

# Large Scale Graph Analytics with



DataWorks Summit San Jose  
June 13, 2017

P. Taylor Goetz, Hortonworks  
@ptgoetz

# About Me



- Tech Staff @ Hortonworks
- TSC Member, JanusGraph
- PMC Chair, Apache Storm
- ASF Member
- PMC: Apache Incubator, Apache Arrow, Apache Kylin, Apache Apex, Apache Eagle, Apache Metron

What is a Graph Database?

“In computing, a graph database is a database that uses ***graph structures*** for semantic queries with ***nodes, edges and properties*** to represent and store data. A key concept of the system is the graph (or edge or relationship), which directly relates data items in the store. ***The relationships allow data in the store to be linked together directly, and in many cases retrieved with one operation.***”

–*Wikipedia*

# Graph Structures - Vertices



- Vertices are the *nodes* or *points* in a graph structure



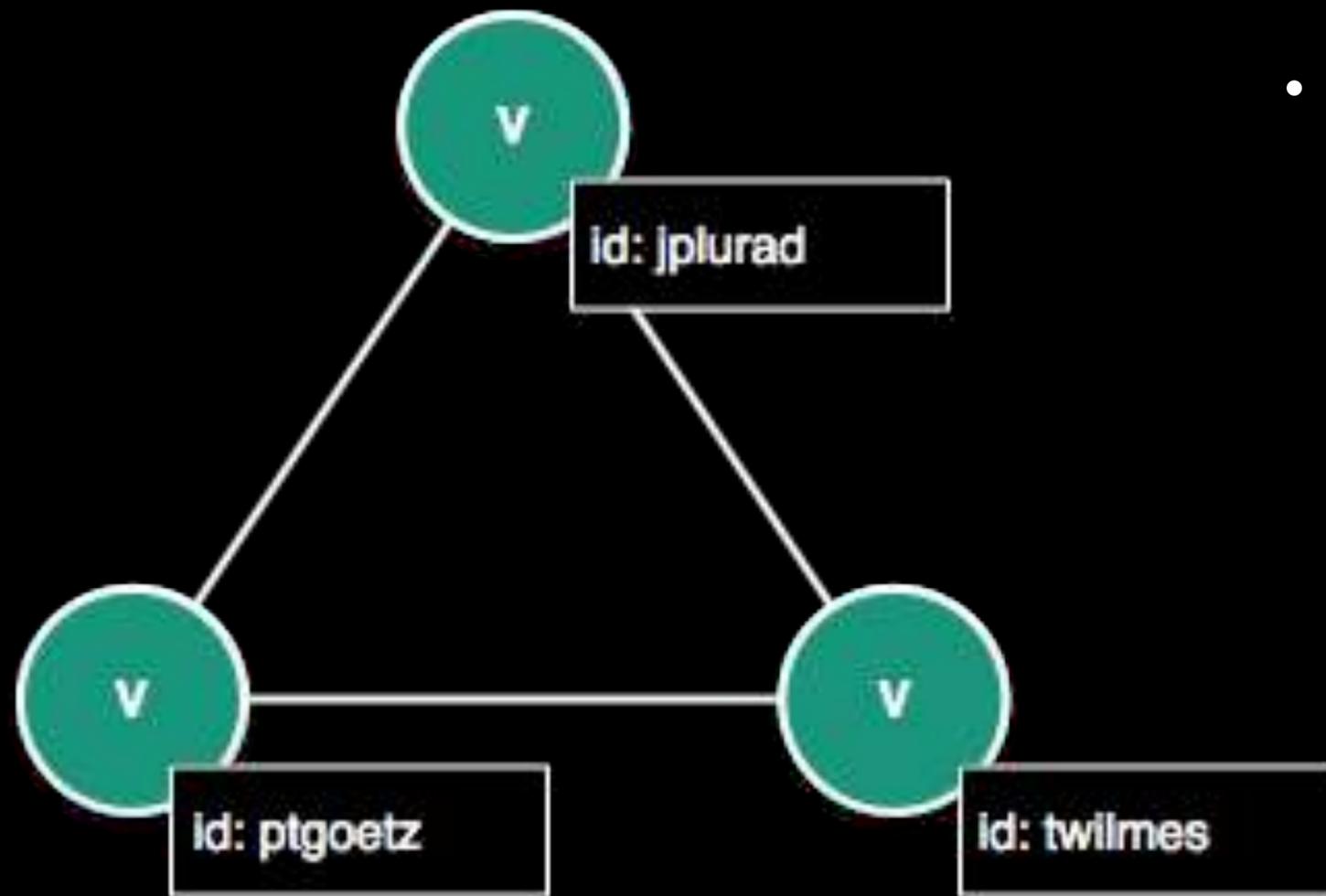
# Graph Structures - Vertices



- Vertices are the *nodes* or *points* in a graph structure
- Vertices can be associated with a set of *properties* (key-value pairs)

