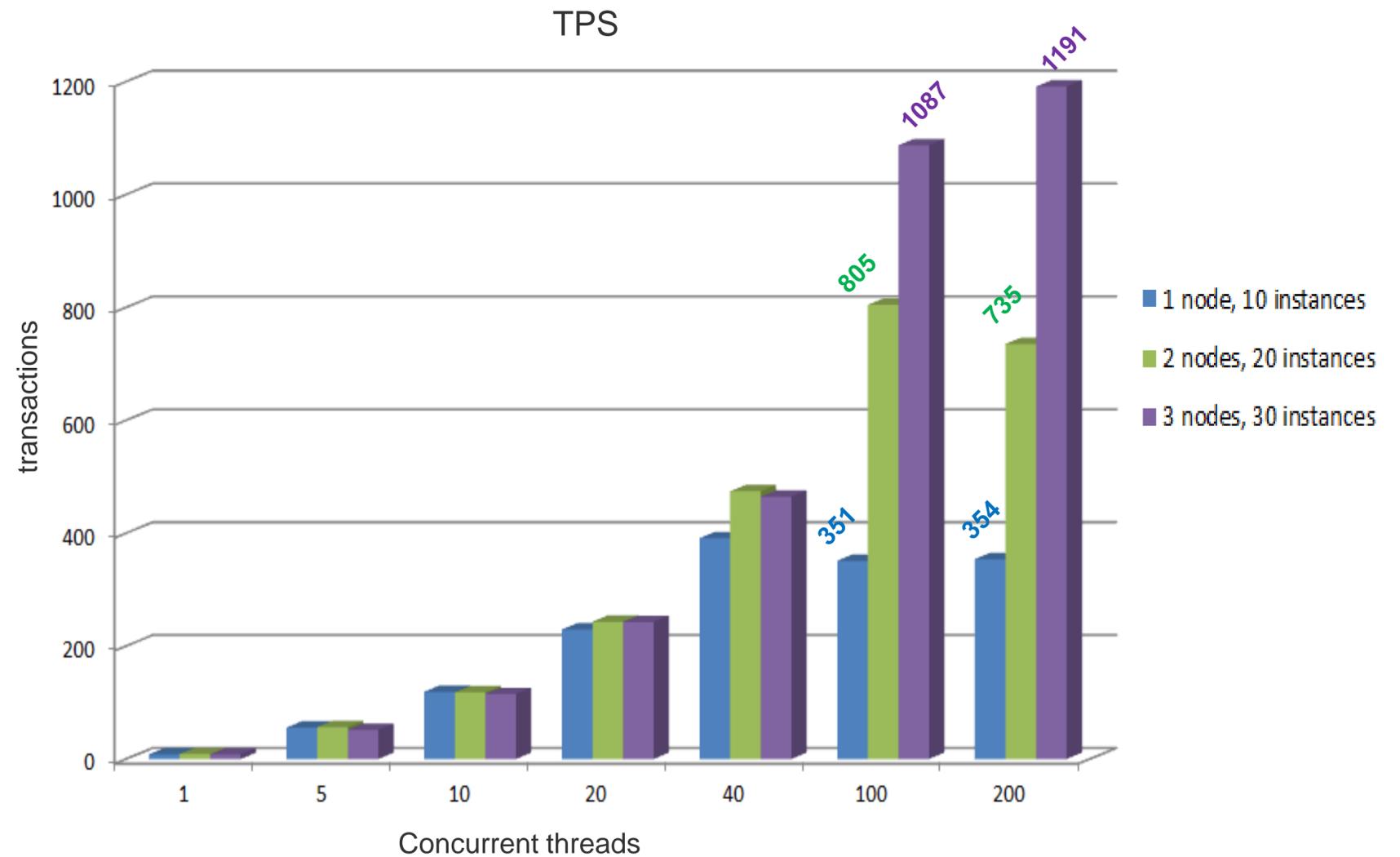
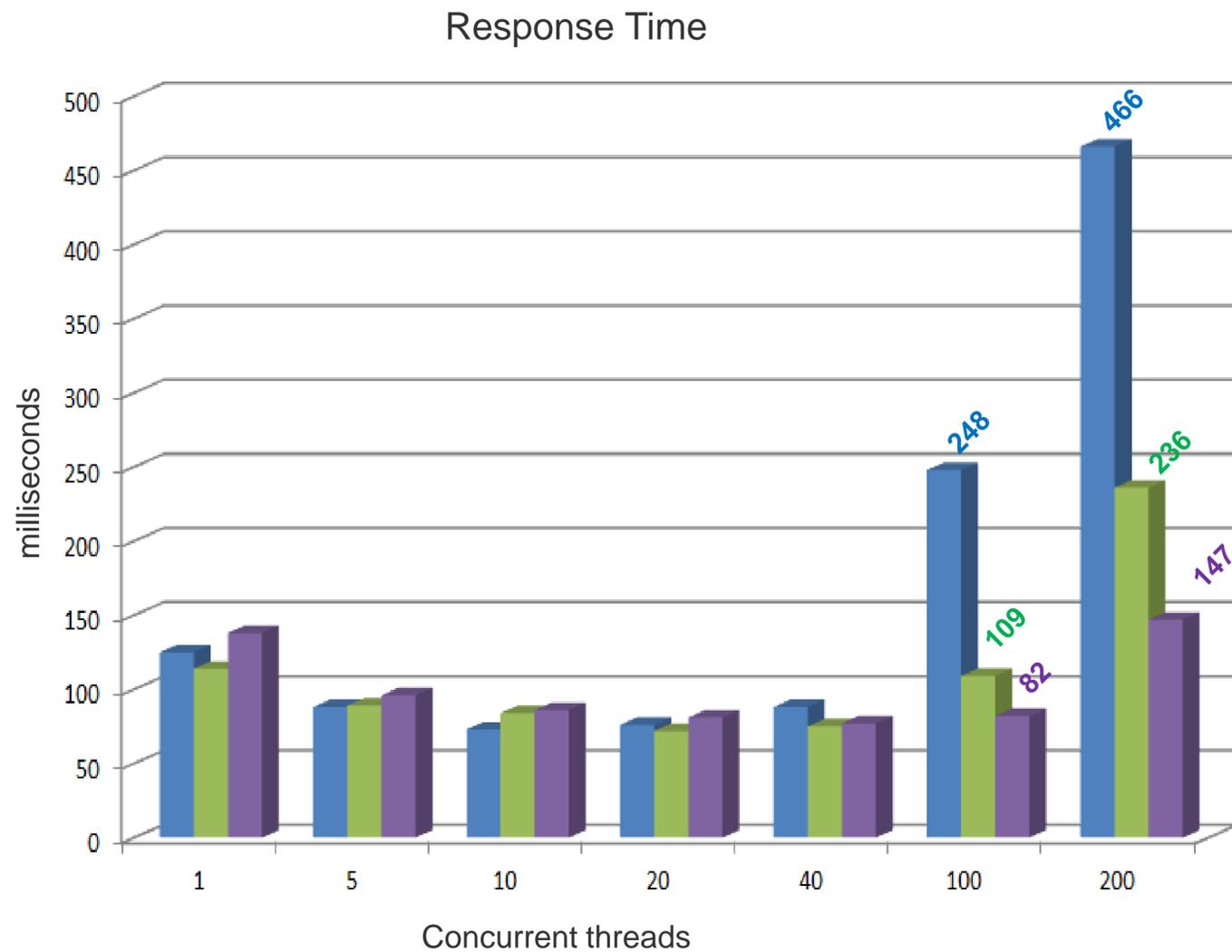
# Data query performance – Non-stop flights (one level deep traversals)

