



AI PLATFORM INTRODUCTION

Prof. Ching-Yung Lin
Columbia University

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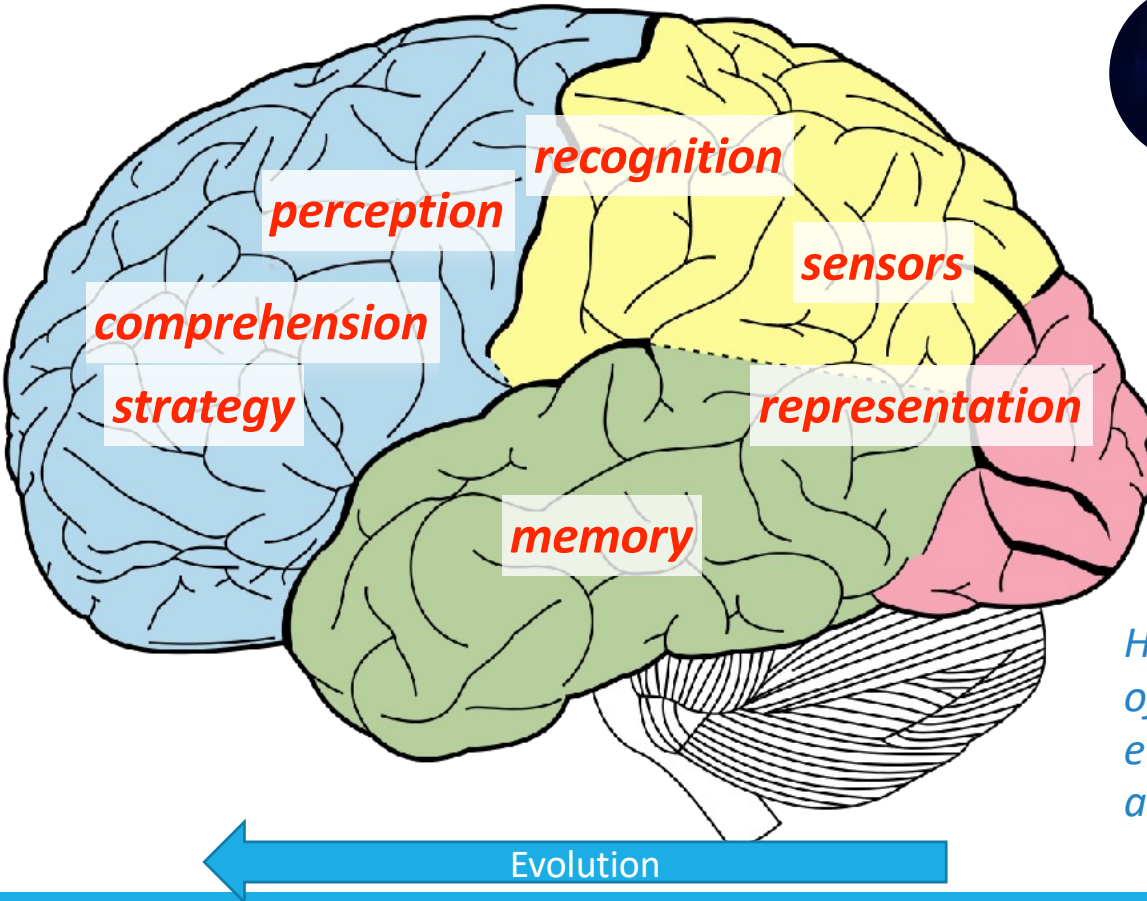


Ardi AI Platform

Contextual Analysis | Autonomous Learning

Advanced Enterprise Full-Brain AI Platform to build solutions – Scalability, Stability, and Advanced AI Technologies

Human Brain – a graph network of 100B nodes and 700T edges evolved and became smarter and smarter.