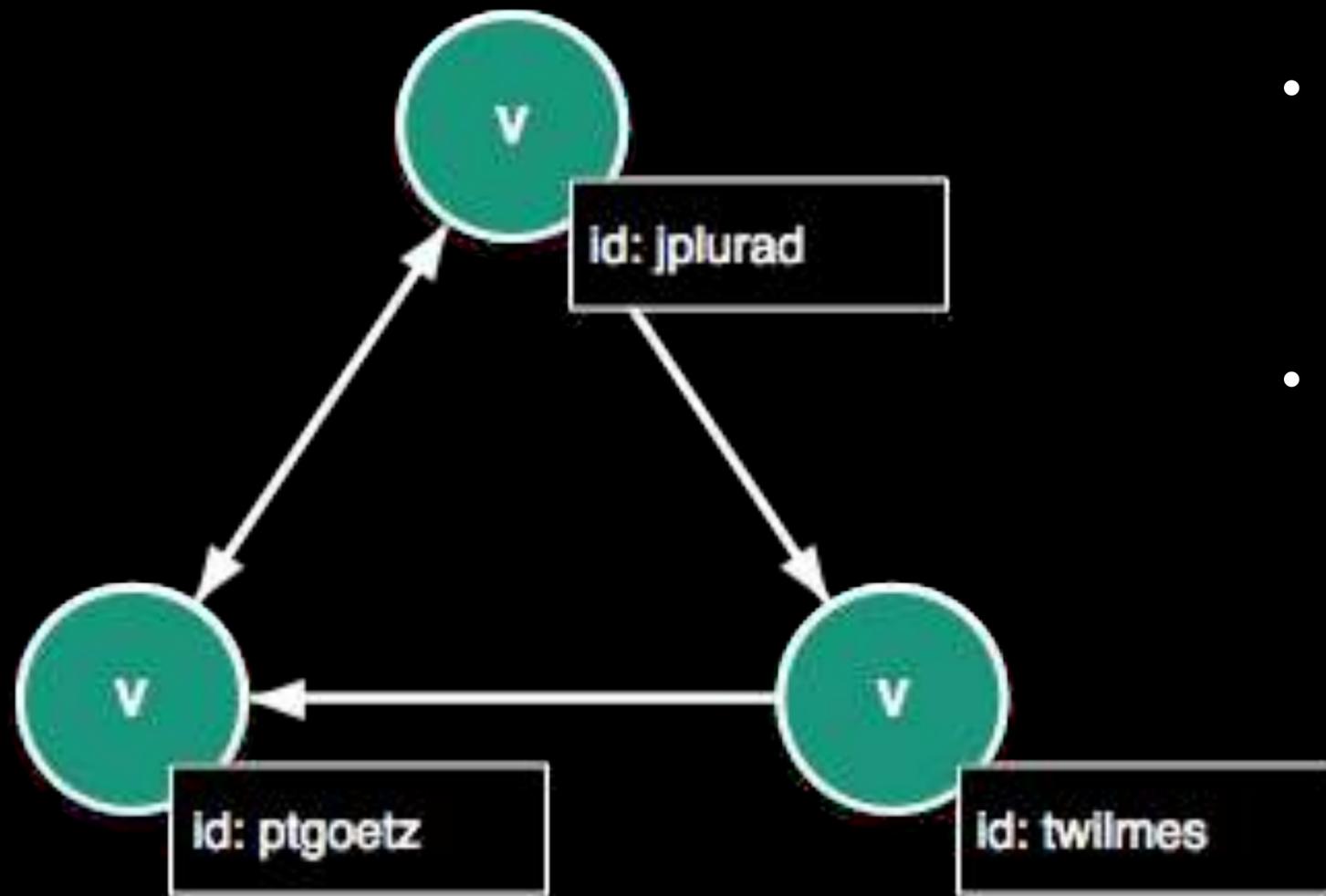


# Graph Structures - Edges



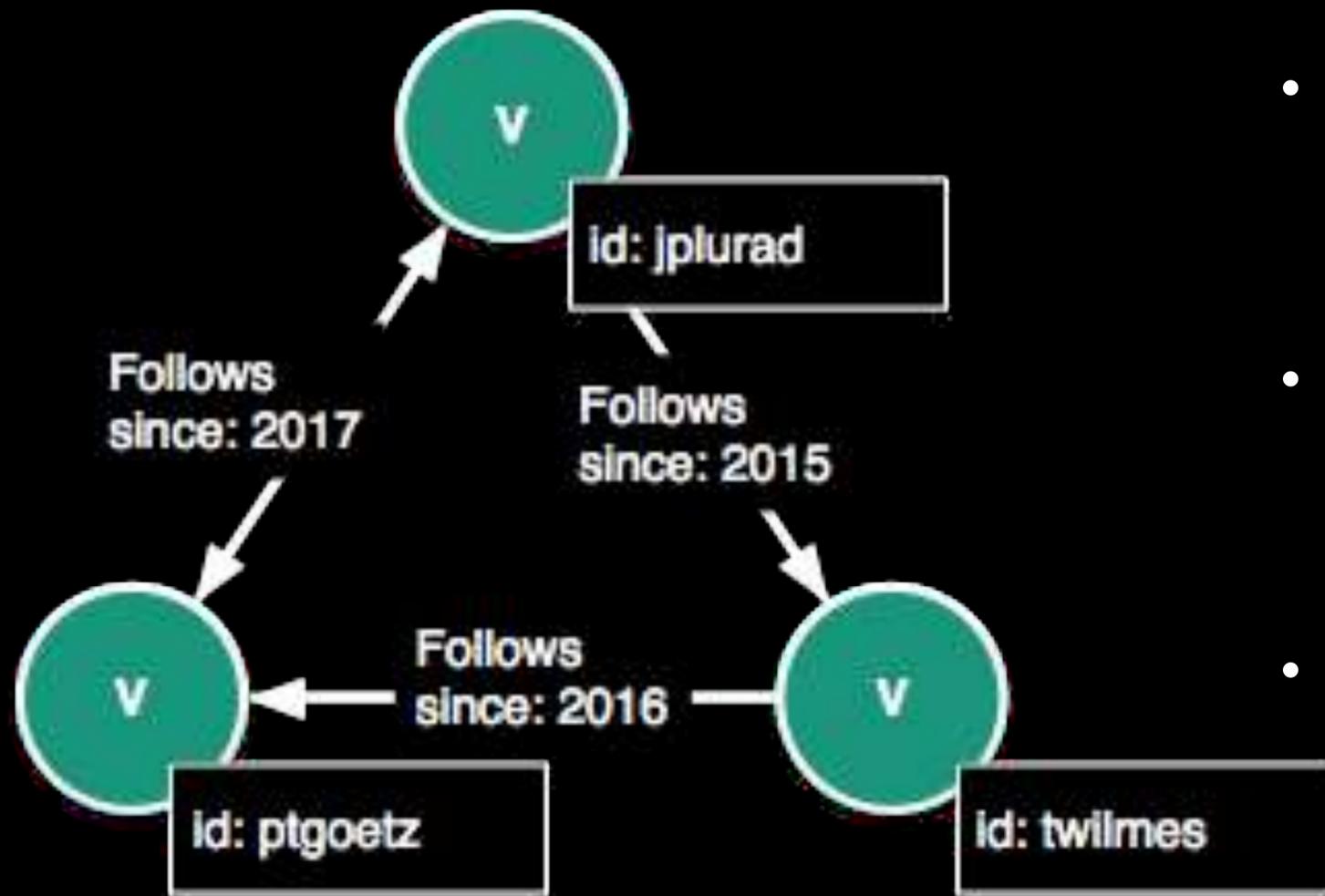
- Edges are the ***connections*** between the vertices in a graph

# Graph Structures - Edges



- Edges are the ***connections*** between the vertices in a graph
- Edges can be ***non-directional***, ***directional***, or ***bi-directional***

# Graph Structures - Edges

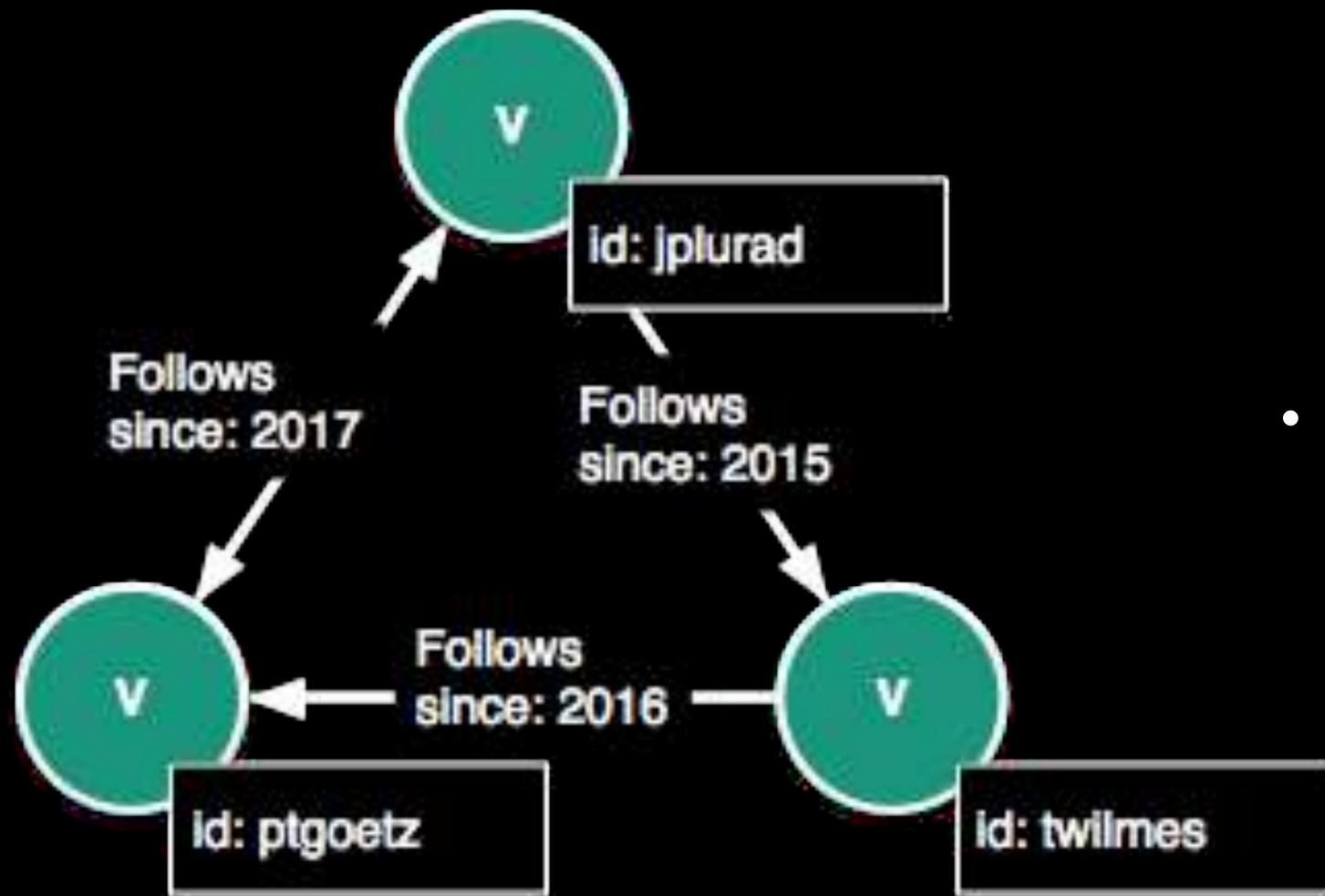


- Edges are the ***connections*** between the vertices in a graph
- Edges can be ***non-directional***, ***directional***, or ***bi-directional***
- Edges can be named and like vertices can have ***properties***

