

avuxeni

dumelang

sanibonani

molweni

hallo

lotjhani

sanibonani

molweni

avuxeni

hello

hello

hallo

ri a vusa

ri a vusa

avuxeni

lotjhani

molweni

dumelang

hallo

dumelang

avuxeni

ri a vusa

Agenda and Webinar format

David Gouvias

Data Scientist



Data Science Hackathon 2021

- Welcome. PW Janse van Rensburg
- Graph Database Journey. Derick Schmidt
- Introduction to Graph Databases. Monika du Toit
- Introduction to AWS and SageMaker. Preshen Goobiah
- Neptune Graph Database and Gremlin (David Gouvias)
- Data Science Graph Algorithms (Ockert Janse Van Rensburg, Dalubuhle Mbune)
- Hackathon Challenge (David Gouvias)
- Data definition and reference Graph Database Design. (David Gouvias)
- Judges, Prizes and final logistics.

Welcome

PW Janse van Rensburg

Manager: Data Science - Client Insights



Graph Database Journey

Derick Schmidt

Manager: Client Data Platform



Introduction to GraphDB and Capitec Data Science

Monica Du Toit

Data Scientist



Graphs everywhere

Relationships of highest priority

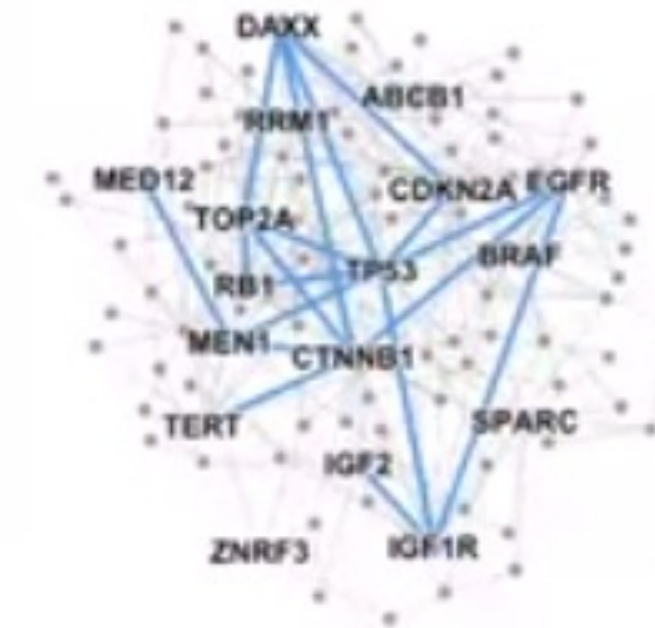


Event Graphs



Image credit: [SalientNetworks](#)

Computer Networks



Disease Pathways



Image credit: [Wikipedia](#)

Food Webs



Image credit: [Pinterest](#)

Particle Networks



Image credit: [visitlondon.com](#)

Underground Networks

Graphs everywhere

Relationships of highest priority



Image credit: [Medium](#)

Social Networks

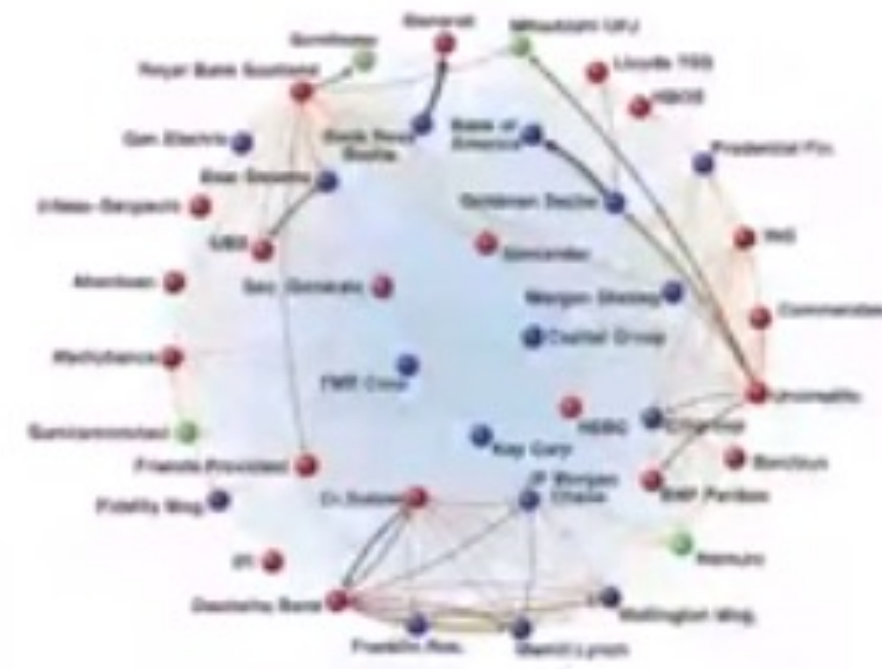


Image credit: [Science](#)

Economic Networks



Image credit: [Lumen Learning](#)

Communication Networks



Citation Networks



Image credit: [Missoula Current News](#)

Internet

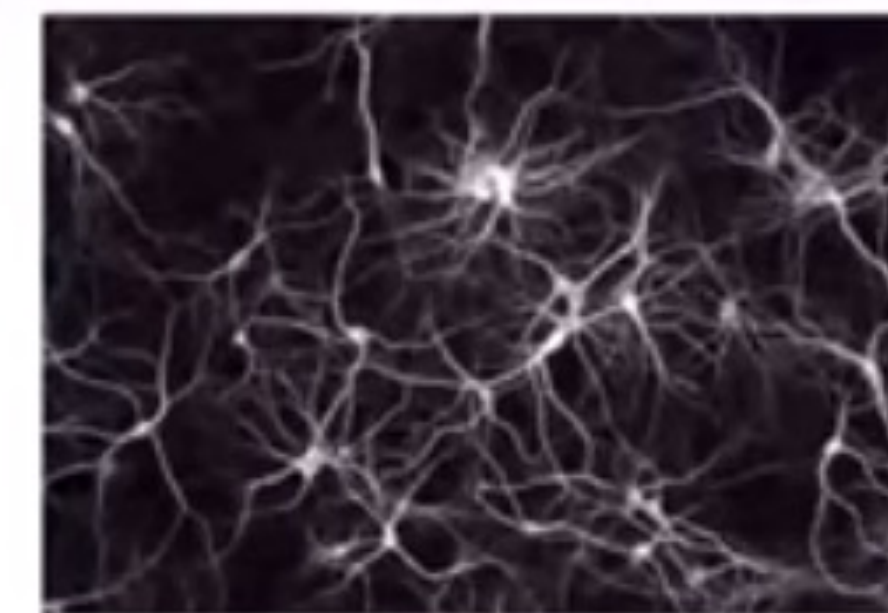


Image credit: [The Conversation](#)

Networks of Neurons

GraphDB

Relationships of highest priority

Leonard Euler

The Seven Bridges of Königsberg (1736) laid the foundations of graph theory. Euler proved that the problem has no solution.

Eulerian Path = a walk through the city that would cross each bridge/edge only once.

GraphDB are a general language for describing entities with relationships.

Nodes represent entities or other domain components.

Edges connect two nodes and represent relationships between entities.

Nodes and edges can contain properties that hold name-value pairs of data.



GraphDB

Use cases across the world – node level

50 year old Protein Folding problem

Predict a protein's 3D structure based solely on its amino acid sequence (DeepMind's AlphaFold)

Represent underlying protein as a graph, using graph neural network, predicting new position of the amino acids.

Study living things in new ways, enable quicker and more advanced drug discovery.

“Help to illuminate the function of the thousands of unsolved proteins in the human genome, and make sense of disease-causing gene variations that differ between people.”

NEWS | 30 November 2020

‘It will change everything’: DeepMind’s AI makes gigantic leap in solving protein structures



T1037 / 6vr4
90.7 GDT

(RNA polymerase domain)



T1049 / 6y4f
93.3 GDT

(adhesin tip)

● Experimental result
● Computational prediction

GraphDB

Use cases across the world – edge level

Recommender Systems

Nodes: users and items; Edges: user-item interactions

Recommend items users might like (watching movies, purchasing products, listening to music, etc)

Use graph neural network to predict clients' interests by considering relationships between clients and relationships between clients and their past interests.

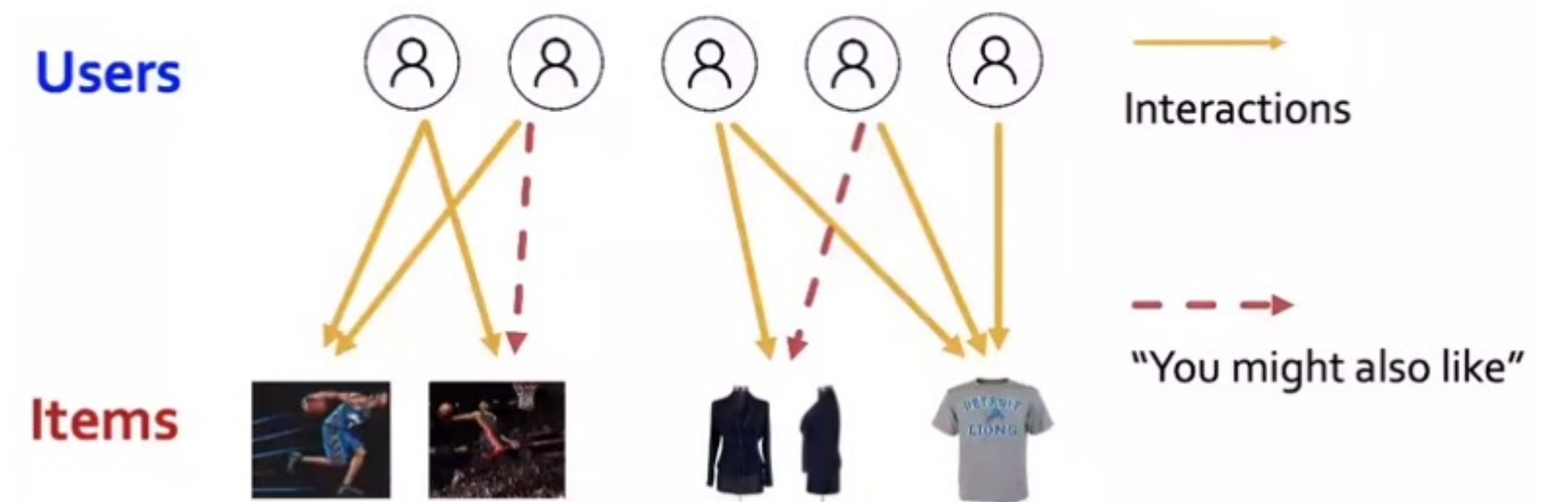
“Existing research has shown the efficacy of graph learning methods for recommendation tasks.”

Pinterest, LinkedIn, Facebook, Instagram, Alibaba, Netflix.