Ardi's Enterprise- Ready Functions

- Graph Database
- Relational Database



Memory

- Causality Modeling
- Behavior Prediction



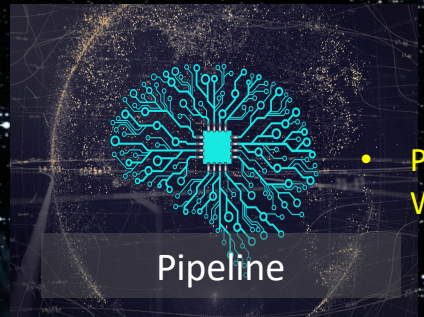
Reasoning

Ardi AI Platform



Perception

- Graph Analytics
- Feature Engineering



Pipeline

- Production Workflow



Expression

- Visualization
- ML Explanations



Learning

- Machine Learning
- Deep Learning
- Autonomous Model Optimization



Understanding

- Natural Language Processing
- Deep Video Understanding



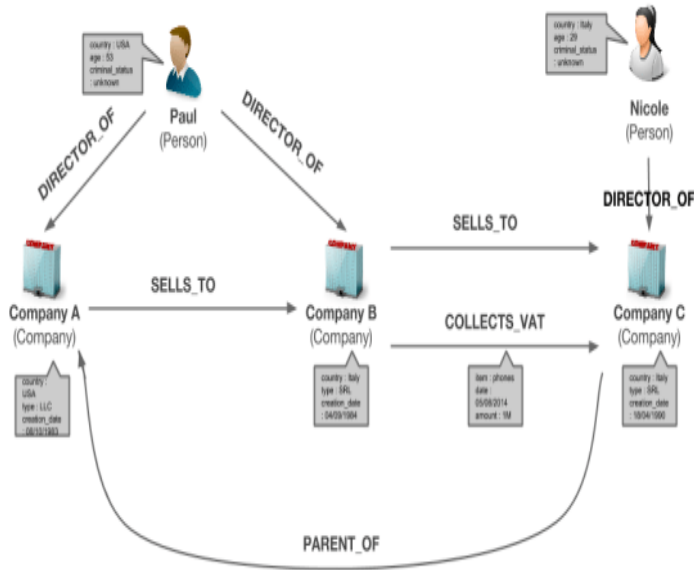
Strategy

- Action Strategy Simulation

Three Major Reasons why Graph makes Machine Smarter

Context