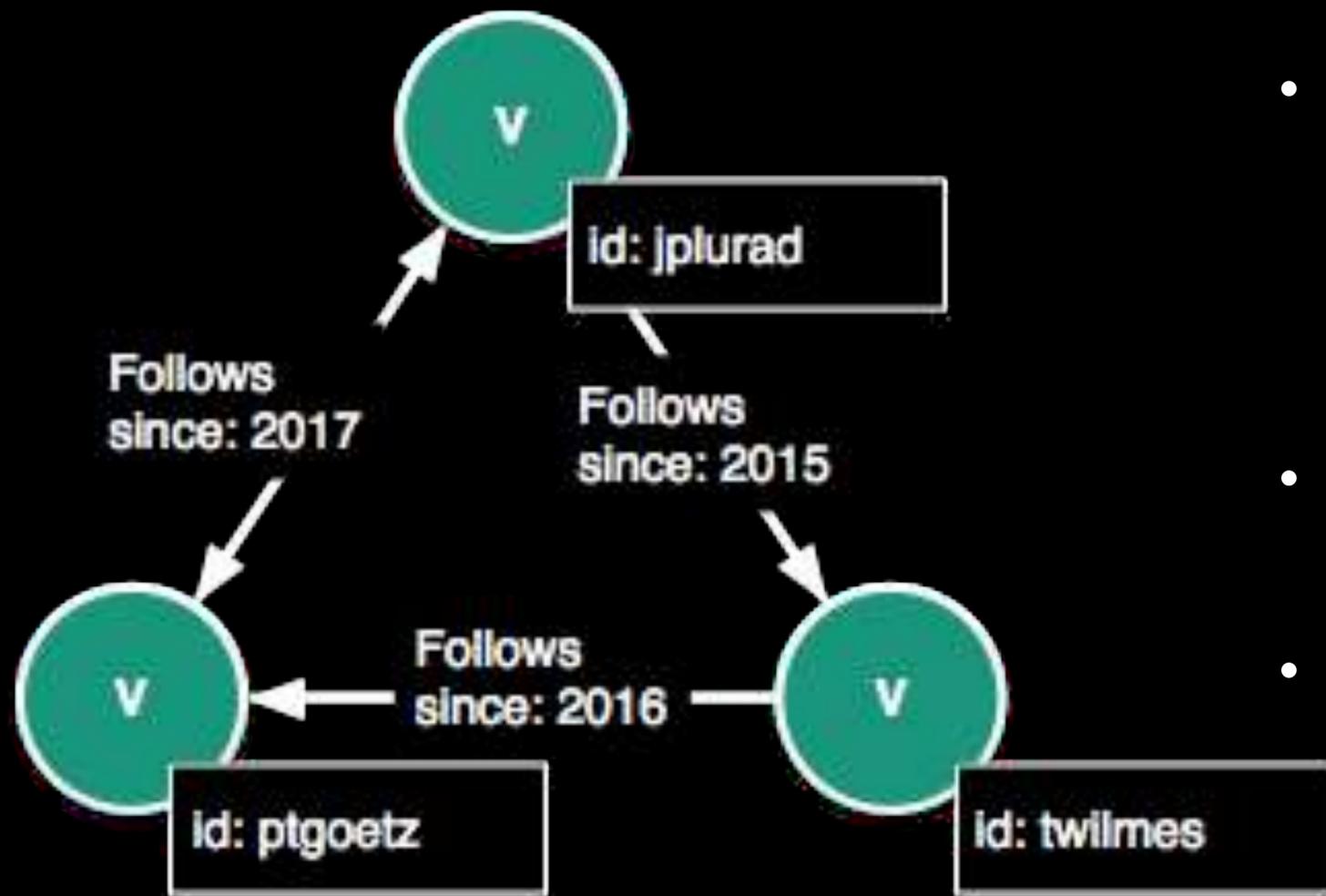
# Graph Structures - Graph

$$G = (V, E)$$

- The *graph* is the collection of *vertices*, *edges*, and associated *properties*



# What is a Graph Database?

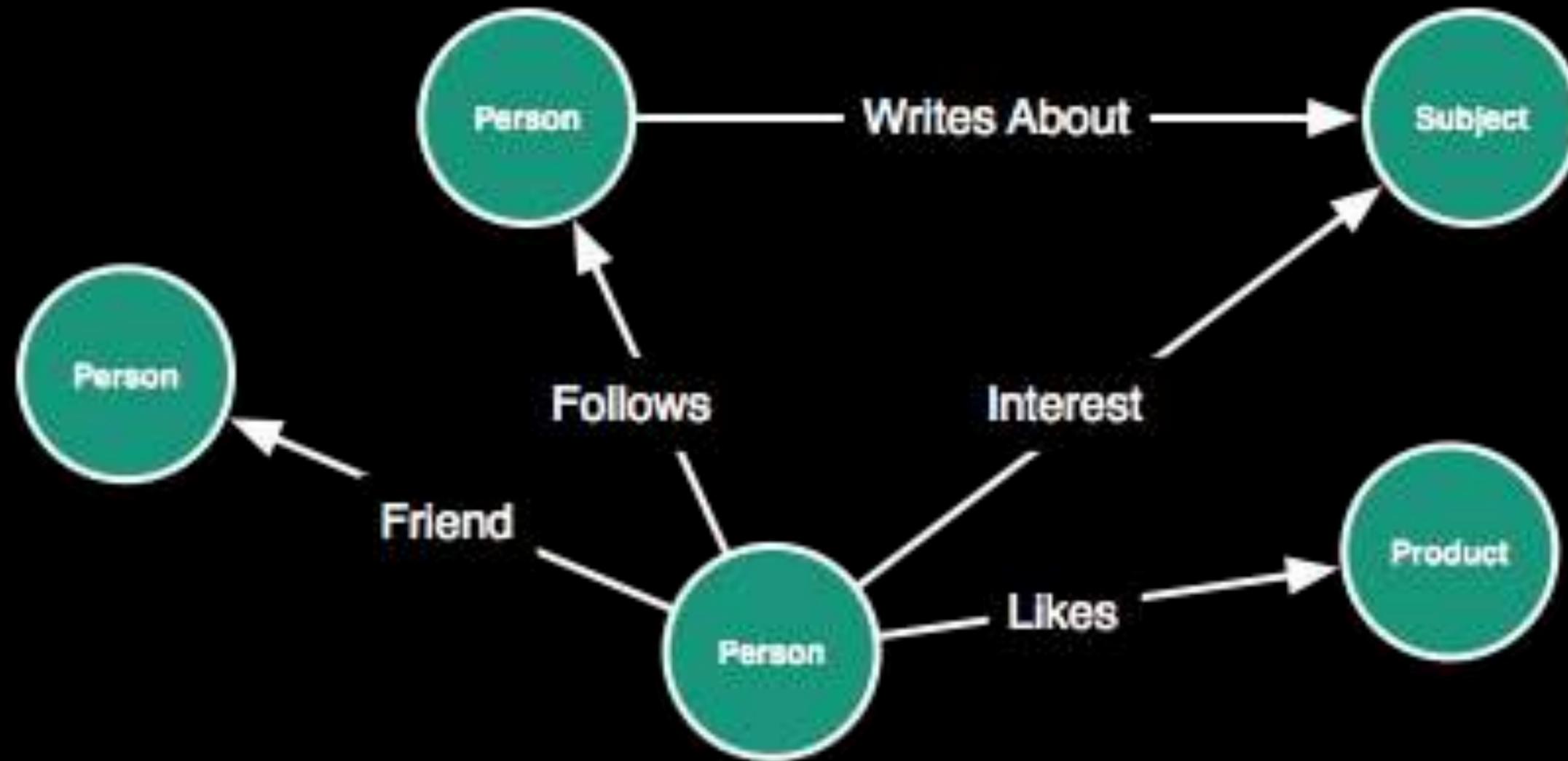


- A ***graph database*** is a datastore optimized for storing and querying graph structures
- Distinct from relational databases
- Focus in terms of storage and queries is on ***relationships***