<https://eng.uber.com/uber-eats-graph-learning/>



NETFLIX





Google Maps



GraphDB

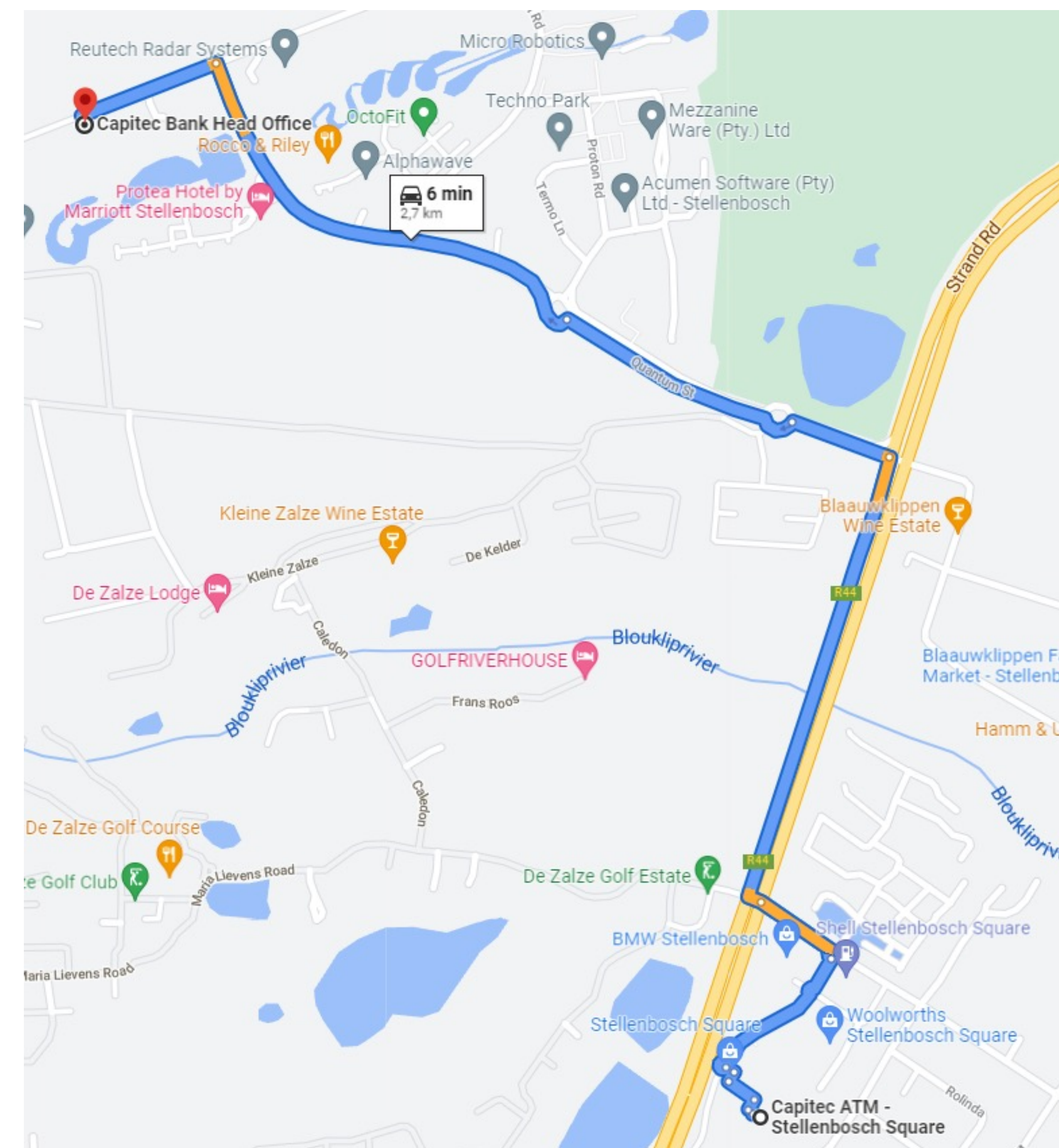
Use cases across the world – subgraph-level

Traffic prediction

Graph Neural Network approach based on collisions, traffic patterns trained and roads quality to find shortest path and predict travel time.

Nodes: road segments; Edges: connectivity between road segments

“Each day more than 1 billion km of road are driven with the app’s help. Google says using DeepMind’s AI tools have improved the accuracy of ETAs in Maps by up to 50 percent.”



Capitec

20 years old

- 16.8mil clients
- 8.9mil active retail digital banking clients – biggest digital bank in SA
- 623 mil digital transactions last 6m
- Open GlobalOne account remotely



We Believe That Banking is About People

Our Fundamentals:

- Simplicity, Affordability, Accessibility, Personalized experience

New products:

Live Better Savings Account; Financial Education; Virtual Card; Scan to Pay; EasyEquities; Remote Credit; Business Bank



simplify banking,
live better



all Capitec clients
get cash back at
Dis-Chem



Capitec

Data Science team, est. 2017



Self-driving Credit



Client Engagement



AML



Innovation / Optimisation



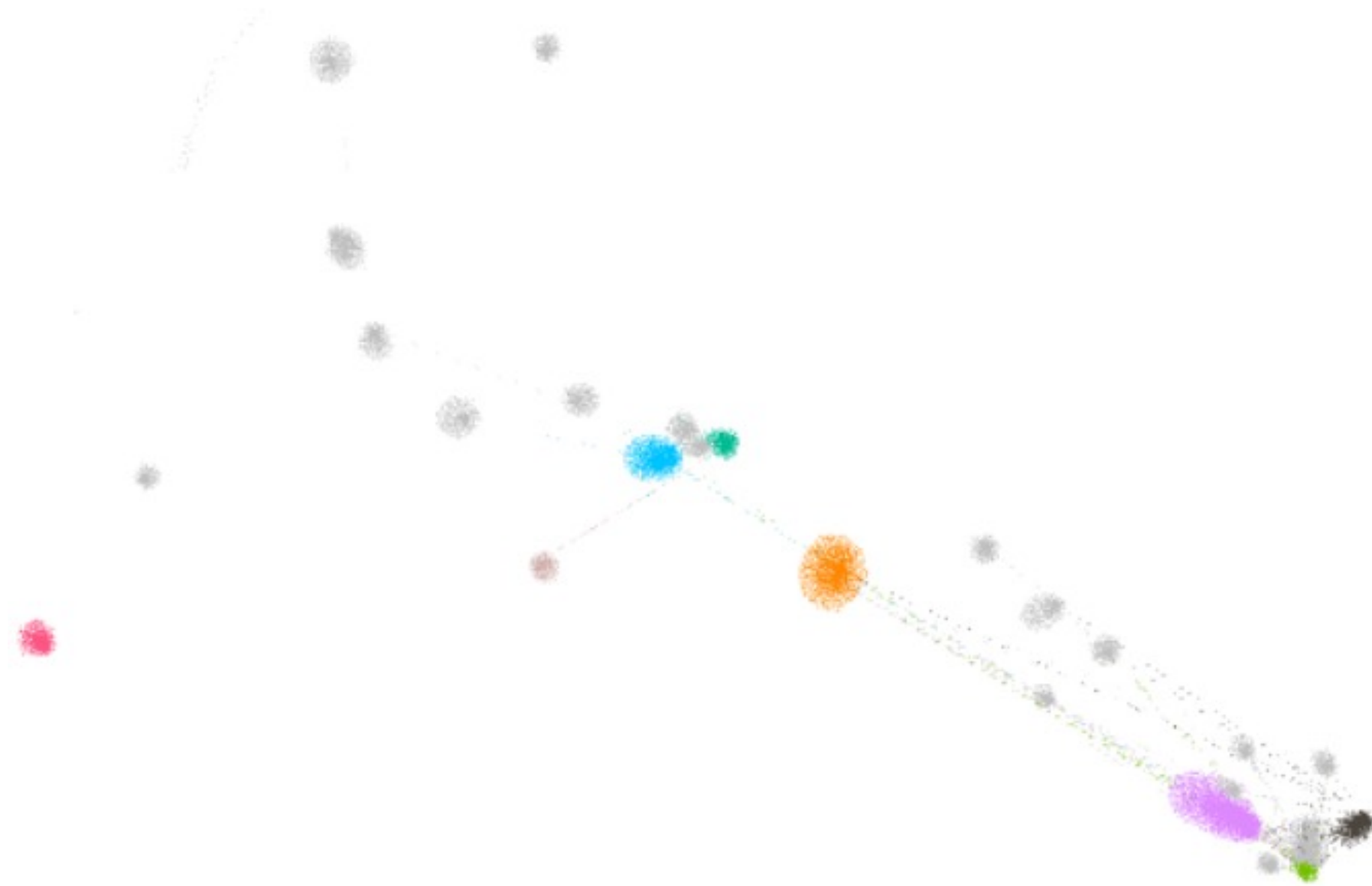
1. **People matter:** Data science will always impact people's lives
2. **Truth matters:** Keep searching
3. **Knowledge matters:** Keep learning
4. **Individual knowledge is limited:** Keep collaborating
5. **You matter:** Respect differences



Capitec GraphML

Use cases

1. Identify likely merchant clients and convert to Business Bank clients.
2. Suggest potential new clients for existing business clients.
3. Identify fraudulent activity on client's accounts.
4. Recommend most relevant product based on client's need.
5. Discover Capitec client communities from social media data.



thank you
any questions?