Attributes and Relationships



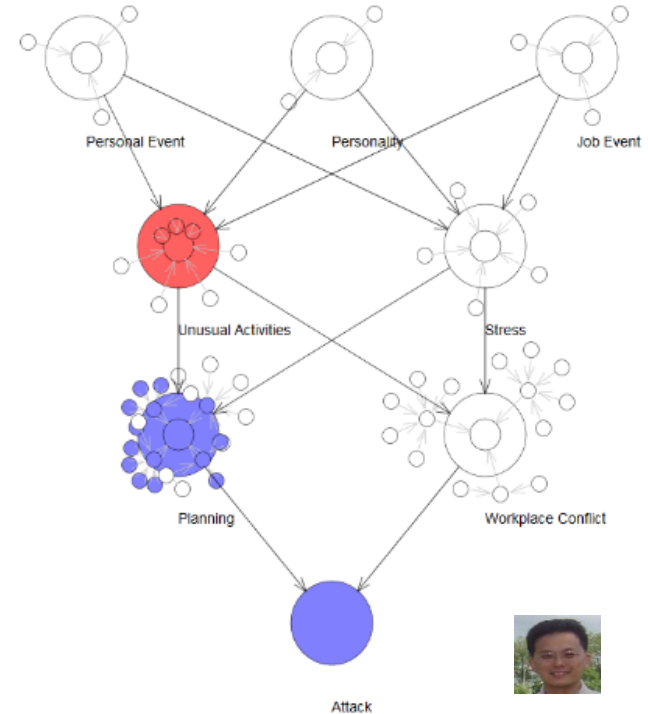
Complex Relationships

Topology and Flow



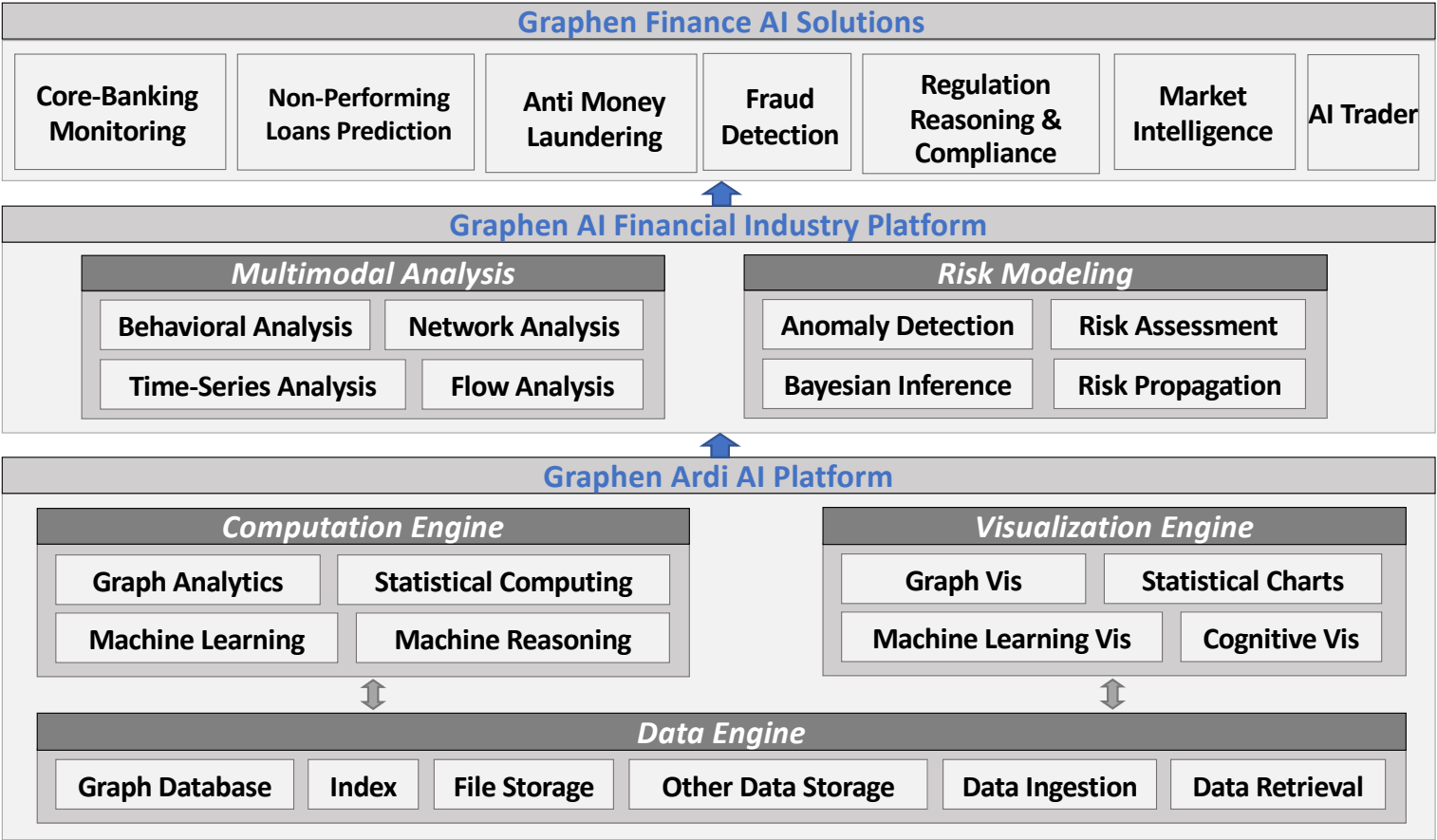
Reasoning

Causality and Prediction



Based on 15+ years of AI Security and AI Finance: usually accuracy is at least 2x-3x by context / relation analysis, 10x+ by reasoning / behavior prediction

Example: Graphen Financial Industry Platform and Solutions



Application Summary

Products: AI offerings from the foundational platform to industry solutions

Main Business Models: selling valuable industry solutions to business customers or jointly selling solutions with key business partners to users