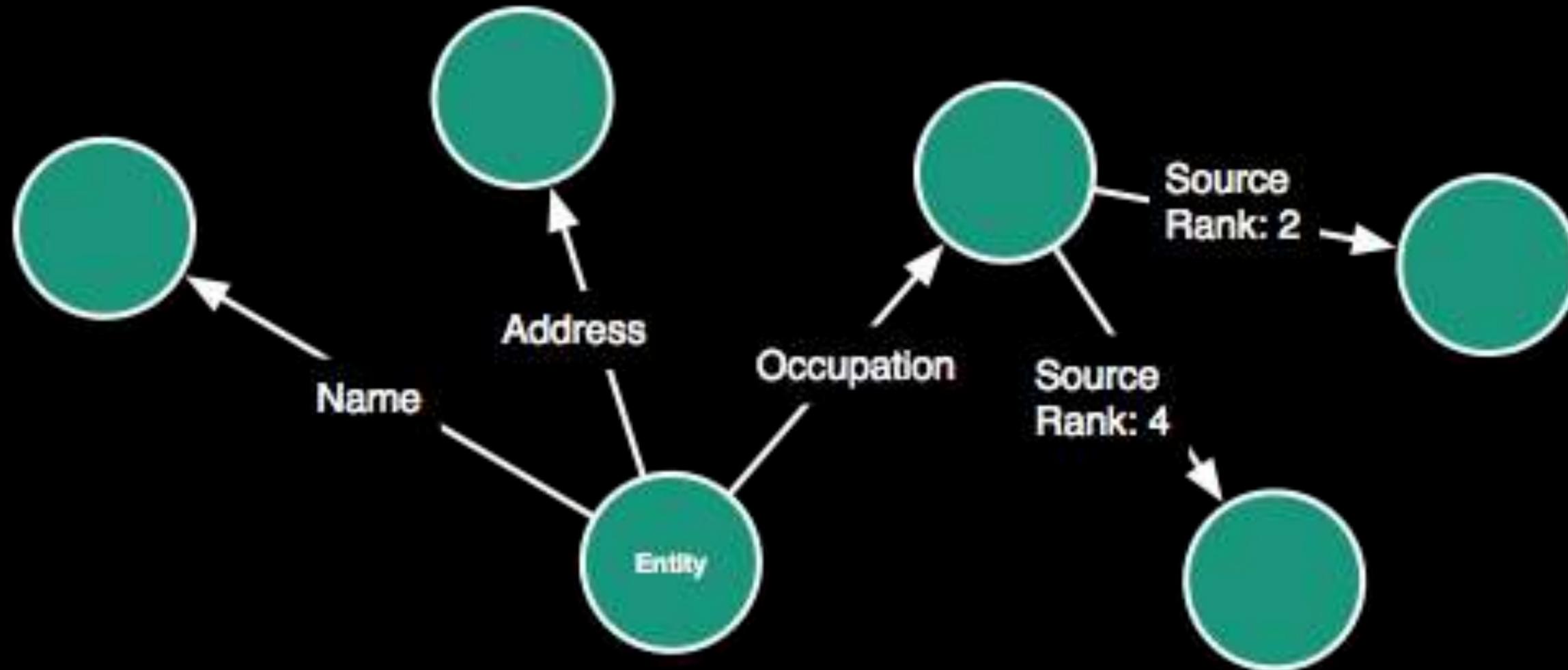
# Common Use Cases

Anywhere relationship modeling and analysis can provide insight or value.

# Social Media



# Master Data Management



# Common Use Cases

- Social Networks
- Master Data Management
- Fraud Detection
- Cybersecurity
- Identity and Access Management
- Recommendation Engines

# Common Use Cases

- Social Networks
- Master Data Management
- Fraud Detection
- Cybersecurity
- Identity and Access Management
- Recommendation Engines

**Many of these can overlap and be combined to provide new insights.**

# The Power of Relationships

# The Power of Relationships

- Harness the value of interconnectedness
- “Paths to Insight”
- Traversal vs. Traditional Query: Join Reduction
- “If you can whiteboard it, you can graph it.”

A little history and the importance of OSS licensing.



JanusGraph

# Titan DB



- Large scale graph db developed by Aurelius
- Licensed under ALv2 (this is important)
- Aurelius acquired by DataStax Feb. 2015
- 1.0 released Sept. 19, 2015

# GitHub Contributions to Titan



DataStax Aurelius  
Acquisition Feb. 2015

# GitHub Contributions to Titan

0.9.0-M2  
Jun. 9, 2015



DataStax Aurelius  
Acquisition Feb. 2015

# GitHub Contributions to Titan

0.9.0-M2  
Jun. 9, 2015

1.0  
Sept. 19, 2015



DataStax Aurelius  
Acquisition Feb. 2015

# GitHub Contributions to Titan

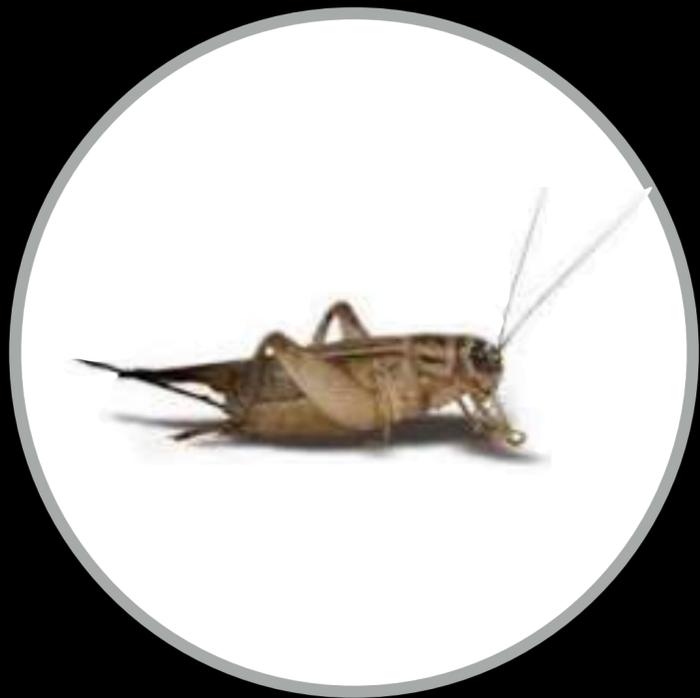
0.9.0-M2  
Jun. 9, 2015

1.0  
Sept. 19, 2015



DataStax Aurelius  
Acquisition Feb. 2015

When will X be fixed?



When will this pull request  
get merged?

Where does that leave  
community, users?

Next version?

Security vulnerabilities?



# ALv2 to the Rescue!

Empowering Communities



# ALv2 to the Rescue!

Empowering Communities

*“We can do this. What’s the next step?”*

“Apache Olympian?”



A P A C H E  
**INCUBATOR**

# What is a “hostile fork?”

A "hostile fork" is a fork of a project that goes against the wishes of the copyright holders and/or community.

“DataStax does not approve of and objects to the proposed forking of Titan into Olympian or any other ASF project.”

*–DataStax counsel on Apache Incubator mailing list*

“Apache Olympian?”



Next stop...



# Introducing...



- Spearheaded by Google, IBM, Hortonworks, Expero, GRAKN.AI
- Contributors from Netflix, Amazon, Uber, Orchestral Developments
- Sponsored by the Linux Foundation

# Introducing...



- ALv2 License
- Apache style governance model
- Source code, issues hosted on GitHub
- Mailing lists on Google Groups
- Chat on Gitter

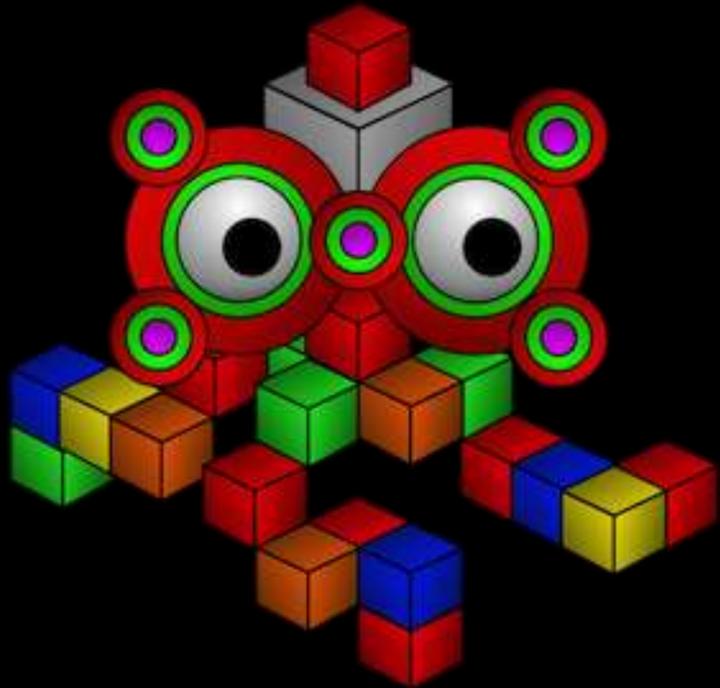


Technical Dive



- Optimized for storing/querying ***billions of vertices and edges***
- Supports ***thousands of concurrent users***
- Can execute ***local queries*** (OLTP) or cross-cluster ***distributed queries*** (OLAP)

# Apache Tinkerpop



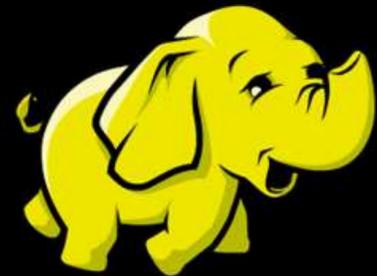
- THE framework and API for graph manipulation and traversal
- Open source, vendor agnostic
- Supported by a number of Graph DBs
- Promotes portability

# Gremlin Query Language



- DSL for graph traversal and manipulation
- Fluent style API
- Multi-language support (Java, Scala, Groovy, Python, Ruby, etc.)