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Cloud Computing and AWS

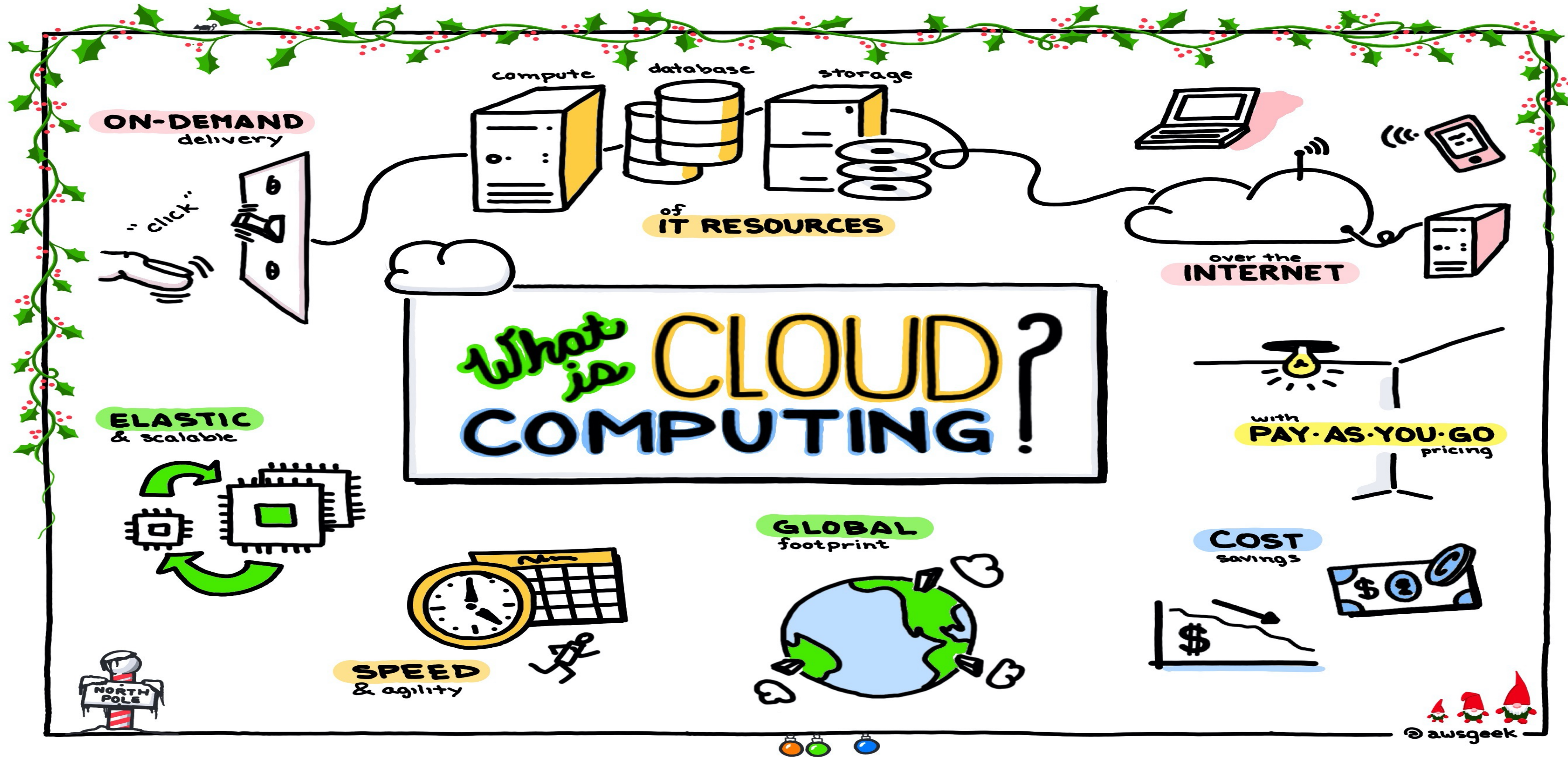
Preshen Goobiah

Machine Learning Engineer

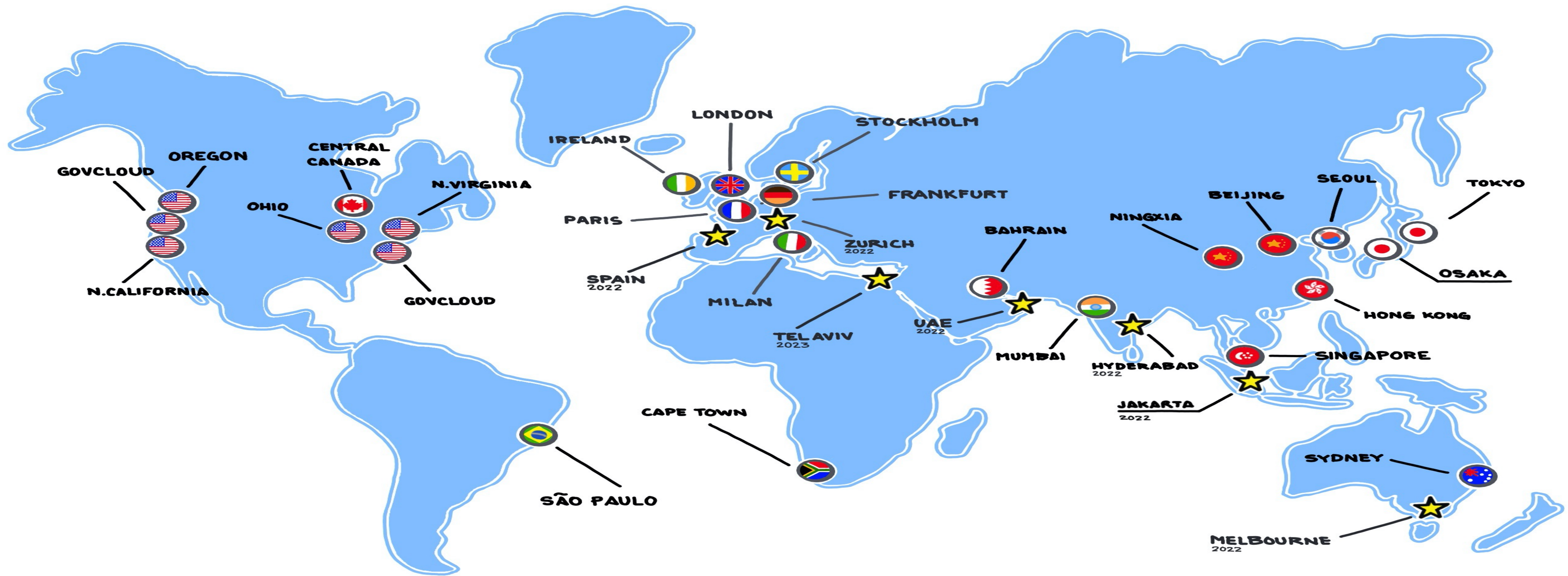


CAPITEC

What is Cloud Computing and AWS



AWS Global Infrastructure



AWS REGIONS

[@awsgeek](#)
14 JUN 21



AWS Service Landscape

IoT

Customer Engagement

AR & VR

Analytics

Robotics

Migration & Transfer

Compute

Business Applications

Application Integration

Media Services

Blockchain

Network & Content Delivery

Storage

Game Development

Security & Compliance

Machine Learning

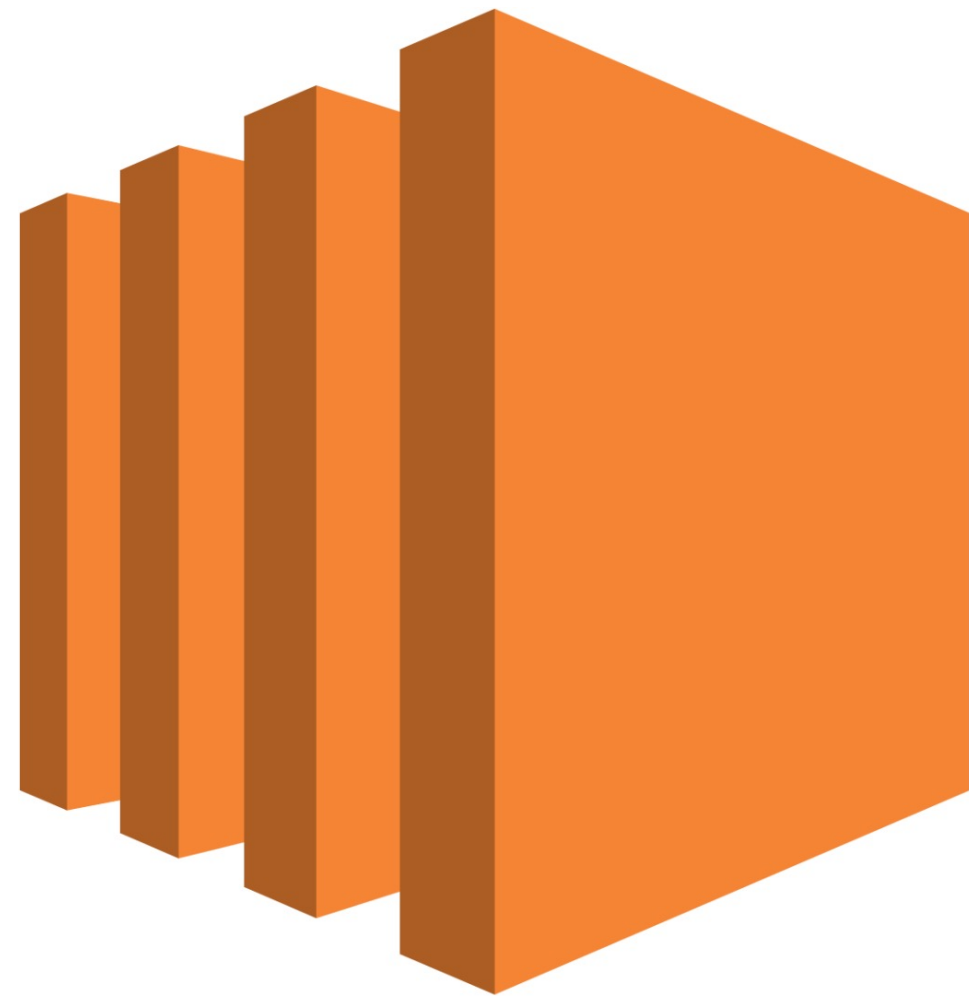
Satellite

Mobile

Developer Tools

Databases

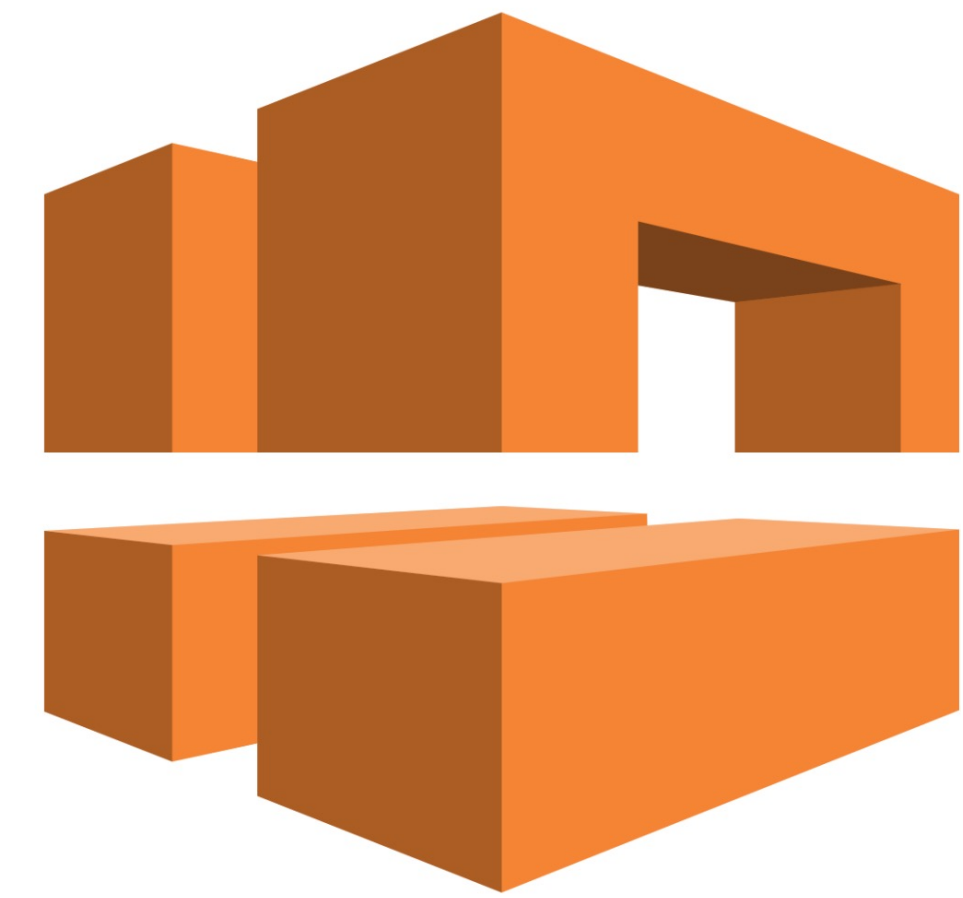
AWS Core Services



EC2



S3

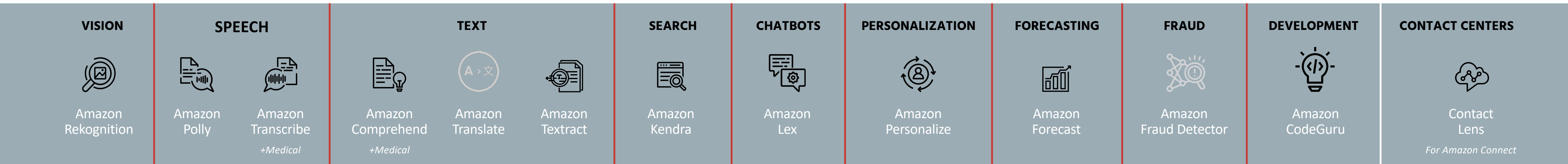


VPC

The AWS ML stack

Platform vs Application services

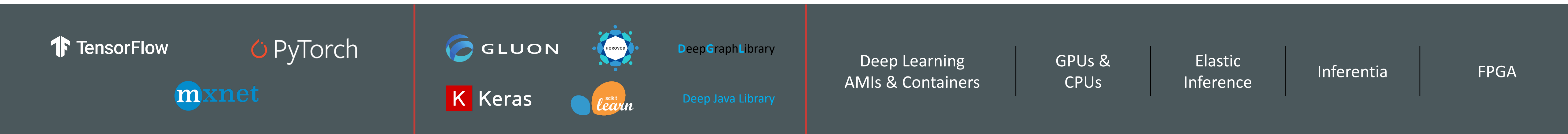
AI SERVICES



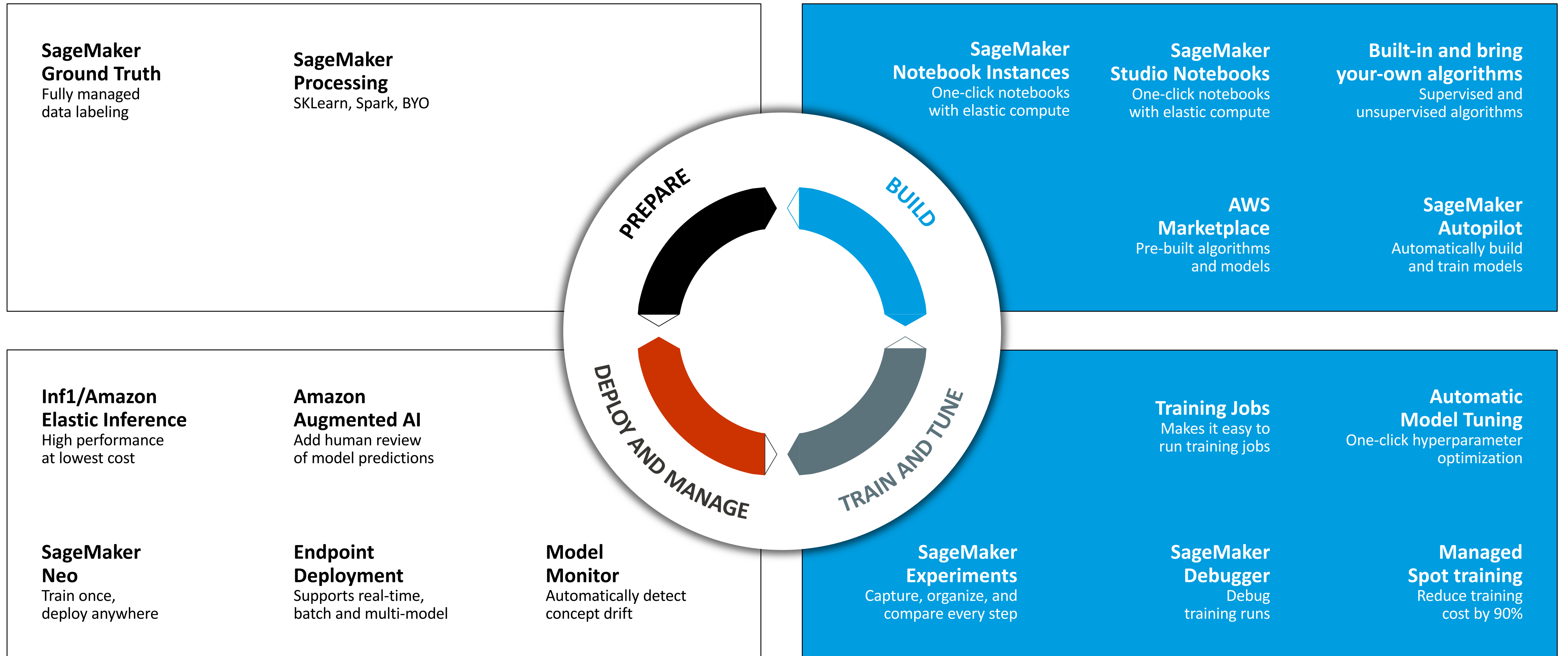
ML SERVICES



ML FRAMEWORKS & INFRASTRUCTURE



Amazon SageMaker features overview

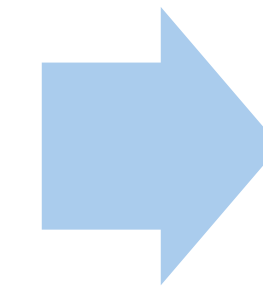
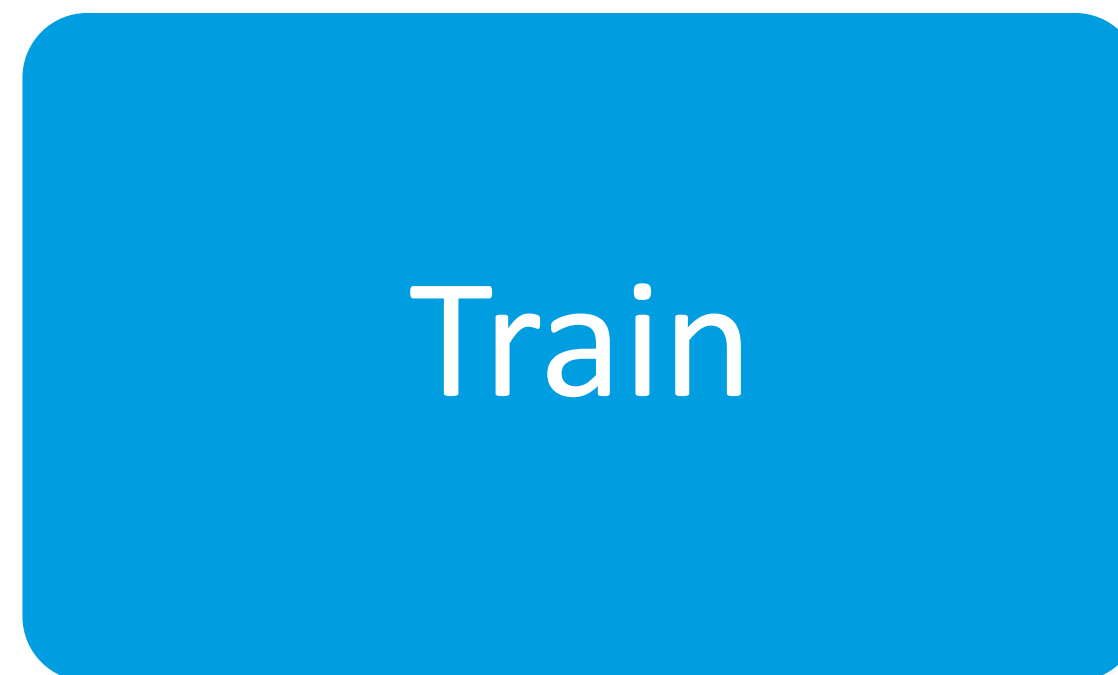
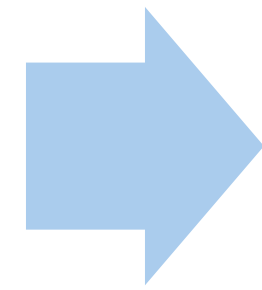
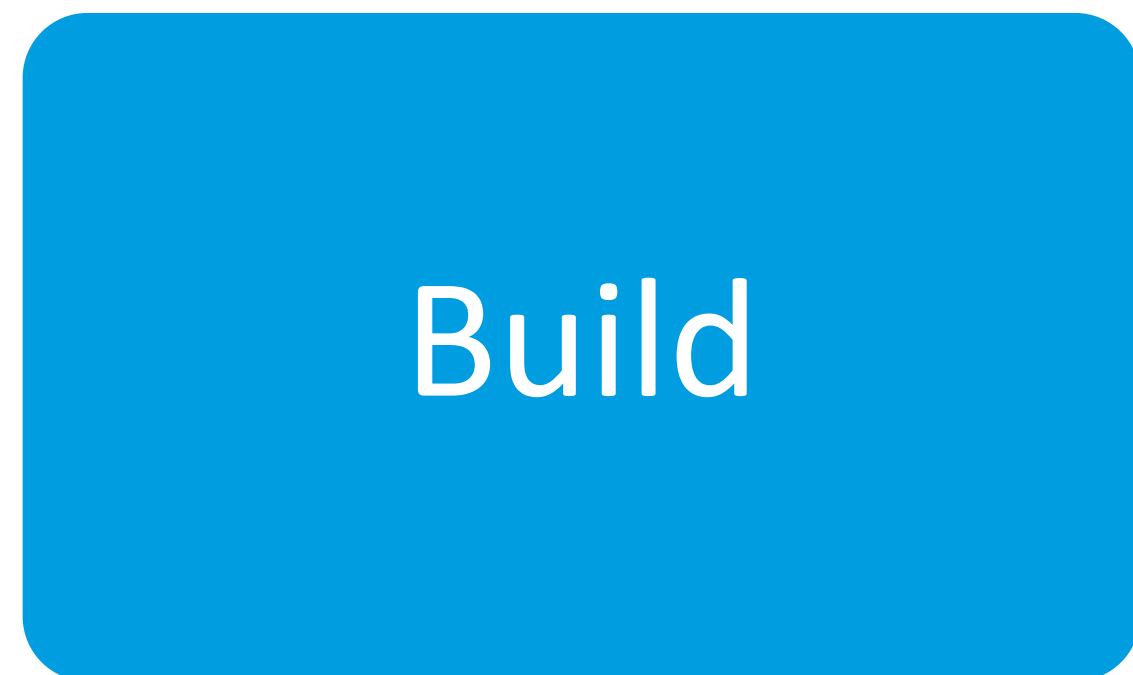


SageMaker Core Components

Notebook Instances

Training Jobs

Real-time Endpoints



SageMaker Notebook Instances



Explore



