LDBC Graphalytics: A Benchmark for Large-Scale Graph Analysis on Parallel and **Distributed Platforms**

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VU SS VRIJE UNIVERSITEIT AMSTERDAM



Published in PVLDB vol. 9.13 (2016) Co-authored by Alexandru Iosup, Wing Lung Ngai, Stijn Heldens, Arnau Prat-Pérez, Thomas Manhardt, Hassan Chafi, Mihai Capotă, Narayanan Sundaram, Michael Anderson, Ilie Gabriel Tănase, Yinglong Xia, Lifeng Nai, Peter Boncz Graphs Are at the Core of Our Society: The LinkedIn Example

The State of LinkedIn

A very good resource for matchmaking workforce and prospective employers

Vital for a company's life,

as any Head of HR would tell you

Vital for the prospective employees

Tens of "specialized LinkedIns": medical, mil, edu, science, ...

750,000,000

registered members

(01 ′12)

> 1,000,000

Sources: Vincenzo Cosenza, The State of LinkedIn, <u>http://vincos.it/the-state-of-linkedin/</u> via Christopher Penn, <u>http://www.shiftcomm.com/2014/02/state-linkedin-social-media-dark-horse/</u>



LinkedIn's Service Analysis



Sources: Vincenzo Cosenza, The State of LinkedIn, <u>http://vincos.it/the-state-of-linkedin/</u> via Christopher Penn, <u>http://www.shiftcomm.com/2014/02/state-linkedin-social-media-dark-horse/</u>



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Graph Processing Platforms





Graph Processing Platforms





What Is the Performance of Graph Processing Platforms?



- Graph500
 - Single application (BFS), Single class of synthetic datasets. @ISC16: future diversification.
- Few existing platform-centric comparative studies
 - Prove the superiority of a given system, limited set of metrics
- GreenGraph500, GraphBench, XGDBench
 - Issues with representativeness, systems covered, metrics, ...



What Is the Performance of Graph Processing Platforms?



Graphalytics = comprehensive benchmarking suite for graph processing across many platforms





Graphalytics, in a nutshell

- An LDBC benchmark
- Advanced benchmarking harness
- Many classes of algorithms used in practice
- Diverse real and synthetic datasets
- Diverse set of experiments representative for practice
- Renewal process to keep the workload relevant
- Extended toolset for bottleneck analysis
- Enables comparison of many platforms, community-driven and industrial



http://ldbcouncil.org/ldbc-graphalytics



Results: Experimental Setup (1)

Graphalytics has been implemented for 3 community-driven platforms (Giraph, GraphX, PowerGraph) and 3 industry-driven platforms (PGX, GraphMat, OpenG).





Results: Experimental Setup (2)



All experiments were performed by TU Delft on DAS-5 (Distributed ASCI Supercomputer, the Dutch national supercomputer for Computer Science research).

Environment: 1 machine (64GB, 2x8 cores)



elft University of Technology

The Platform Has Large Impact



The Algorithm Has Large Impact



The Dataset Has Large Impact



The Dataset Has Large Impact



The Dataset Has Large Impact



Lessons learned

Performance of graph processing is a non-trivial function of (Platform, Algorithm, Dataset, ...), the P-A-D triangle

Understanding performance requires in-depth analysis We are building tools for manual/automated bottleneck analysis

All current platforms can also have drawbacks Ease-of-use/programmability of a platform is very important Significant knowledge required to tune a system



Ongoing work

Finalizing version 1.0 of the benchmark specification using feedback from the community and our partners

Launching an online archive for sharing Graphalytics results

Organizing a global competition for graph-processing systems



Take-Home Message

Graphalytics: comprehensive benchmark and framework for comparing graph processing platforms

The P-A-D triangle: Performance = f (Platform, Algorithm, Dataset, ...)

Global competition and public archive of benchmark results are coming

Use Graphalytics to test your graph processing platform: http://ldbcouncil.org/ldbc-graphalytics





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