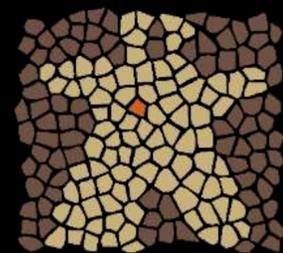
# OLAP Integration



- Apache Hadoop



- Apache Spark

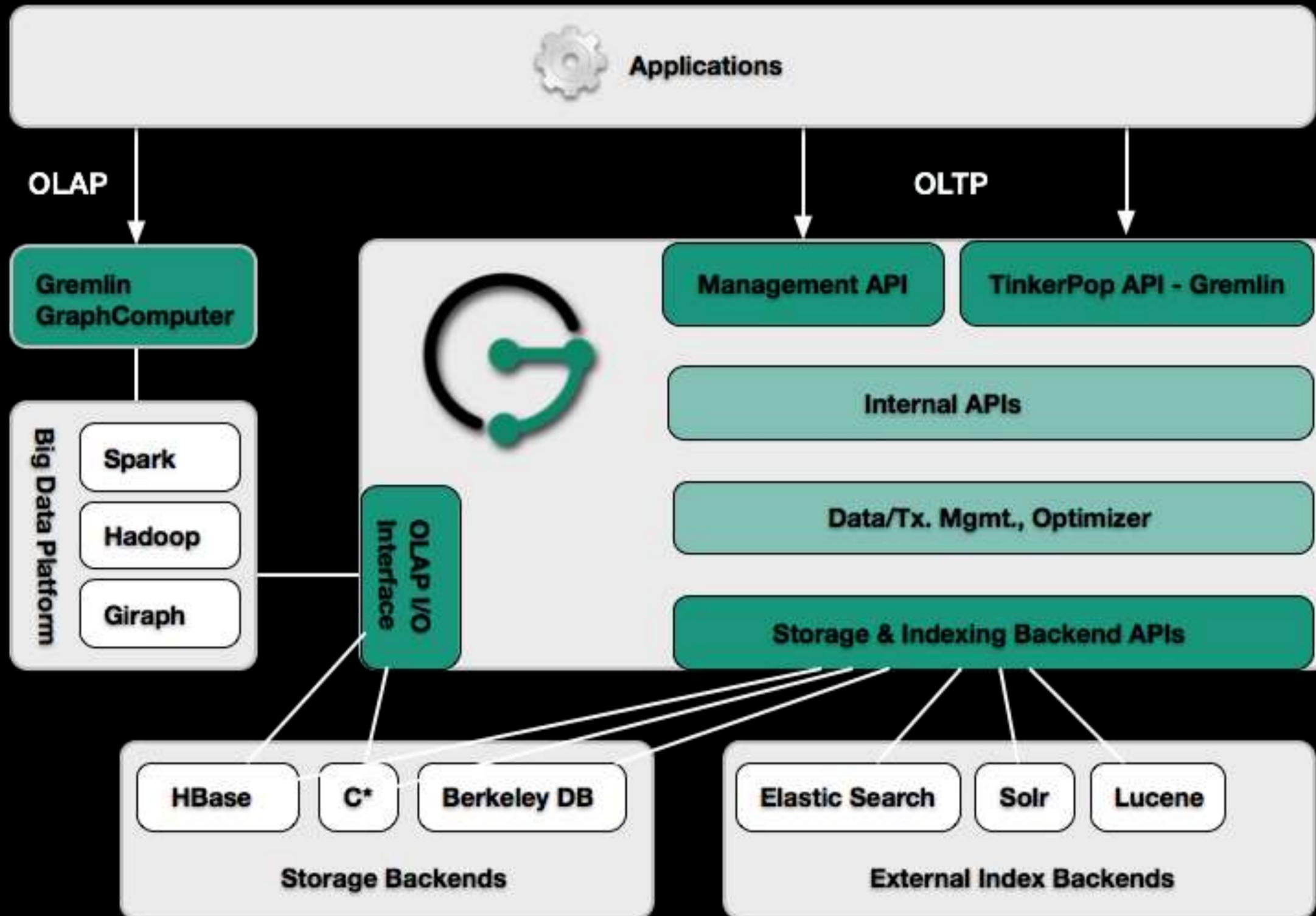


- Apache Giraph



- ACID compliant (depending on backend)
- Supports very many concurrent transactions
- Embedded, Single Node, or Scale out

# JanusGraph Architectural Overview

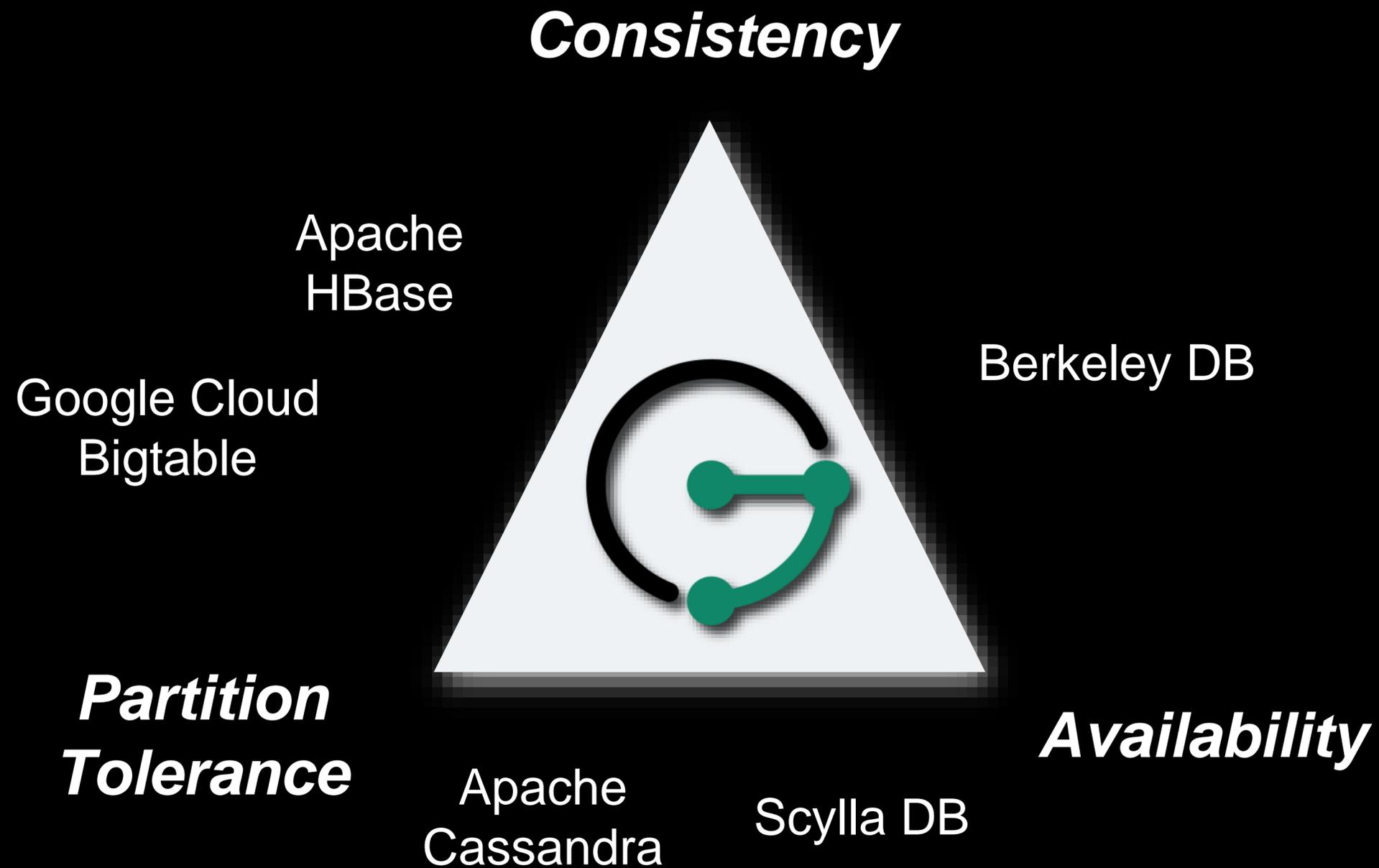


# Storage Backends



- Well defined storage API allows for easily pluggable implementations
- Choose the backend best for your use case and architecture
- Options include: Apache HBase, Apache Cassandra, Google Cloud Bigtable, Berkeley DB
- More on the way...