Performs well regardless number of instances and nodes



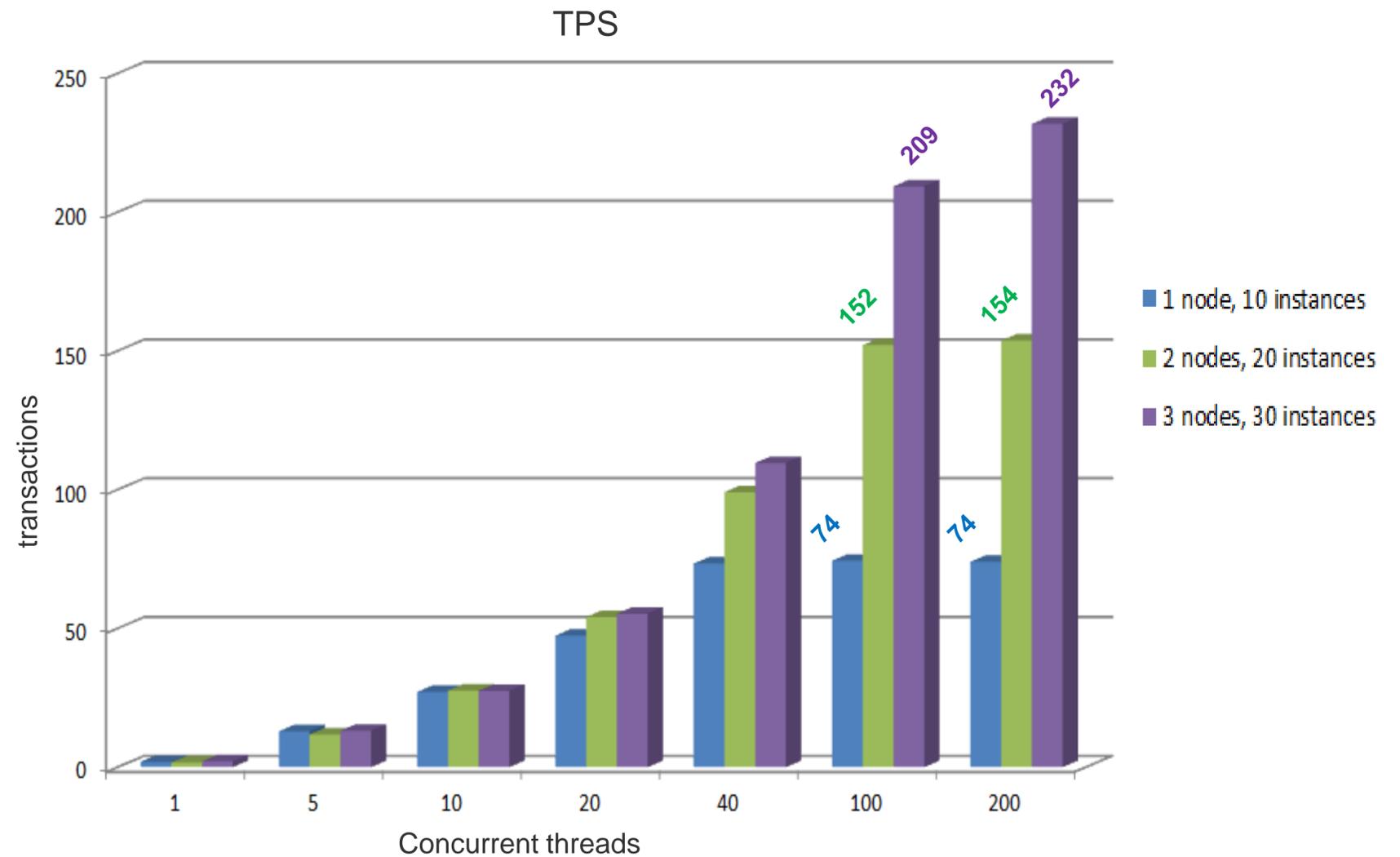