AI Foundation | Full-Brain Platform



AI Finance | Risk, Fraud, ESG & Intelligence



AI Medicine | Knowledge, Drug & Precision

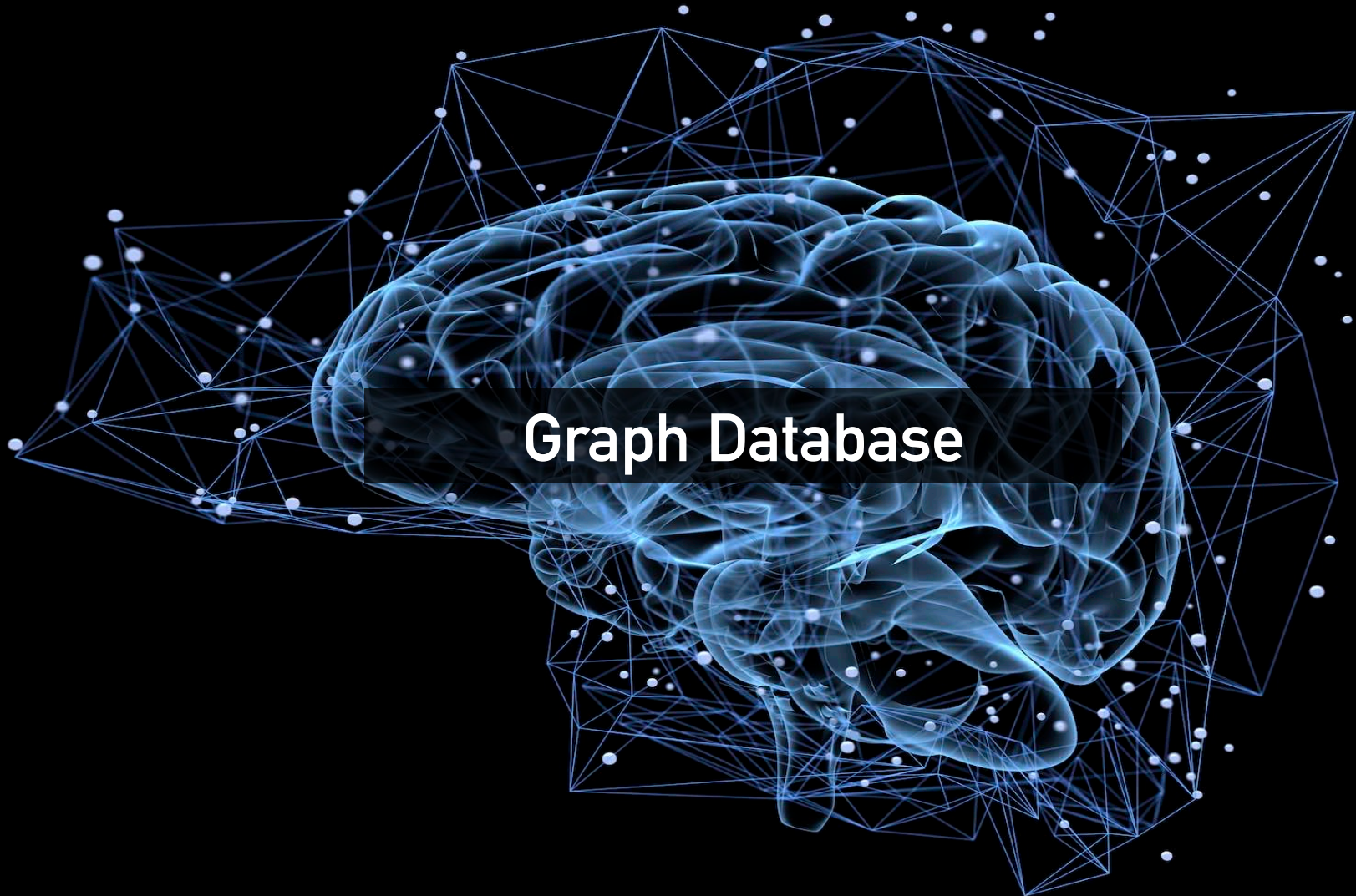


AI Automobile | Car Doctor



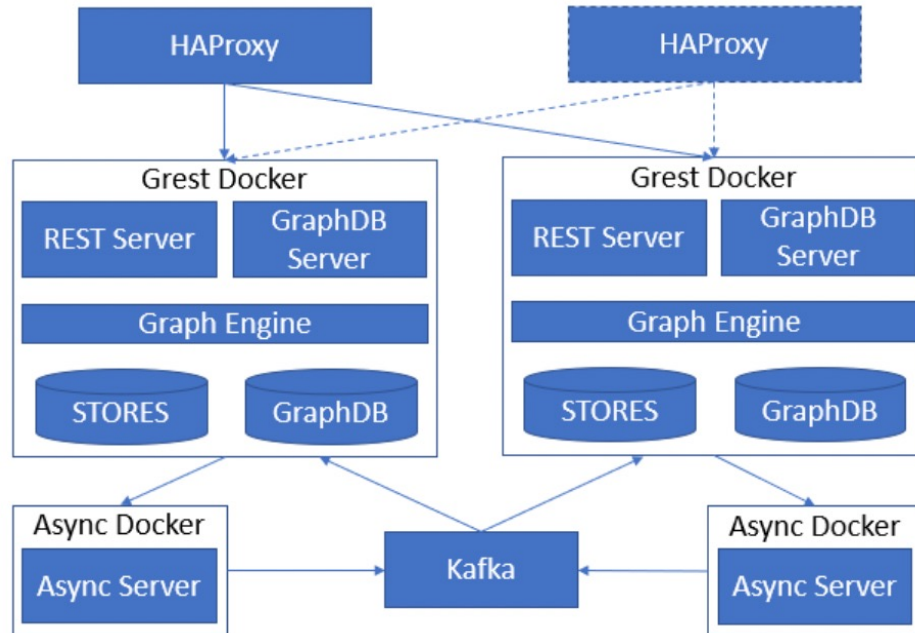
AI Energy | Clean Energy & Smart Grid





Graph Database

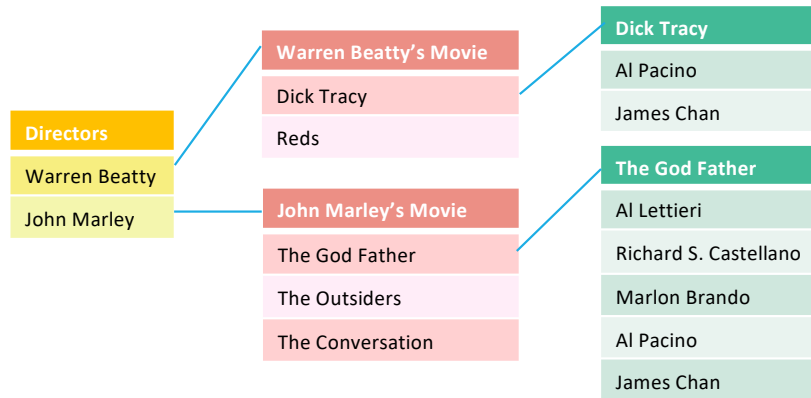
Ardi Graph Database is a C++-based native DB



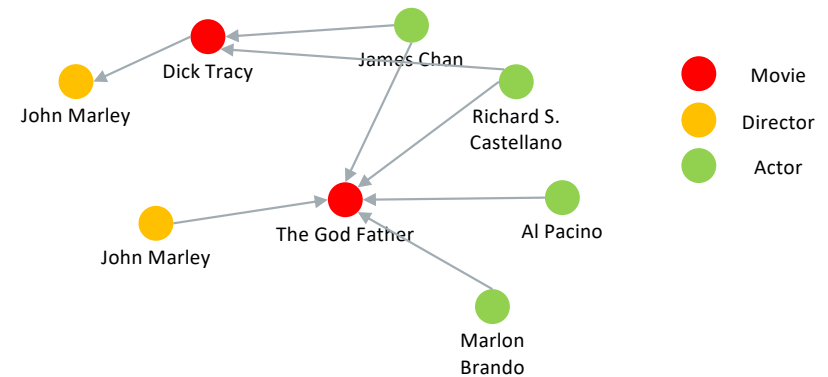
- **The storage layer** contains a high-performance **native graph store based on C++**, **indexers** to facilitate property-based search, **process store** to keep record of input/output associated with graph analytics and machine learning, and a **storage engine** to manage the graph database, indexes, and data store.
- **The analytics layer** has several computation modules utilizing Ardi platform's graph analytical algorithms and machine learning algorithms.
- **The query layer** includes all the services needed to synchronously or asynchronously load data into the storage layer, invoke graph analytics and machine learning algorithms, and retrieve data and results from running graph analytics and machine learning algorithms.
- **The visualization layer** enables raw graph data or computation results to be retrieved and displayed at the user interface via interactive visualizations.
- **The High Availability proxy servers** guarantees continuous system operations. Communications between layers are achieved via standardized APIs.