# Choose Your Own [CAP] Adventure



# JanusGraph External Indices



- Secondary to primary graph storage
- Provide a means to speed up graph traversal and information retrieval
- Two types:
  - Graph Index
  - Vertex-centric Index

# Graph Indices



- Global index structures across entire graph
- Efficient retrieval of vertices and edges based on associated *properties*
- Eliminates need to do a full graph scan
- When querying, JanusGraph will typically warn when a full scan is necessary
- New indexes take effect immediately, but reindexing may be required

# Vertex-Centric Indexes



- Local index structures built per-vertex
- Eliminates the need to load all vertices from the graph for filtering

# Pluggable Index Backends



- Elastic Search
- Apache Solr
- Apache Lucene



# Schema and Data Modeling

- Consist of edge labels, property keys, vertex labels
- Explicit or Implicit
- Can evolve over time w/out database downtime
- Edge label multiplicity, Property keys, Key cardinality, Vertex labels



# Schema - Edge Label Multiplicity

- **MULTI**: Multiple edges of the same label between vertices
- **SIMPLE**: One edge with that label (unique per label)
- **MANY2ONE**: One *outgoing* edge with that label (mother/children)
- **ONE2MANY**: One *incoming* edge with that label
- **ONE2ONE**: One incoming, one outgoing edge with that label



# Schema - Property Key Data Types

Name	Description
String	Character sequence
Character	Individual character
Boolean	true or false
Byte	byte value
Short	short value
Integer	integer value
Long	long value
Float	4 byte floating point number
Double	8 byte floating point number
Decimal	Number with 3 decimal digits
Precision	Number with 6 decimal digits
Date	Date
Geoshape	Geographic shape like point, circle or box
UUID	UUID



# Schema - Property Key Cardinality

- **SINGLE:** At most one value per element.
- **LIST:** Arbitrary number of values per element. Allows duplicates.
- **SET:** Multiple values, but no duplicates.

# Graph Traversal with Gremlin

- Gremlin console:
  - Groovy-based REPL for exploring the graph
  - Pre-defined convenience variables, expandable by plugins. E.g.:
    - “g” — represents the entire graph
    - “hdfs” — access to hdfs provided by the TinkerPop Hadoop plugin
- Local or remote



# Graph Traversal with Gremlin

```
  \, , , /  
  (o o)
```

```
-----o000o-(3)-o000o-----
```

```
09:12:24 INFO org.apache.tinkerpop.gremlin.hadoop.structure.H
```

```
plugin activated: tinkerpop.hadoop
```

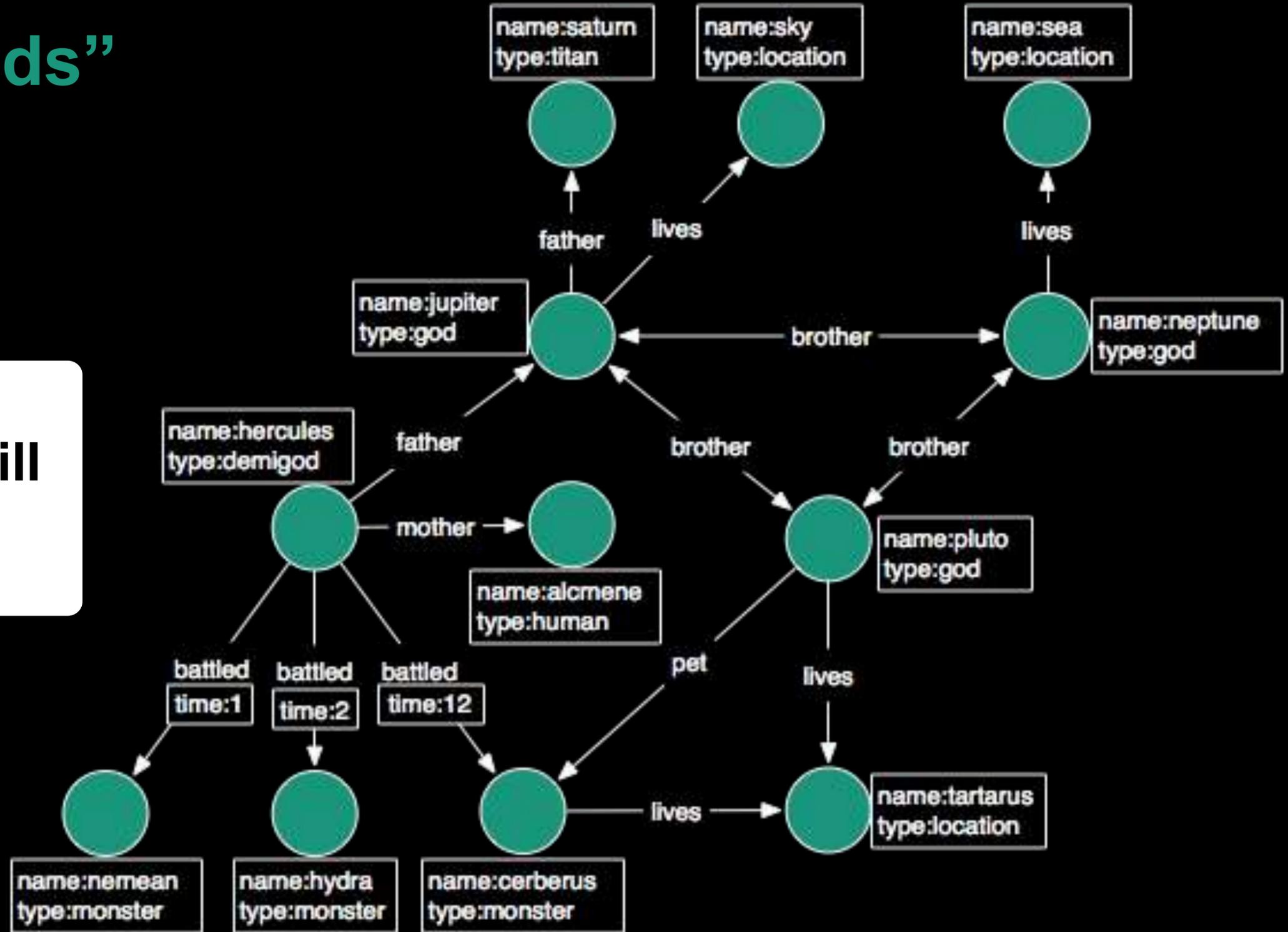
```
plugin activated: janusgraph.imports
```

```
gremlin>
```