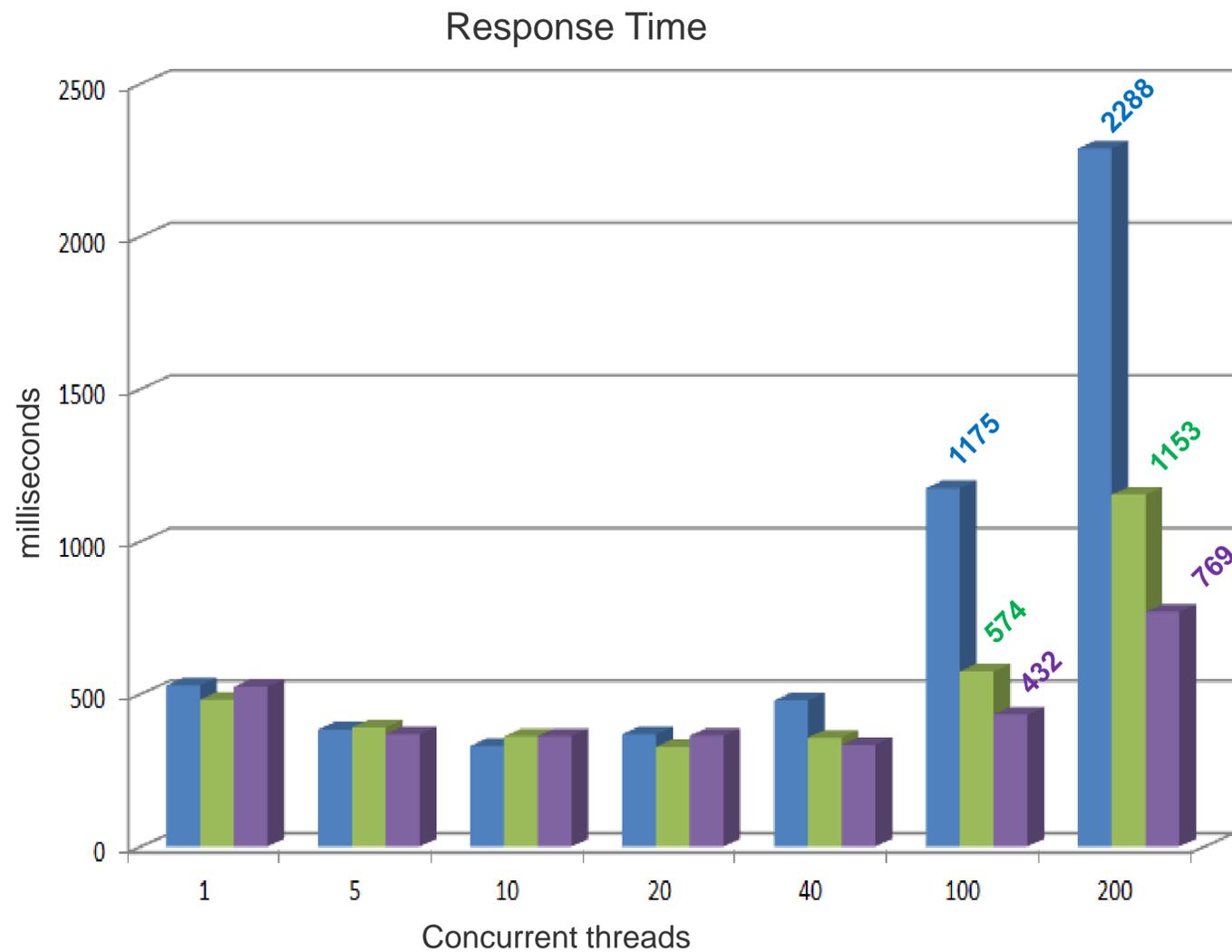
# Data query performance – One-stop flights (two levels deep traversals)