The "Explore" section contains a large, 3D-rendered orange hard hat with a white chin strap, set against a light grey background. To the right of the hard hat is a grid of 15 small thumbnail images, each representing a different chart type. The thumbnails are arranged in three rows and five columns. The first row includes: Multi-level Donut Chart, Angular Gauge, Dot Plot, Pie Chart, and Sociogram. The second row includes: Proportional Area Chart (Circle), Waterfall Chart, Phase Diagram, Cycle Diagram, and Population Pyramid. The third row includes: Boxplot, Three-dimensional Stream Graph, Semi Circle Donut Chart, Topographic Map, and Radar Diagram.

Built-in Kernels



Interact



Boto 3



Amazon SageMaker

SageMaker Python SDK

thank you
any questions?

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Amazon Neptune and Gremlin

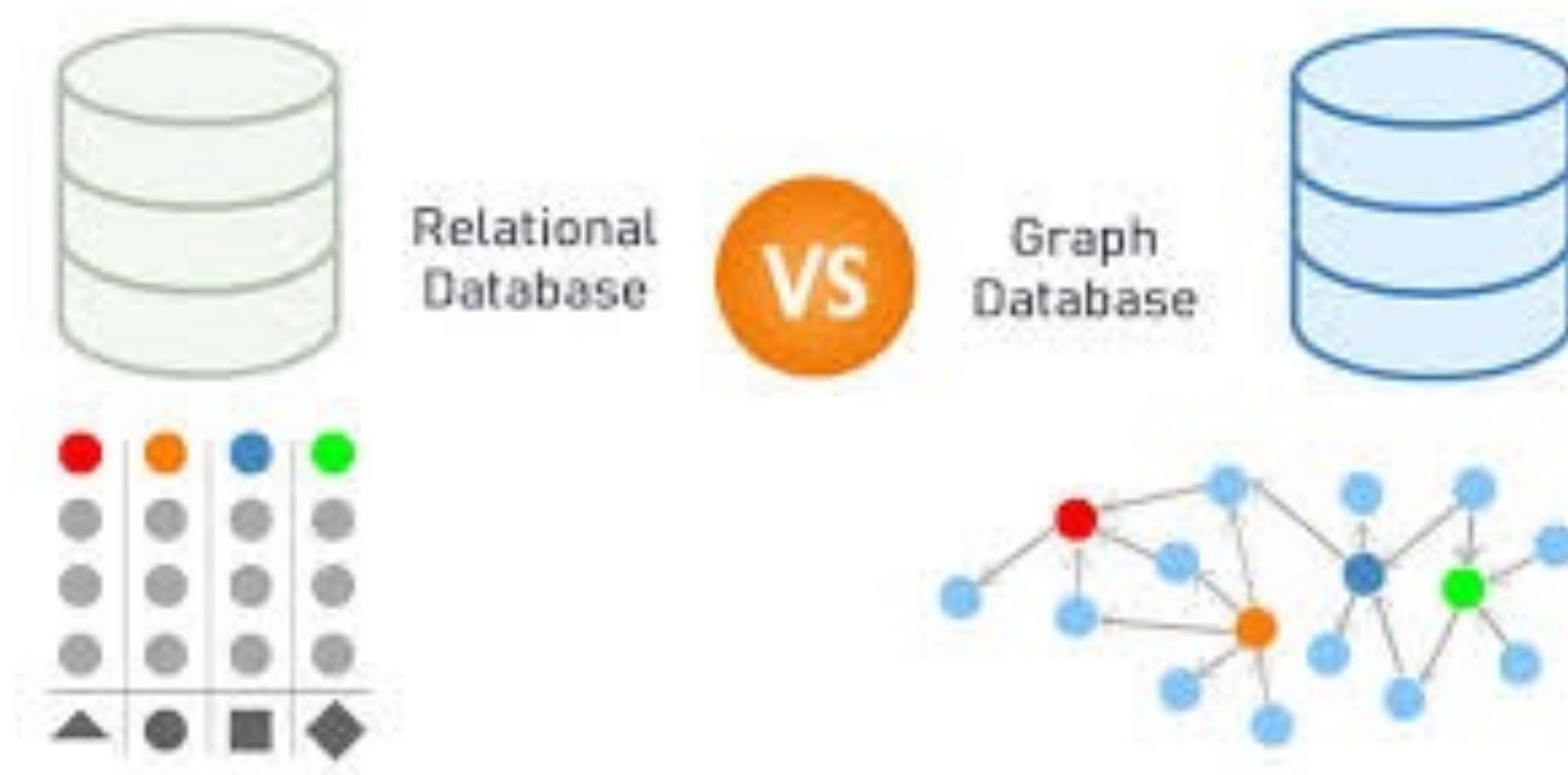
David Gouvias

Data Scientist



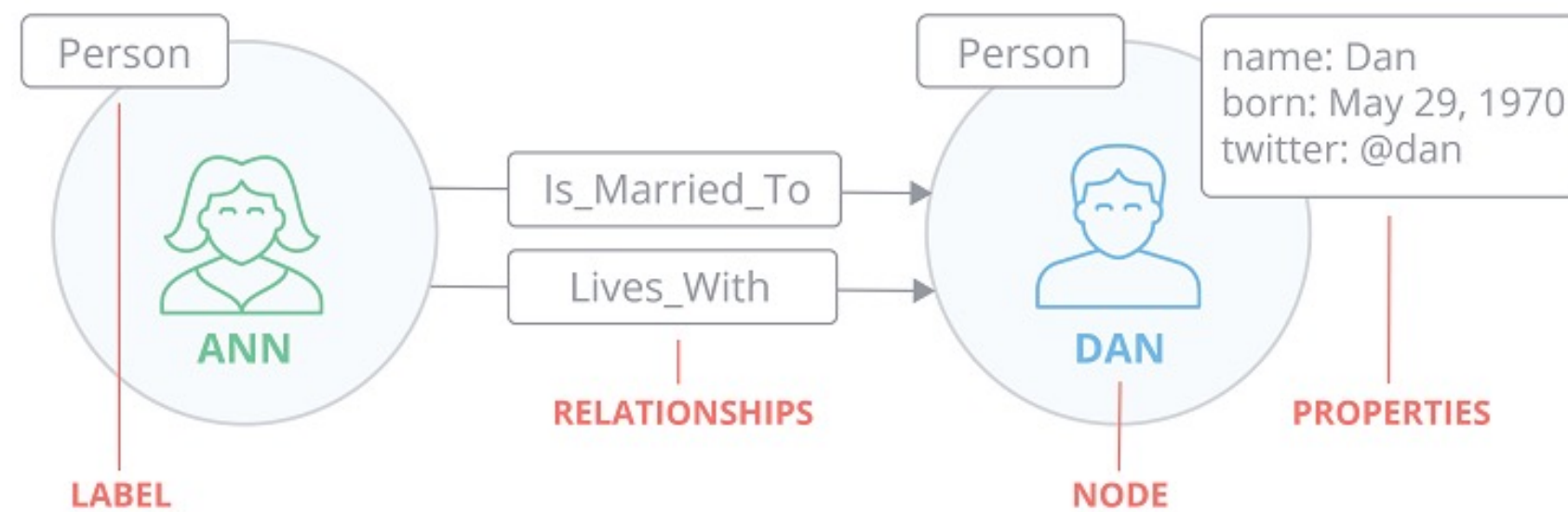
Amazon Neptune

- Purpose-built, high-performance graph database engine
- Optimized for storing billions of relationships
- Querying graphs with milliseconds latency
- Fully-managed (no hardware provisioning, software patching, setup)
- Supports graph model property graph and Resource Description Framework (RDF)
- Supports query languages Apache, TinkerPop, Gremlin and SPARQL



Gremlin - Graph Traversal Language

- Allows one to express complex queries that are not feasible and efficient in SQL.
- Many business problem solutions can be modeled as graph queries, including fraud typology detection.