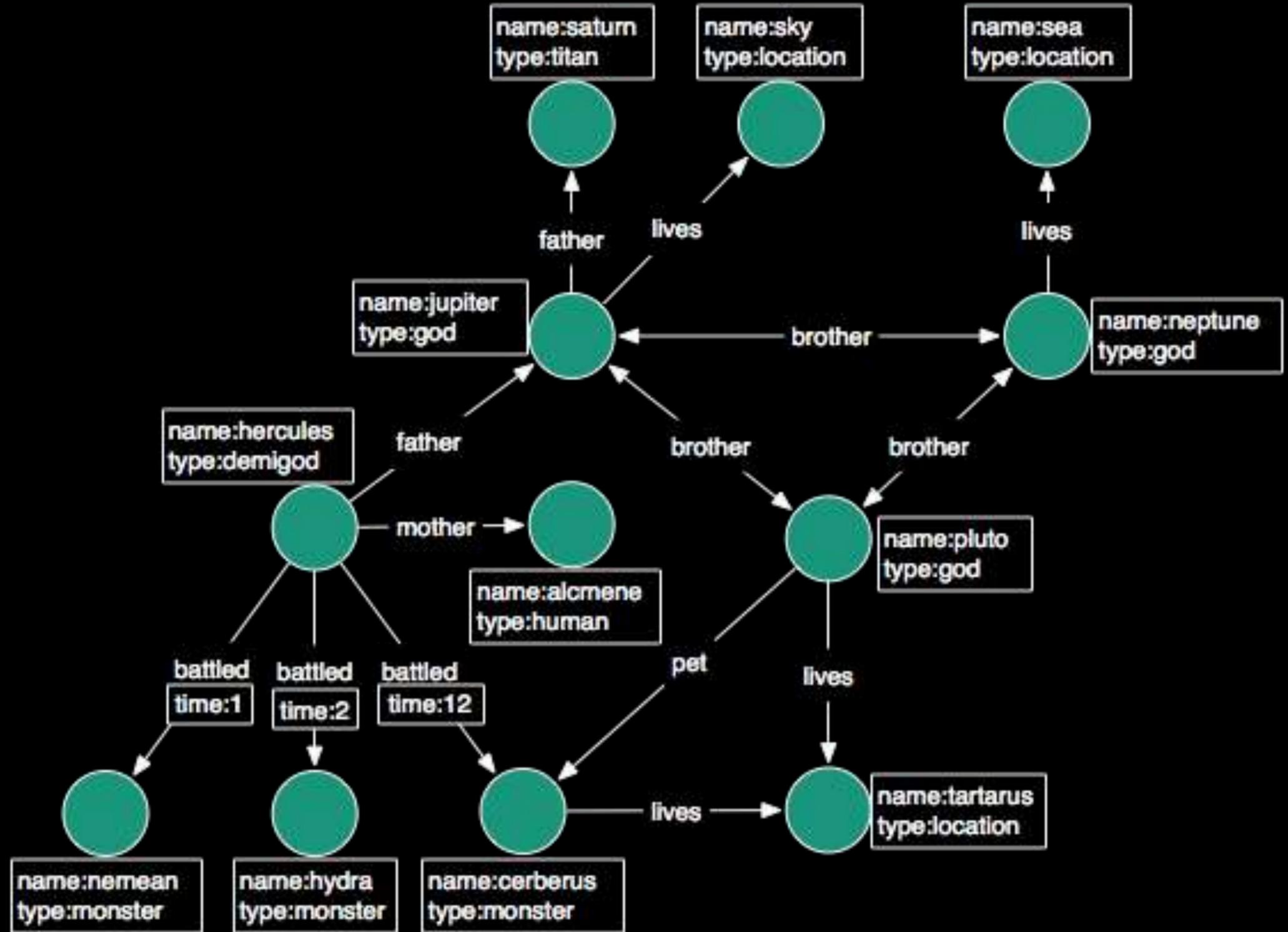


# “Graph of the Gods”

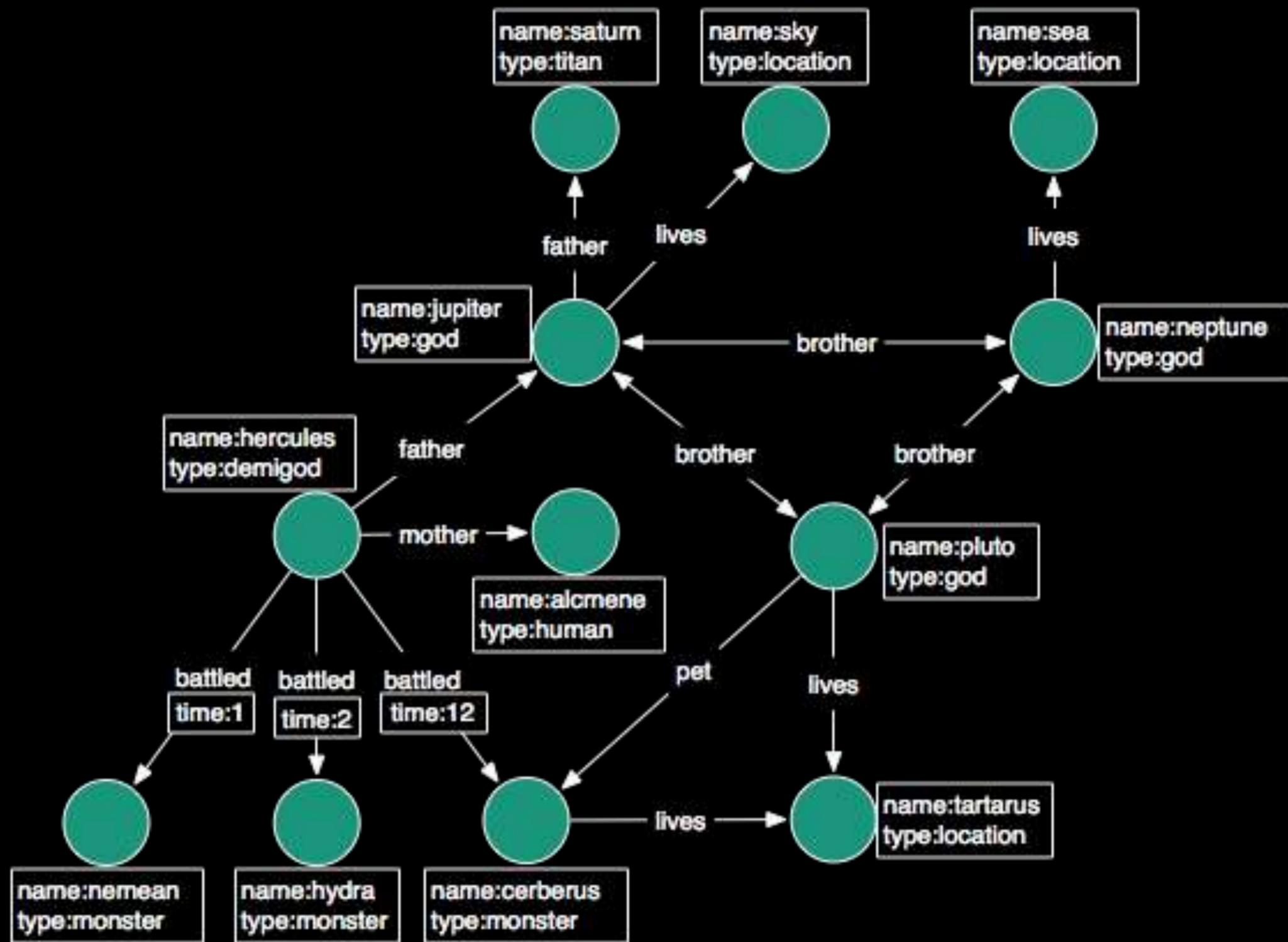
What path will we be taking today?



Who is Hercules' grandfather?