Graph Database vs. Relational Database

- SQL requires **expensive join operations** to compute neighborhoods of a vertex. Often the number of joins required is proportional with the distance from the source vertex as required by a specific algorithm.



Finding neighbors requires joins operations which may become intractable depending on the size of the database



Finding a neighborhood is logarithmic in the size of the database, thus tractable for any depth required

=> **Ardi Platform supports both proprietary native Graph DB (by C++) and open-source relational database**

Graphen Database is Enterprise Production-Ready

Deployed in production in several largest banks in the world (in New York, Honk Kong, Shanghai and Taipei by Dec 2020):

- Terabyte-sized native GraphDB, supports trillion of vertices and edges
- ACID-compliant and distributed Graph database and analytics
- Asynchronous job scheduling (both Autonomous ML and GraphDB)
- Scalable, distributed Analytics, modular and expandable through plugins
- Cluster, Replication and High-Availability with disaster recovery
- Error and event Logging, Monitoring, Backup and Recovery
- Supports both Graph Database and Relational Database
- Supports OpenCypher query language



Ardi Database's OpenCypher query support

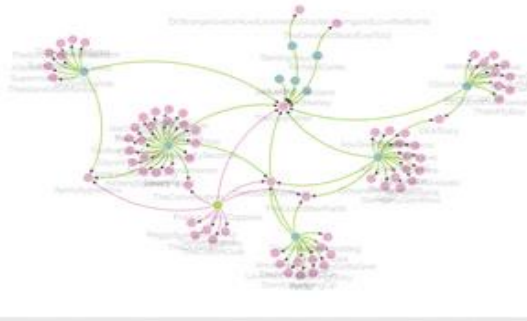
Ardi Database supports OpenCypher query, making it easy to incorporate graph processing capabilities.

Graphen Ardi Platform

Graph name : cypher_graph

```
$ match (n) return n
```

```
$ match (n) return n
```