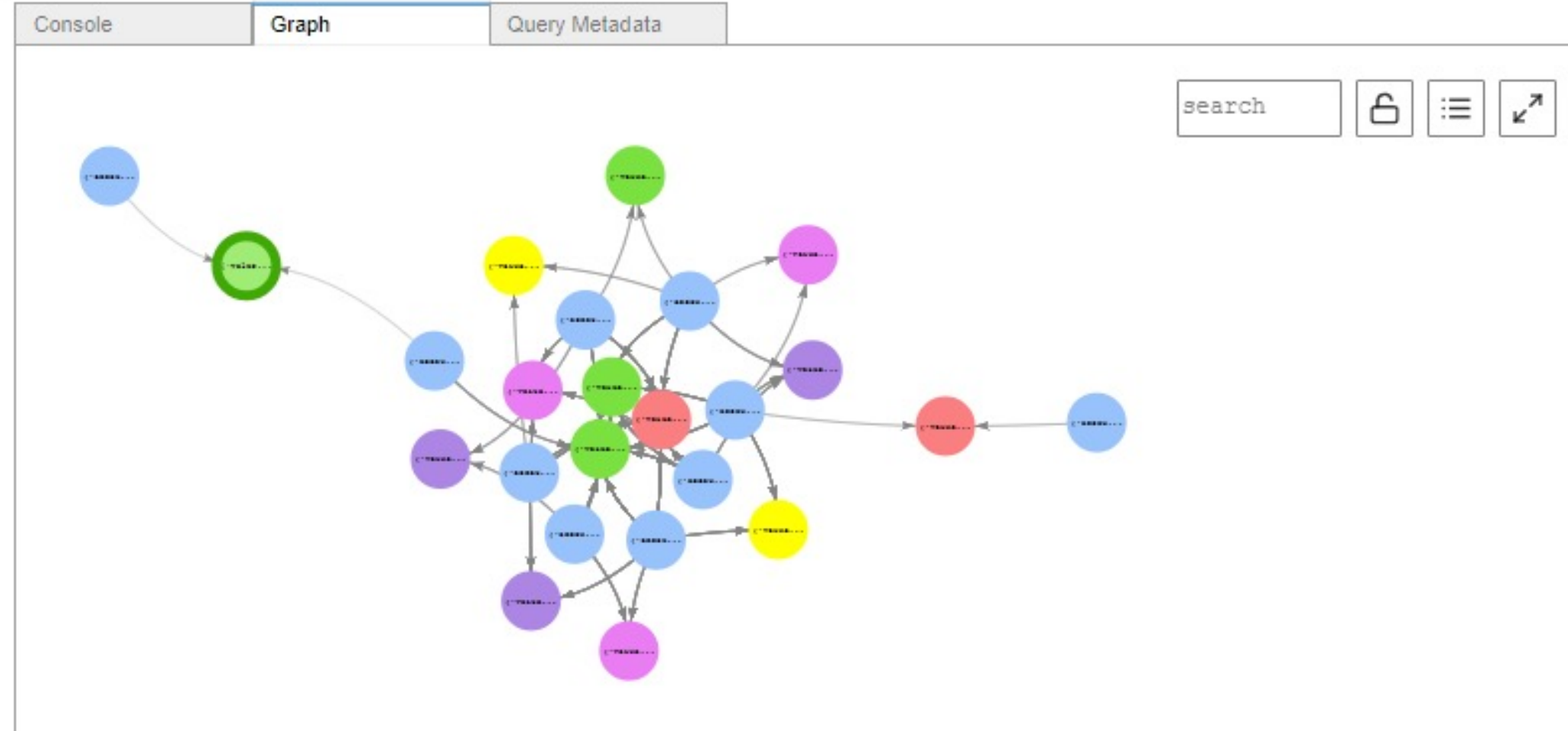
Property Graph

Extended fraud ring

We can extend the scope of the previous to find linked accounts two hops from the starting account. The size and complexity of this account network is suggestive of a fraud ring:

```
In [1]: %%gremlin -g type -p v,inV,outV,inV,outV
```

```
g.V('account-4398046519460').  
  emit().  
  repeat(  
    in('FEATURE_OF_ACCOUNT').  
    out('FEATURE_OF_ACCOUNT').  
    simplePath()  
  ).times(2).  
  path().  
  by(  
    project('type', 'value').  
    by(label).  
    by(valueMap('account_number', 'value'))  
  )  
)
```



thank you
any questions?

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Graph Algorithms

Ockert Janse Van Rensburg

Data Scientist



Graph Algorithms

Extracting value from Graph Databases



Community Detection

Detects group clustering or partition options



Centrality (Importance)

Determines the importance of distinct nodes in the network



Similarity

Evaluates how alike nodes are



Heuristic Link Prediction

Estimates the likelihood of nodes forming a relationship



Pathfinding & Search

Finds optimal paths; evaluates route availability, quality



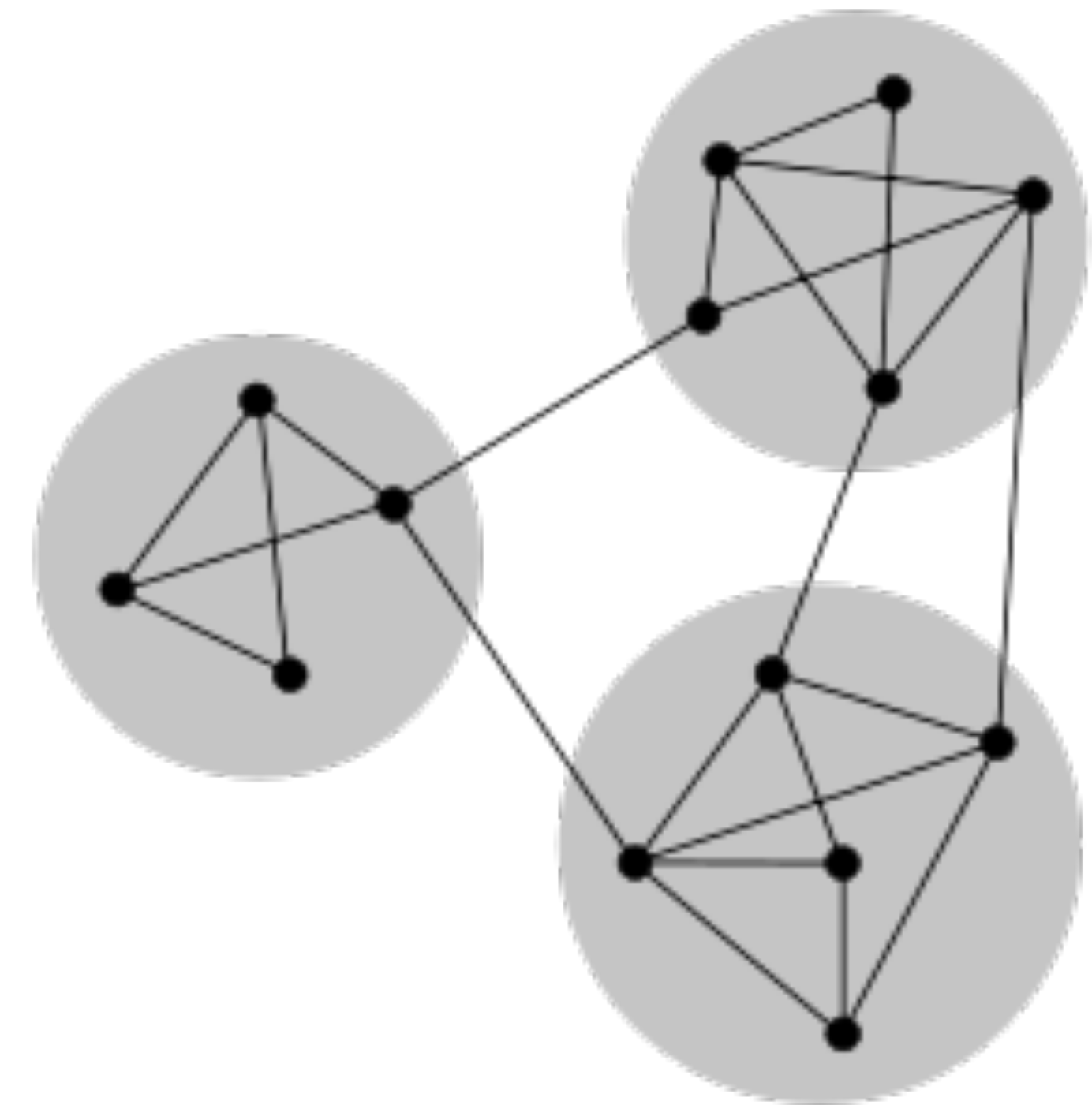
Node Embedding

Learns graph topology to reduce dimensionality for machine learning

Community Detection

Finding meaningful groups in complex phenomena

- What is a community?
 - **group, cluster, cohesive subgroup, module**
- Break up the network into **modular groups** where the edges within group are of higher density, than those of the other groups
- Multiple types of community detection algorithms (overlapping vs non-overlapping)
- The **Louvain method** commonly used due to its scaling properties
- More information on installing this method will be made available in the info pack to be distributed



Non-overlapping communities. Communities represented by the circles.

