# LAGraph: A Graph Algorithm and Network Analysis Library for GraphBLAS

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Abstract—design decisions, easy mode/expert mode, GAP algorithms, ...

Index Terms—Graph Processing, Graph Algorithms, Graph Analytics, Linear Algebra, GraphBLAS

#### I. Introduction

LAGraph is a library of Graph Algorithms based on the GraphBLAS

Key contributions:

- document design decisions for LAGraph
- present a concise notation for GraphBLAS algorihms
- algorithms of the GAP benchmark suite [3] used in the IISWC benchmark paper [2]
- improve data ingestion performance, e.g. using SIMD techniques [10]

Recently, numerous graph-specific have targeted GPUs such as Gunrock [15] and GraphBLAST [17], and FPGAs [4].

However, in the near future we expect even more heterogeneous hardware architectures including graph-specific hardware based on the Programmable Integrated Unified Memory Architecture (PIUMA) [1]. Additionally, graph processing workloads can be offloaded to machine learning accelerators, e.g., Tensor Processing Units (TPUs) [9], systolic arrays using reconfigurable dataflow architecture [7], sparse linear algebrabased deep learning accelerators [11].

Previous GraphBLAS design papers: theory [12], C API [14], C++ API [6], distributed API [5], LAGraph [13]

```
int main() {
   return 0; // return zero
}
```

Listing 1: Example

# II. DESIGN DECISIONS

#### Jim

We investigate the following design questions:

- easy mode, expert mode
- multi-threadable
- data structure for representing a graph/matrix
- error handling
- opacity of LAGraph

<sup>1</sup>A non peer-reviewed comparison of 6 popular graph algorithms libraries is available at https://www.timlrx.com/blog/benchmark-of-popular-graph-network-packages-v2.

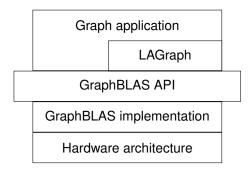


Fig. 1: Separation of concerns using the GraphBLAS API.

# III. NOTATION

## IV. ALGORITHMS

GAP algorithms: BFS, SSSP, TC, BC, PR. Not sure whether CC should be included.

push/pull [16]

#### V. EVALUATION

# Tim D

### A. SuiteSparse extensions

SuiteSparse performance figures: lazy sort, bitmap, ...

# B. Performance results

Benchmark environment (DGX), 2x6x5

VI. CONCLUSION

Future work - ideas:

- Create a Python wrapper for LAGraph
- Implement the LDBC Graphalytics benchmark [8]
- Improve data ingestion performance using e.g., SIMD instructions [10]

#### ACKNOWLEDGEMENTS

#### add acks

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