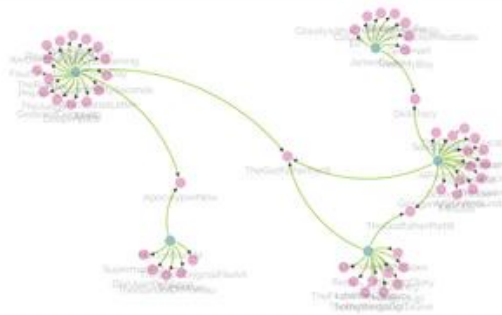


Graphen Ardi Platform

Graph name : cypher_graph

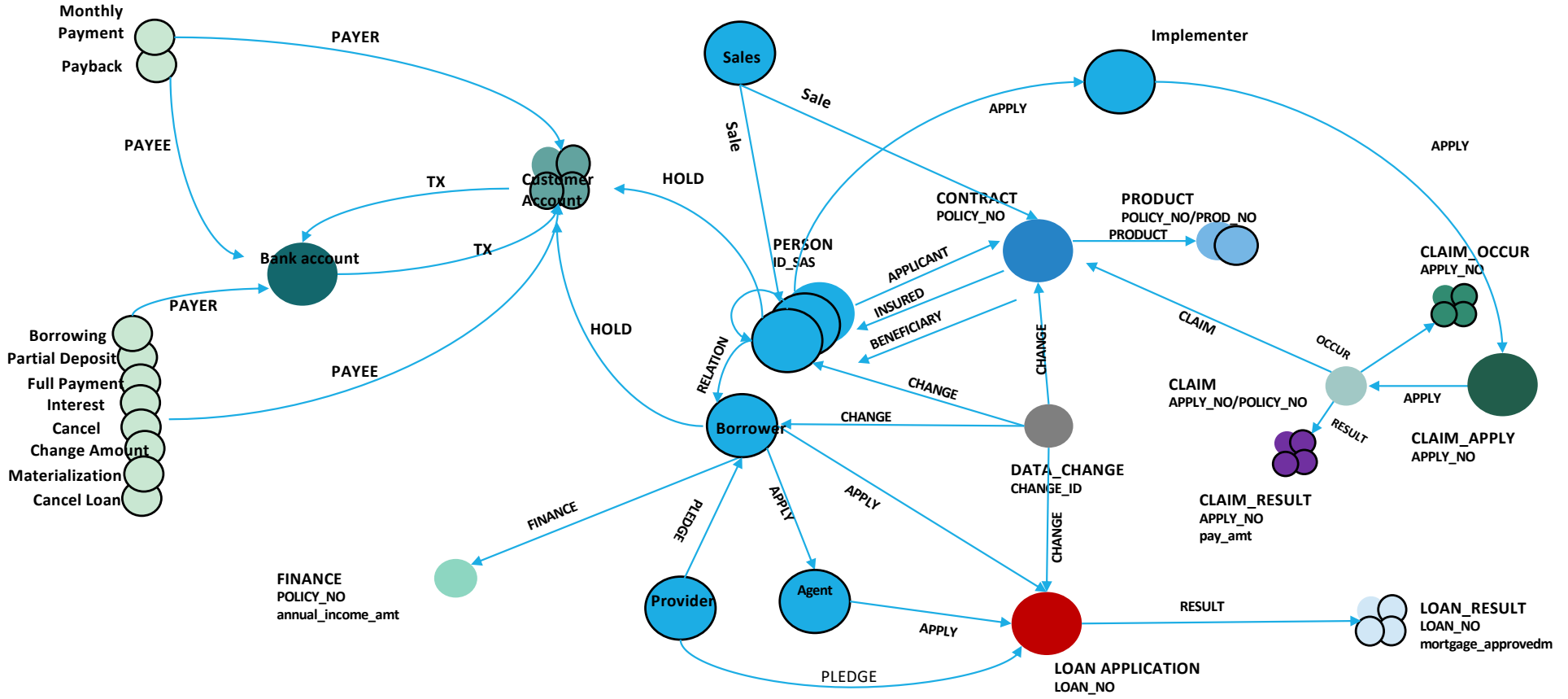
```
$ match (actor:ACTOR) - [act:ACT] -> (movie:MOVIE) where movie.budget > 12300000 return actor, movie
```

```
$ match (actor:ACTOR) - [act:ACT] -> (movie:MOVIE) where movie.budget > 12300000 return actor, movie
```



Property	Value
Name	ACTOR
LABEL	3087
ID	RobertDuvall
name	315032400
date	2
gender	8
length	

Example: Graphen Graphs for Insurance Fraud



Ardi Graph Database Comparison

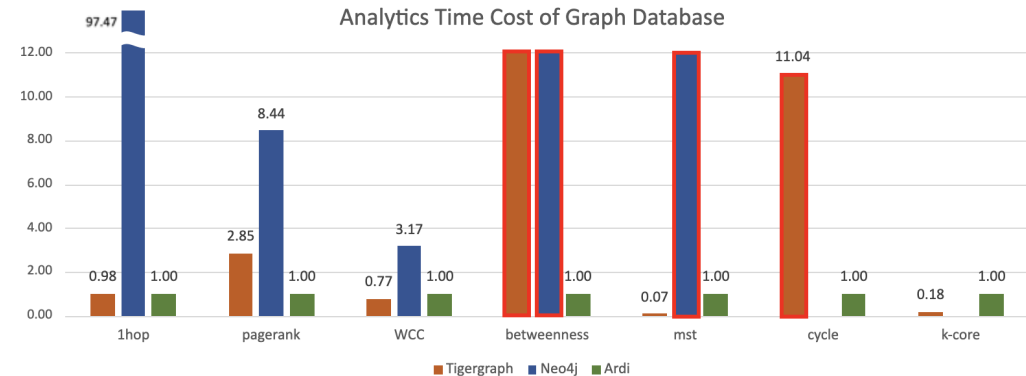
Performance Experiments on most graph functions common to Ardi, TigerGraph, and Neo4j