Graph Algorithms

Dalubuhle Mbune

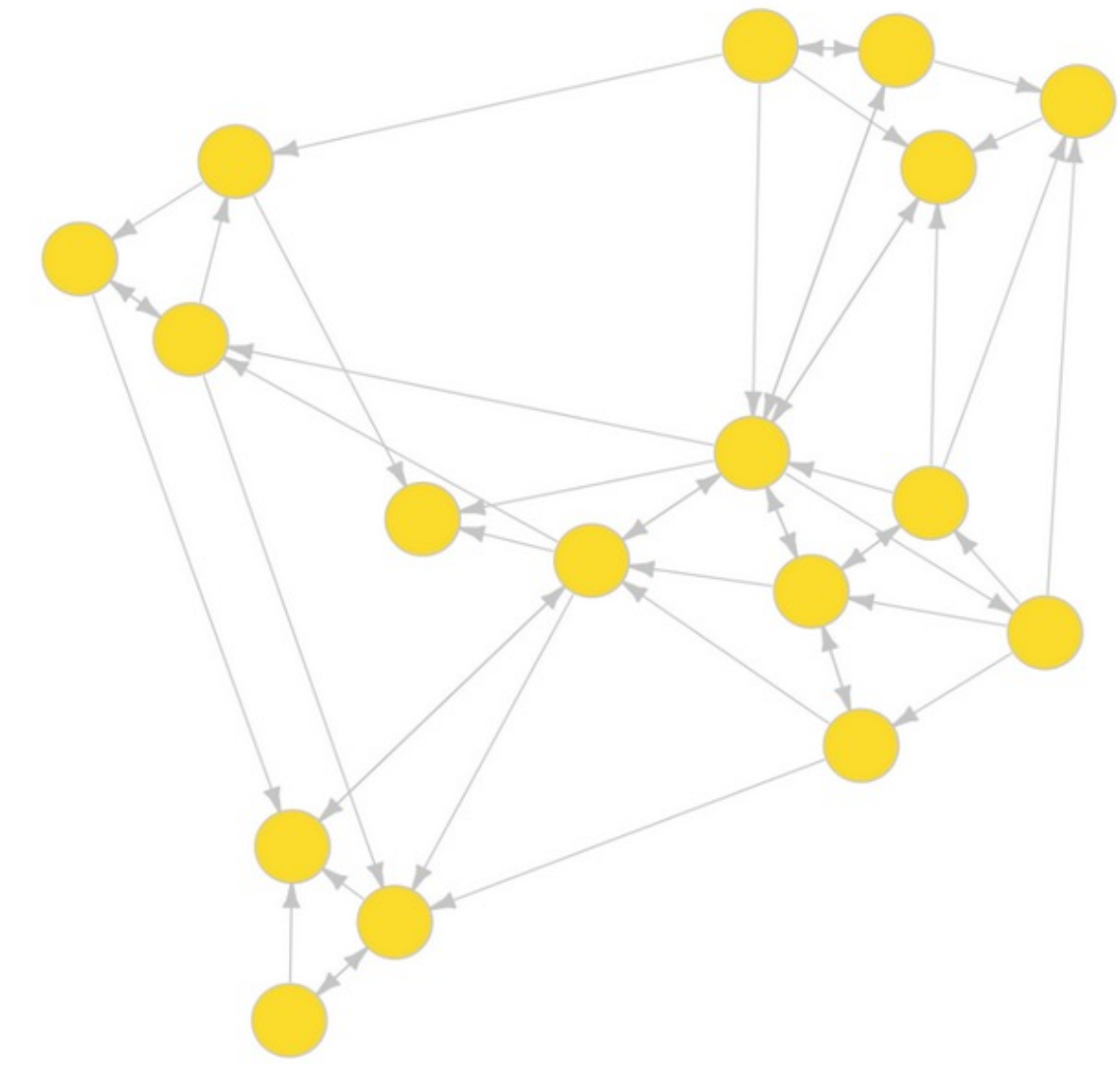
Data Scientist



Graph Algorithms

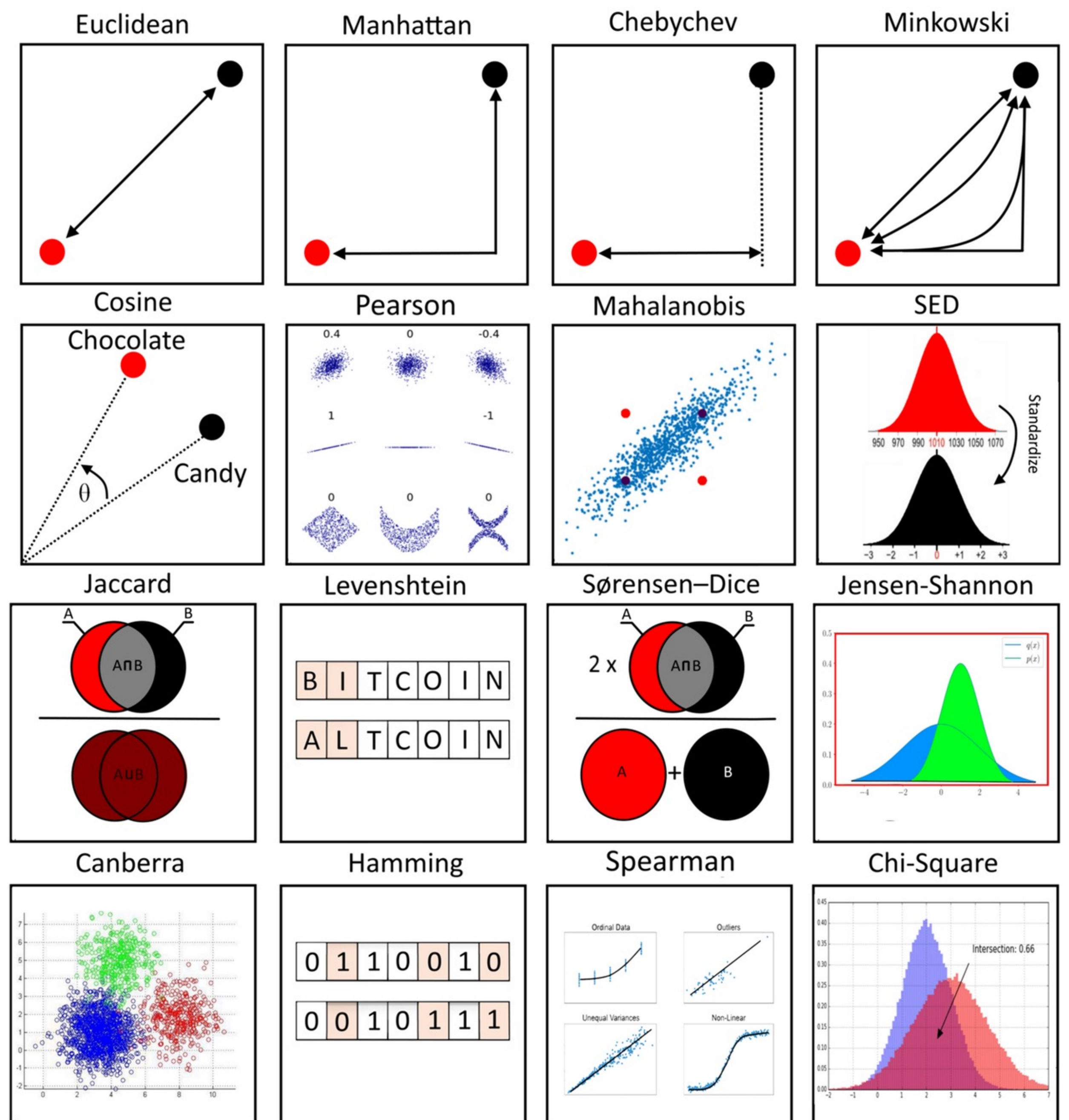
Similarity Algorithms

- The similarity measure is a way of measuring how nodes are related or close to each other.
- Calculations are performed on vector representations of objects. Each object must first be converted to a numeric vector.
- Similarity/distance is calculated between a single pair of nodes at a time.
- There are numerous similarity algorithms
- Regardless of the algorithm, feature selection will have a huge impact on your results.



Similarity Algorithms

- Distance measures are the fundamental principle for classification
- The choice of distance measure plays a crucial role in the similarity algorithm's performance

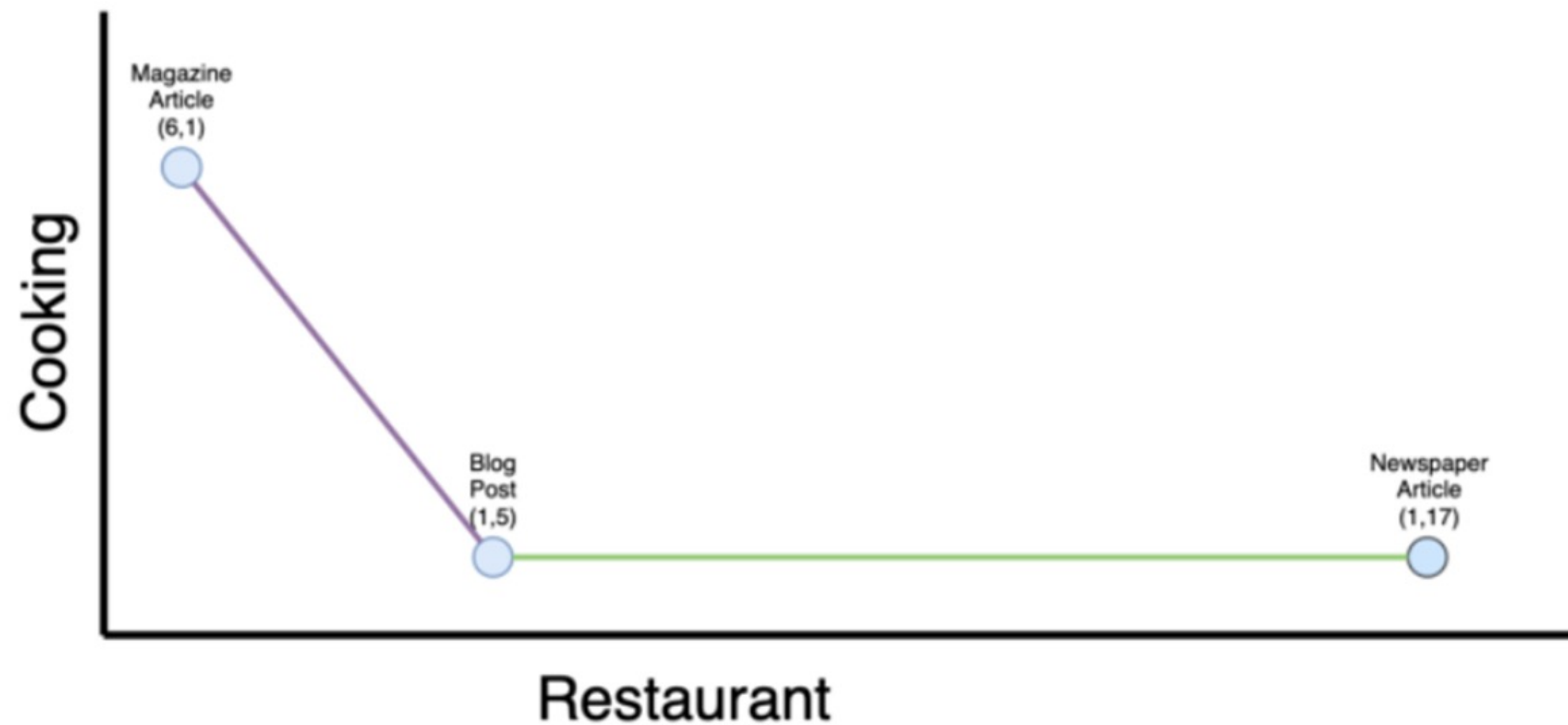


EXAMPLE

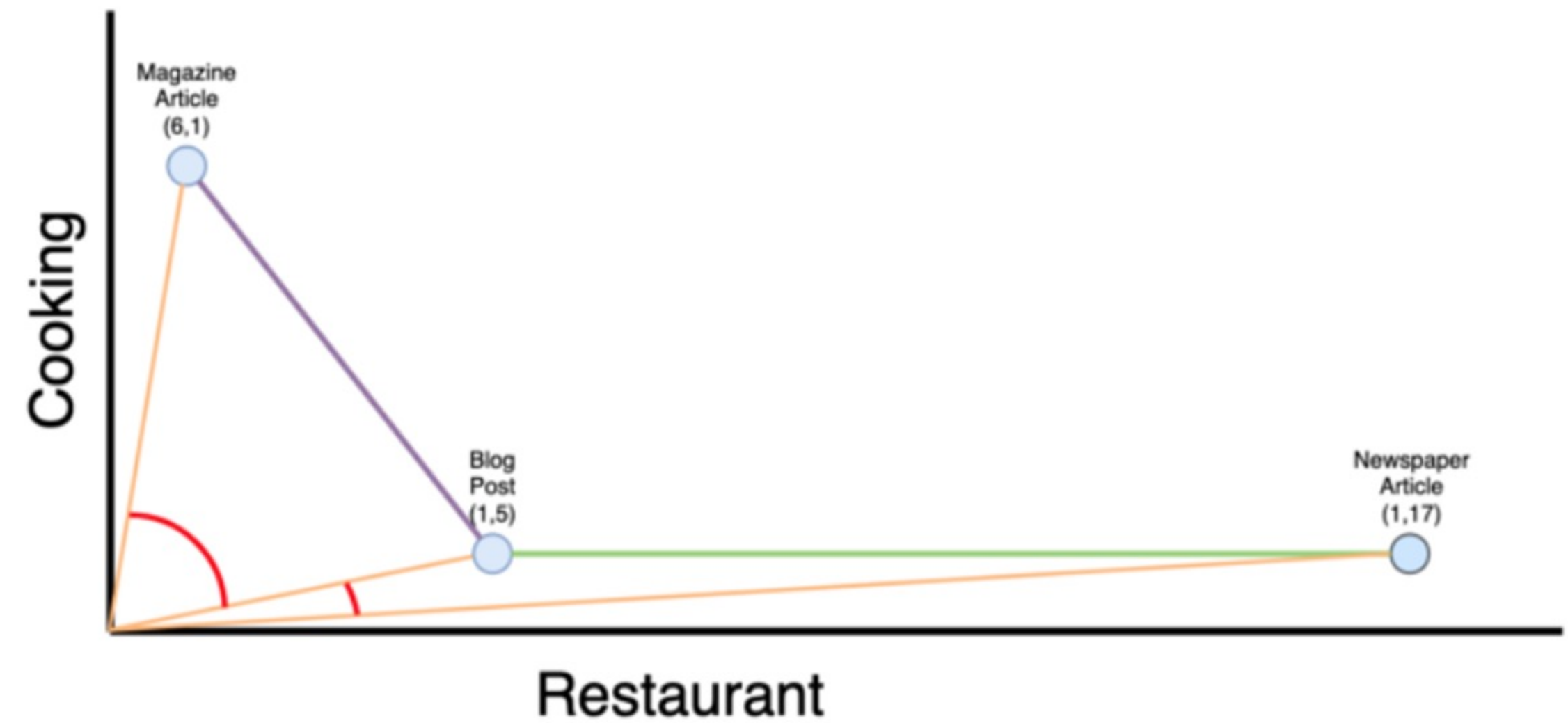
Euclidean and Cosine Similarity for Document Comparison

- Suppose we want to compare how frequent the words 'Restaurant' and 'Cooking' (Features) appear on a Blog Post, Newspaper Article, and Magazine Article.