People would like to see more than just non stop flights...



# Data query performance – Two-stop flights (three levels deep traversals)

The query gets complicated because we need to operate and filter on multiple vertices and edges.



## Lessons Learned

### Model your graph database for performance

- Data is yours. Design the data model for your use cases!
- What kind of queries you want to support? How many levels deep into a traversal?
- Consider denormalization...
- Design and use indexes, graph indexes and vertex-centric indexes in JanusGraph, for better performance, but not over-use indexes
- It is recommended to create the complete data model before inserting content

### Use batch commits with caution

- Batch commits allow multiple transactions to be committed together. The batch size affects performance and the optimal size depends on the characteristics of data.
- Need to handle conflicts for inserts and updates in a multi-threads/multi-clients implementation
- Make sure the commit is completed and closed

## Lessons Learned

### Fine-tune for your workloads and systems

- JanusGraph supports storage and index backends therefore tune your backends!
- JanusGraph server configurations, such as threadPoolBoss and threadPoolWorker
- JVM configurations, such as Xms (initial and minimum Java heap size) and Xmx (maximum Java heap size)  
You don't want to see the annoying java.lang.OutOfMemoryError exceptions 😊 But at the same time an oversized Xmx has negative impact on performance due to long and slower GCs.
- Use multiple threads and/or instances to your system's capacity
- Next step... consider cloud and auto-scaling
- Be thorough and be patient because it will take a few iterations
- Just like a fine-tuned instrument, you will enjoy the beautiful music for a long time!



# Compose for JanusGraph

## What is it?

- Compose is an open-source database hosting provider
- Supports backups, monitoring, performance tuning, and a full-suite of deployment management tools backed by a 24x7 support and operations team
- Offers JanusGraph technology with Scylla database
- <https://www.compose.com/janusgraph>



## What's next?

The journey continues...

- Find ways to improve JanusGraph performance
- Join us if you are interested in graph performance
- Work with us if you have graph datasets
- Talk to us if you have any comments or suggestions



# Thank you for keeping performance in mind !!

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