Performance experiment is conducted under following condition

Graph contains	Testing Environment
<ul style="list-style-type: none"> • 2.4M vertices • 67M edges 	<ul style="list-style-type: none"> • 32 cores CPU • 128GB RAM

	Ardi	Tigergraph	Neo4j	Tigergraph/Ardi	Neo4j/Ardi
1hop	0.0766	0.0748	7.466	0.98	97.47
PageRank	10.829	30.838	91.384	2.85	8.44
WCC	42.004	32.401	133.134	0.77	3.17
betweenness	101.482	>7200	>43200	>70.95	>425.69
MST	1163.563	76.655	>43200	0.07	>37.13
cycle	19.035	>210.152	N/A	>11.04	N/A
k-core	214.512	38.814	N/A	0.18	N/A

- Ardi database outperforms Neo4j, which possess highest market share of graph database in all cases, including 1-hop neighbor, PageRank, Betweenness Weakly-Connected-Component and Minimum-Spanning-Tree. Besides,
- Ardi is competitive with Tigergraph, who claims beating most other graph databases in computation speed. Ardi outperforms TigerGraph in PageRank, betweenness and cycle finding, while being slower in MST and k-core.
- Therefore, we are confident to say that Ardi database is quite competitive among graph databases in the market.



* Neo4j timed out without results after 43000 seconds, and Tigergraph resulted timeout after 7200 second execution on calculating betweenness

** Tigergraph resulted in memory fault after 210 seconds and did not finish the cycle finding yet.

*** Neo4j did not support cycle finding and k-core finding in its Graph Data Science (GDS) library

Ardi Graph Database Comparison

Supported Algorithm

	Ardi	Tigergraph	neo4j
egonet	0		
Centrality	[1] Betweenness [2] Closeness [3] eccentricity [4] peripheral vertex [5] is central vertex	[1] Betweenness [2] Closeness	[1] Betweenness [2] Closeness [3] Harmonic [4] Degree [5] Eigenvector [6] ArticleRank
Pagerank	0	0	0
K-Core	0	0	
(Weakly/ Strongly) Connected Co mponents	0	0 (wcc had been removed in version 3)	0
Louvain commu nities	0	0	0
Triangle counts	0	0	0
Cycle detection	0	0	

	Ardi	Tigergraph	neo4j
Cliques	0		
Local Clustering Coefficient	0		0
Maximal Independent Set		0	
Label Propagation			0
K-1 Coloring			0
Modularity Optimization			0
Heuristic estimate of graph diameter		0	
Spectral Clustering	0		
Entity Resolution	0	0	0

Ardi Graph Database Comparison

Supported Algorithm

	Ardi	Tigergraph	neo4j
Single-Source Shortest Paths	○	○	○
Yen's K-Shortest Paths			○
Shortest path between two vertices	○		○
All Pairs Shortest Path			○
A-star (an improved dijkstra algorithm)			○
Breadth First Search	○		○
Depth First Search			○
Random Walk			○
Minimum Spanning Tree (MST)	○	○	○
Minimum Spanning Forest (MSF)		○	

	Ardi	Tigergraph	neo4j
Link prediction	[1] number of common neighbors [2] jaccard similarity [3] jaccard similarity [4] salton index [5] leicht index [6] hub index [7] resource allocation index [8] number of all paths [9] shortest distance [10] katz distance [11] hitting time		[1] Adamic Adar [2] Common Neighbors [3] Preferential Attachment [4] Resource Allocation [5] Same Community [6] Total Neighbors
Similarity ranking	[1] Cosine Similarity	[1] Cosine Similarity [2] Jaccard Similarity	[1] Cosine Similarity [2] Jaccard Similarity [3] Pearson Similarity [4] Overlap Similarity [5] Euclidean Distance
k-Nearest Neighbor classification		○	○
Node embedding			[1] Node2Vec [2] GraphSAGE [3] Random Projection