Euclidean Similarity



Cosine Similarity



- In the above Example, we compare 3 documents based on how many times they contain the words “cooking” and “restaurant”.
- Euclidean distance tells us the blog and magazine are more similar than the blog and newspaper. But that’s misleading.
- The blog and newspaper could have similar content but are distant in a Euclidean sense because the newspaper is longer and contains more words.
- In reality, they both mention “restaurant” more than “cooking” and are probably more similar to each other than not. Cosine similarity doesn’t fall into this trap.

thank you
any questions?

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Hackathon Challenge

David Gouvias

Data Scientist

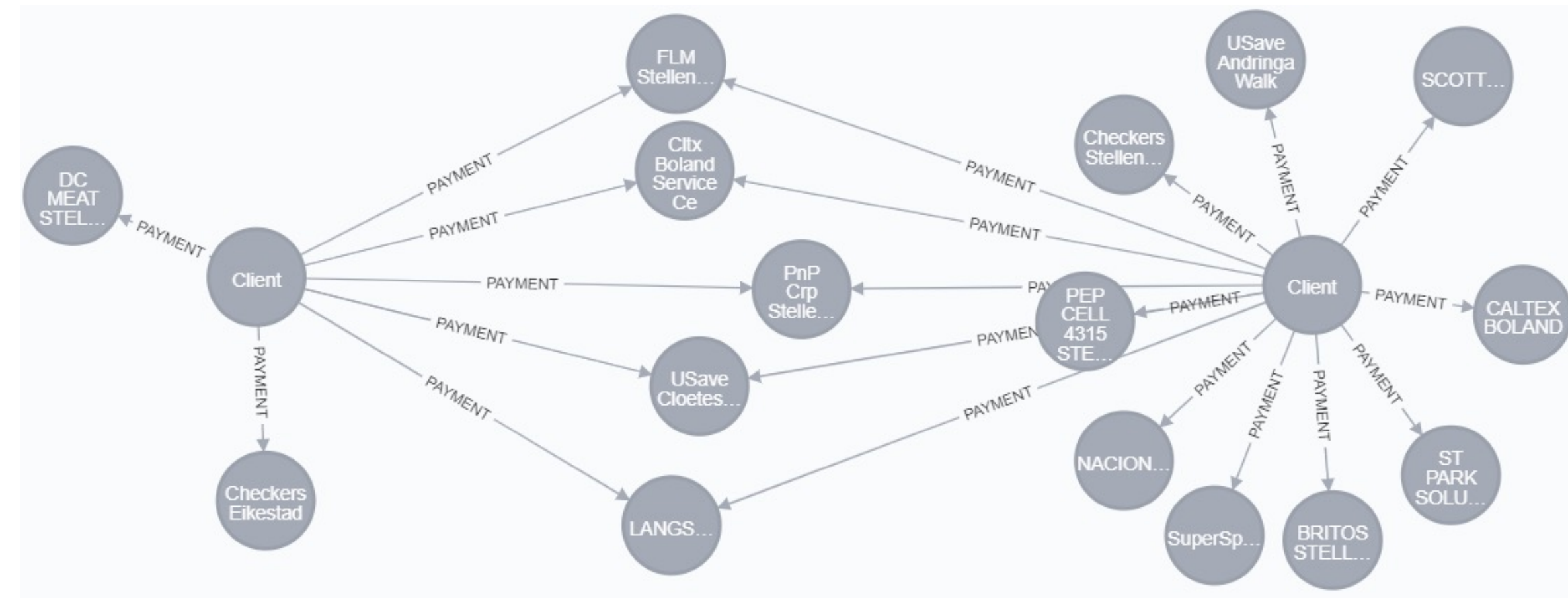


Hackathon Challenge

Client – Merchant network

Your challenge is to use our AWS Neptune Graph Database and apply data science algorithms or graph queries to enrich the dataset through :

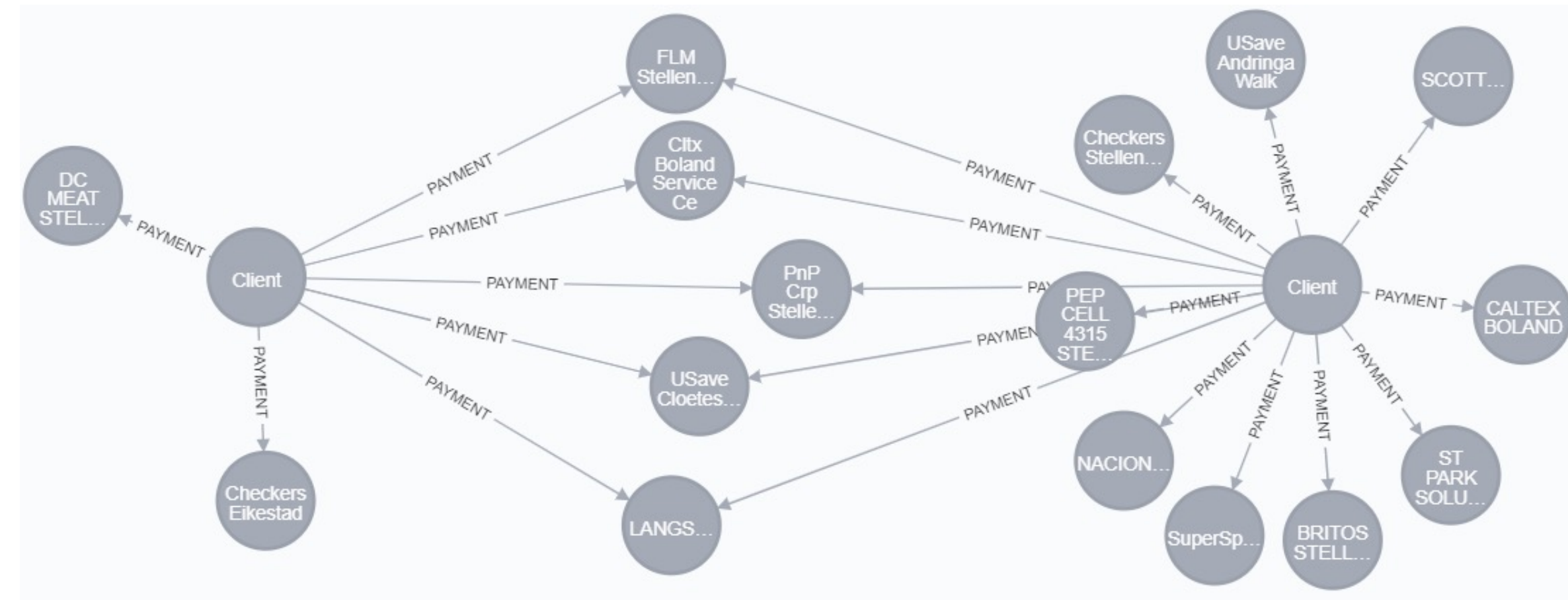
- Identifying community clusters (people with same shopping and movement patterns),
- Identifying Commuters, travellers, contract workers or traveling salesmen.
- Telling a story at scale of the client communities.
- Identifying fraudulent behaviour.
- Define your own problem you wish to solve.



Hackathon Challenge

Business Ideas

- Funeral cover recommender : Recommend which clients are likely to take out a funeral policy.
- Store Finder : Recommend a list of stores in a particular category for a customer need, e.g. Pharmacy.
- Merchant Assisted Marketing: Find a list of new customers that are likely to shop at a particular merchant.



thank you
any questions?

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Data Model

Client Information

	Client_UID	Age_Band
	0xE3E097DC79D8161B2A2448F6C0930A8B081CD013	Band 10: 46 To 50
	0xBE461A0CD1FDA052A69C3FD94F8CF5F6F86AFA34	Band 9: 41 To 45
	0xE2154FEA5DA2DD0D1732FF30931723C2973003A0	Band 9: 41 To 45
	0x4A0E88CF529FBBDC2C0A995BBE88A0A86212ED8D	Band 11: 51 To 55
	0xCFA2ED2AAC6D61F44CA9CBA73E1E8946B7CD7D22	Band 11: 51 To 55

Merchant Information

Merchant_UID	Merchant_Name	Merchant_Type	Merchant_Type_Desc	Merchant_Category
0x8E6A682F75803D8F8090F99FBC303455489109D3	Clicks Somerset Mall CPT ZA	5912	Drug Stores and Pharmacies	All Other Merchants/U.S. Post Exchange OR Card...
0x93003523E22D055C5CC080807FCEB0FA7E0D67C5	Game Cape Gate Cape Town ZA	5311	Department Stores	All Other Merchants/U.S. Post Exchange OR Card...
0x2711A1A5DC6A4783B17D60E7444FA2AF2386305A	LINKS SERVICE STATION SOMERSET WEST ZA	5541	Service Stations (with or without Ancillary Se...	All Other Merchants/U.S. Post Exchange OR Card...
0xEE999A1F8C76D2541ABFCB524709066D5B585AB	STEERS - CANAL WALK CENTURY CITY ZA	5814	Fast Food Restaurants	Restaurant
0xF40F5991406F281D684EEF2473692750573D1A95	SCOTTYS MIDAS STELLENBOSCH ZA	5511	Automobile and Truck Dealers: Sales, Service, ...	All Other Merchants/U.S. Post Exchange OR Card...

Data Model

Payments

Src_Client	Trg_Client	Tran_Date_Key	Amt_Trans	Num_Trans
0xA08170480197FFB2CCCA2671C63D7F9DD440DACD	0x0D80273C48EA052178805C8E0BAF5D99E2055A0F	11666	2650	1
0x97433A955B75A559C81E84E3BA9D1C3E75F6A1A7	0x0D01084F4C11AE10513480F1CF60271B8F1048CE	11580	145	1
0x5538DE60D60A00EC0A5CE8FC70D9431D3AB171D2	0x7BBAC91F5D41B0FDF9B3AE36FB417690C2024C63	11643	4400	2
0x0B4A6DC422CED9A7AF2B07867B91EE2B572CA451	0x867B6E1D45F7DCCE3B08AB67F85F298CB3F287E5	11638	500	2
0xC65CB7AD4C7F0C3560B1A1C953CB7664746DCC06	0x88A70DBF116D4DDF50BFB9962FEB2041C3A57BBA	11646	500	1

Purchases

Src_Client	Trg_Merchant	Tran_Date_Key	Amt_Trans	Num_Trans
0xDCD429E847183D910DBFBCB5A37214C2FAF4ACD5	0x5979712AC3DB16655C062AE7DEEB98A12106D4BB	11621		74
0x5D122FAFEDDCEFC8C4DBD9995EE058E0731BF712	0x1211AD3B70DC1FF4180AA6F46D3F72C0EBF9655E	11596		260
0x397A2F5AFE5F8A28D6F12F5B1757AC14E7367046	0x1211AD3B70DC1FF4180AA6F46D3F72C0EBF9655E	11637		342
0x39F8191CFA084AF00F9B530D900F9F34E3846904	0x1211AD3B70DC1FF4180AA6F46D3F72C0EBF9655E	11580		230
0x5A4001305F3A5A121A108A146AB96A67B5BC0D05	0x5979712AC3DB16655C062AE7DEEB98A12106D4BB	11627		696.5

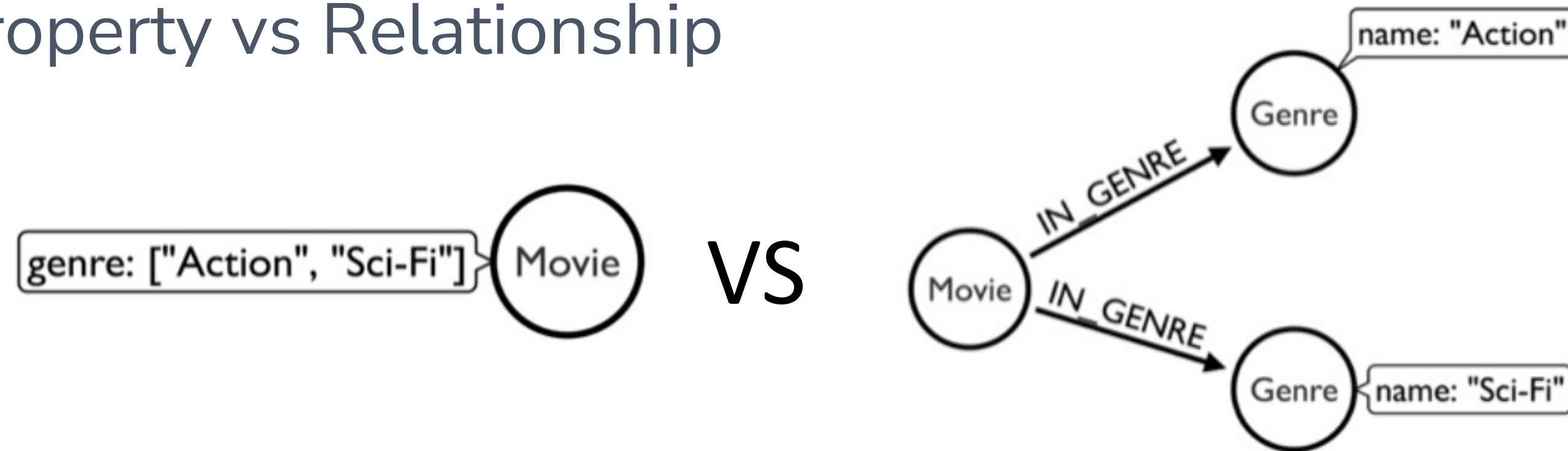
Data Model

Funeral Policy

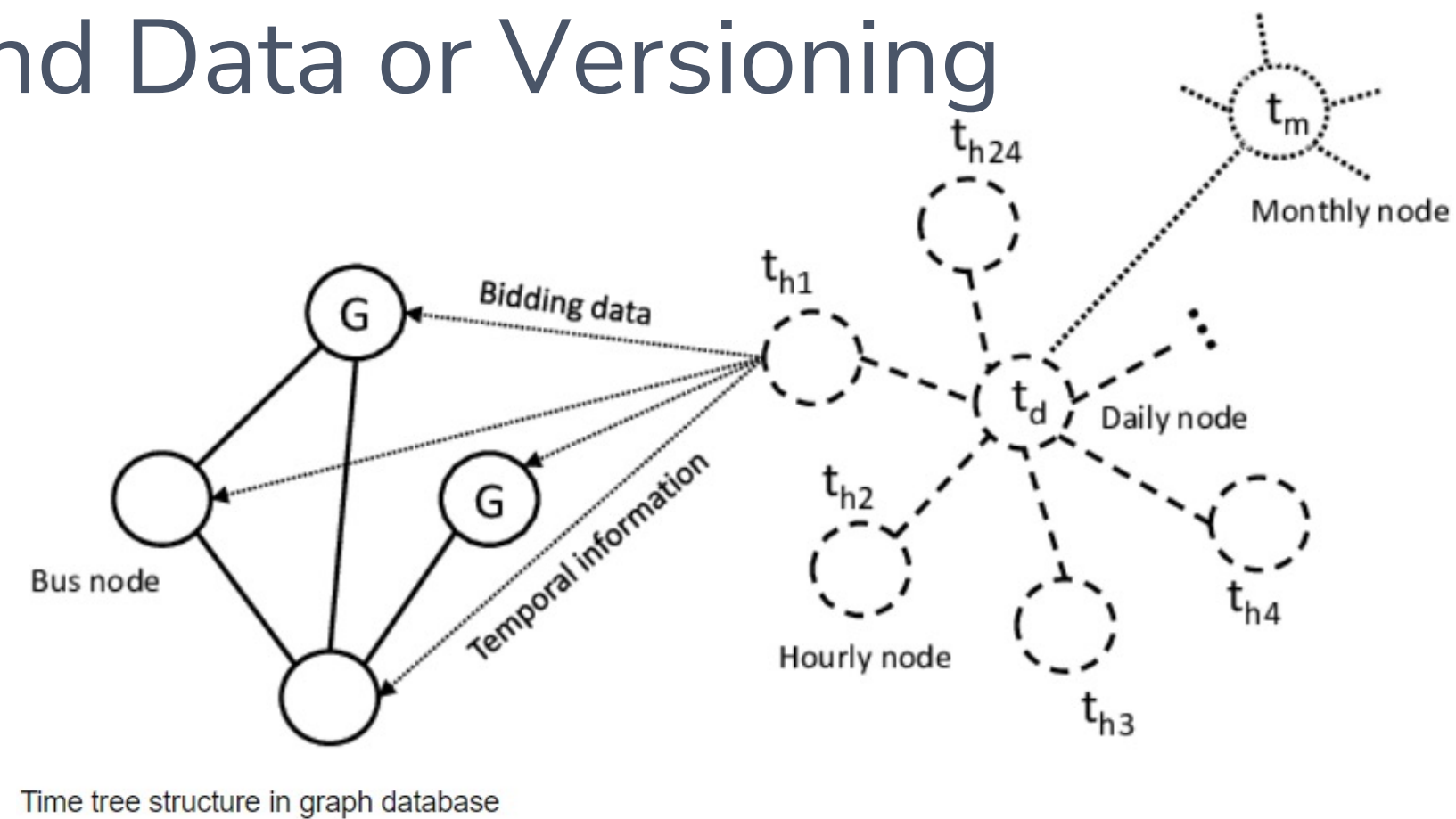
FC_Policy_UID	Policy_Holder_UID	Policy_Holder_Client_UID	Role_Type	Relationship	Role_Holder_UID	Role_Holder_Client_UID
0xBC2507F01F15E53D585 CC349DDEBED803589E7A 4	0xDE47A547194774E381F029 99A3413EBEF771B84A6CDE...	NaN	Life Assured	Child	0x200ECFCEF62452CDFEEE 703812F1CA1132CDBEFA5 DBB...	0xD068C9D2BEC32C2C8D26121 1683C61F4843B8533
0x5CE150E313E4C52E250 E199699E6D04CF84CE917	0x956390B3CD7558291775D 4C32E0C820D07F11A0B1E23..	0x5641A37860F7B156FAC EB5EE50A33D9538903F9C	Life Assured	Self	0x956390B3CD755829177 5D4C32E0C820D07F11A0B 1E23...	0x5641A37860F7B156FACEB5EE 50A33D9538903F9C
0x68BDBBDBEFBE2744B9 DE06E3C612C9C6FF8B2F5 C	0xD67CB8DA6302E2B6695B0 6B2C5E23F7C0A7121B88797. ..	0x8D4F80DF0D37819CDE 3E3D2BB9982D111EBAC9 7C	Life Assured	Self	0xD67CB8DA6302E2B6695 B06B2C5E23F7C0A7121B8 8797...	0x8D4F80DF0D37819CDE3E3D2 BB9982D111EBAC97C
0xAE0EFC73ADD762BF85 AC79D3ADDC638F50EE87 D8	0xB6F2555D8ED822AC1C290 5940DFC21B611211C8A7365. ..	0xCBBE069D36EE6C3DA9 2B9E11C2AE6447FF6F359 D	Life Assured	Self	0xB6F2555D8ED822AC1C2 905940DFC21B611211C8A 7365...	0xCBBE069D36EE6C3DA92B9E1 1C2AE6447FF6F359D
0x81E4AC72D5604FA9C06 DEC4CE26BAA58F9FFB911	0xE75470389450760613FF44 1840312122790477111CE1E...	0xD5C6972618D4D3396A 186726BE36049C3960029 8	Life Assured	Self	0xE75470389450760613FF 44840312122790477111C E1E...	0xD5C6972618D4D3396A18672 6BE36049C39600298

Graph Database Design Guidelines

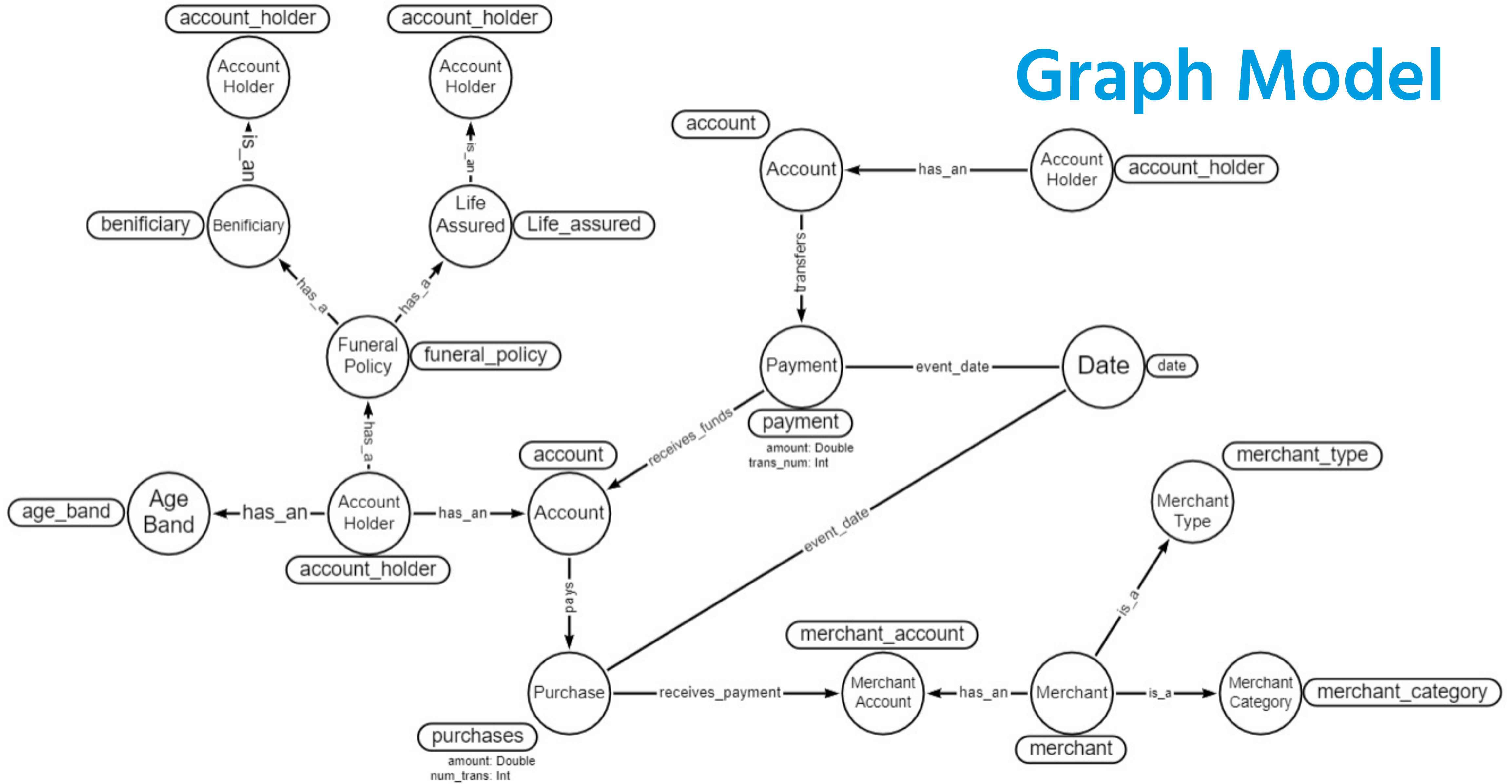
- Property vs Relationship



- Time-bound Data or Versioning



Graph Model



thank you
any questions?

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Next steps

What to expect next week.

- Info pack, including login details.
- Judges, PW Janse van Rensburg (Technical Value) and Chane Dewar (Business Value)
- Prizes

thank you
any questions?

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References

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- <https://aws.amazon.com/nosql/graph/>
- <https://neo4j.com/>
- Machine Learning with Graphs:
<https://www.youtube.com/watch?v=aBHC6xzx9YI>
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