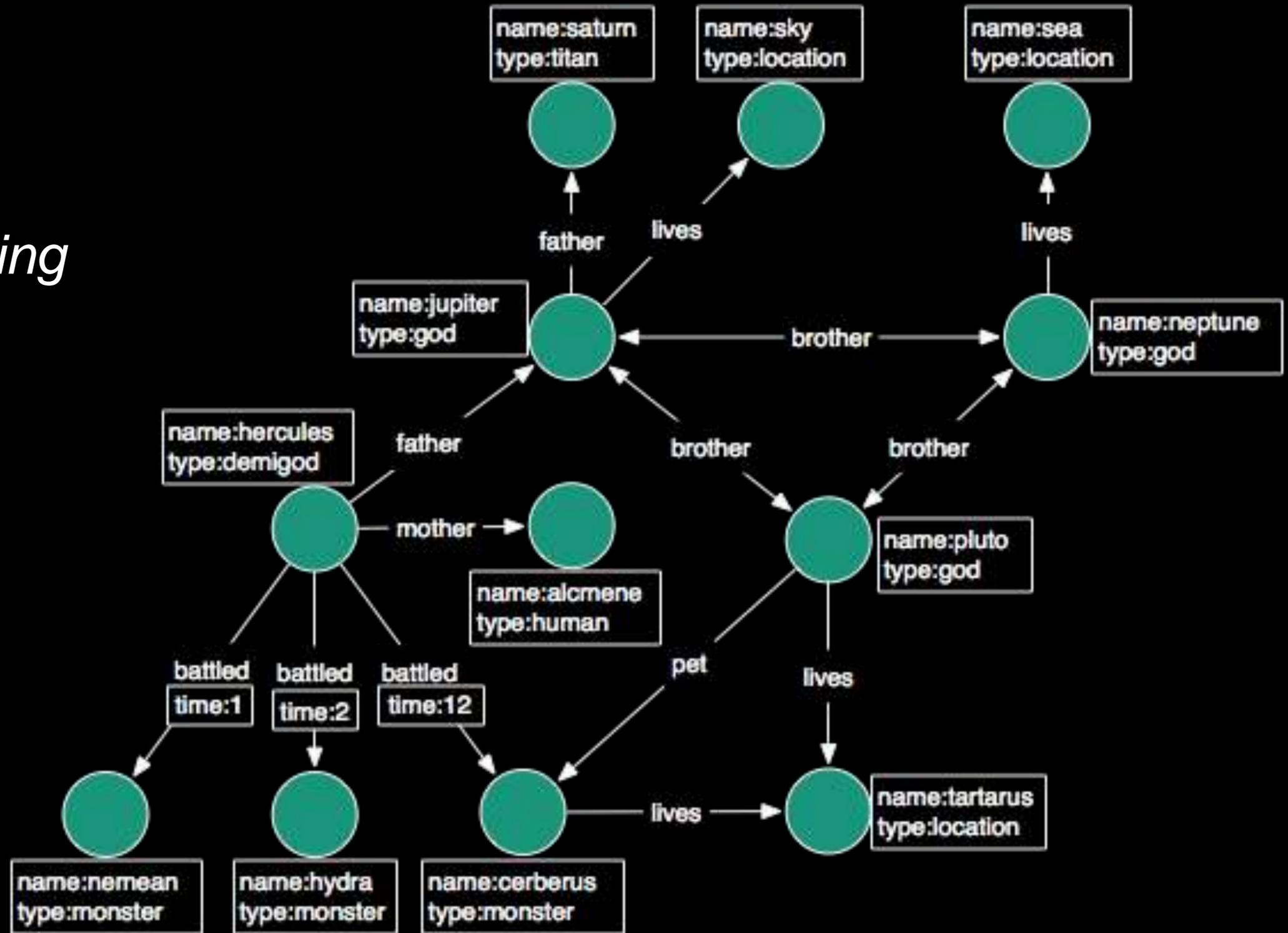
gremlin>



gremlin>

g

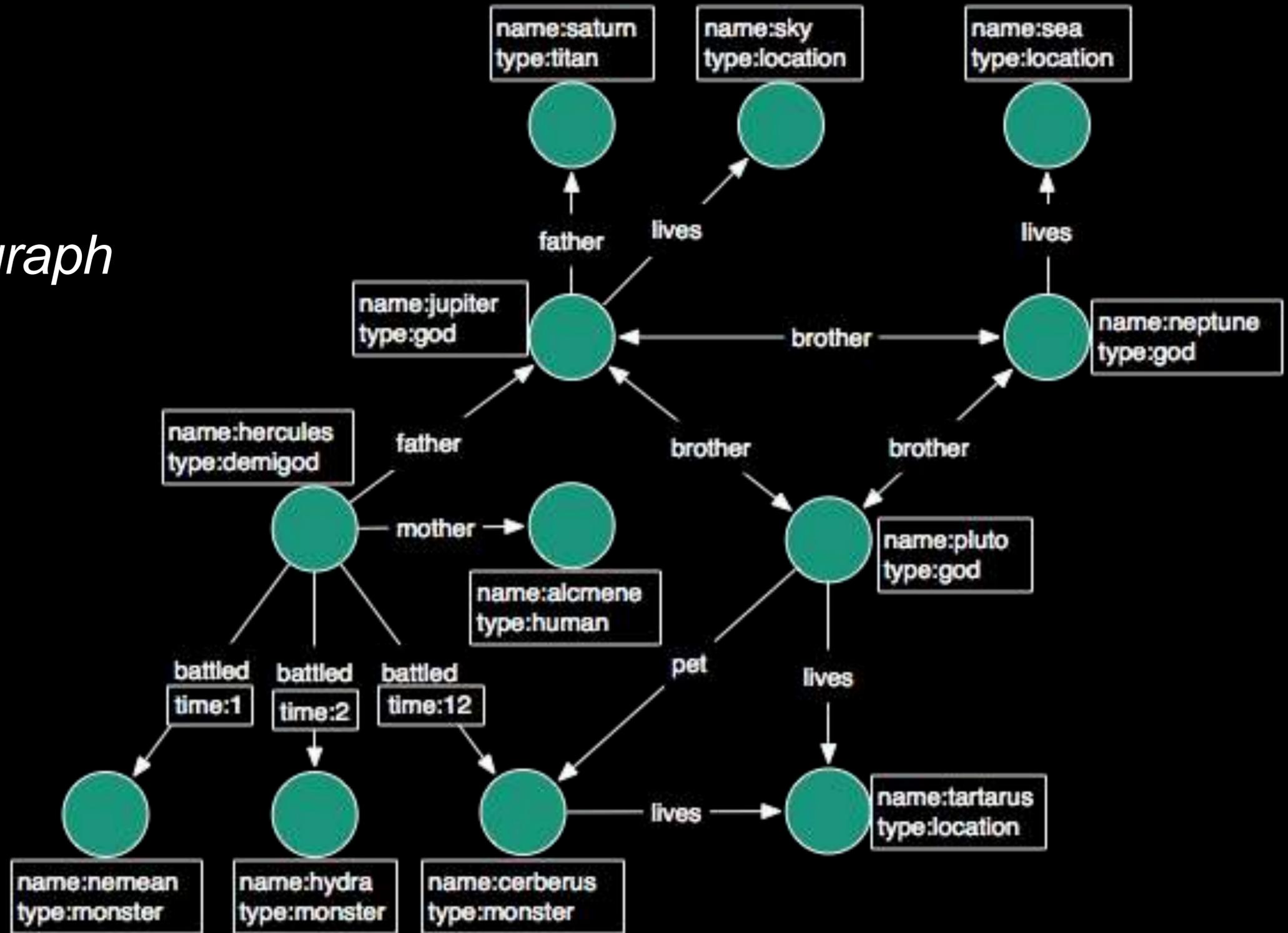
*Global variable representing the entire graph*



gremlin>

g.v()

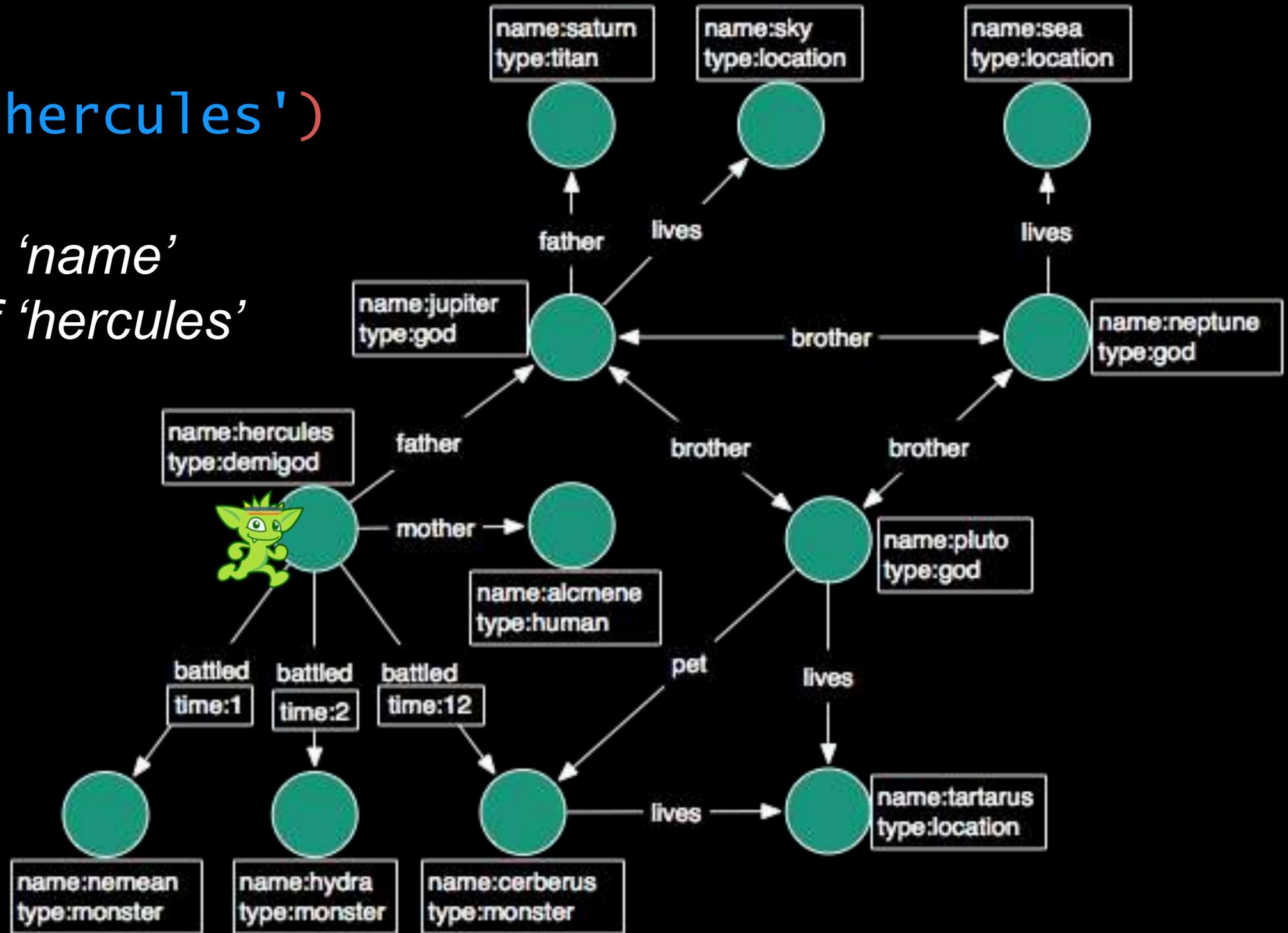
Select all vertices in the graph



gremlin>

```
g.v().has('name', 'hercules')
```

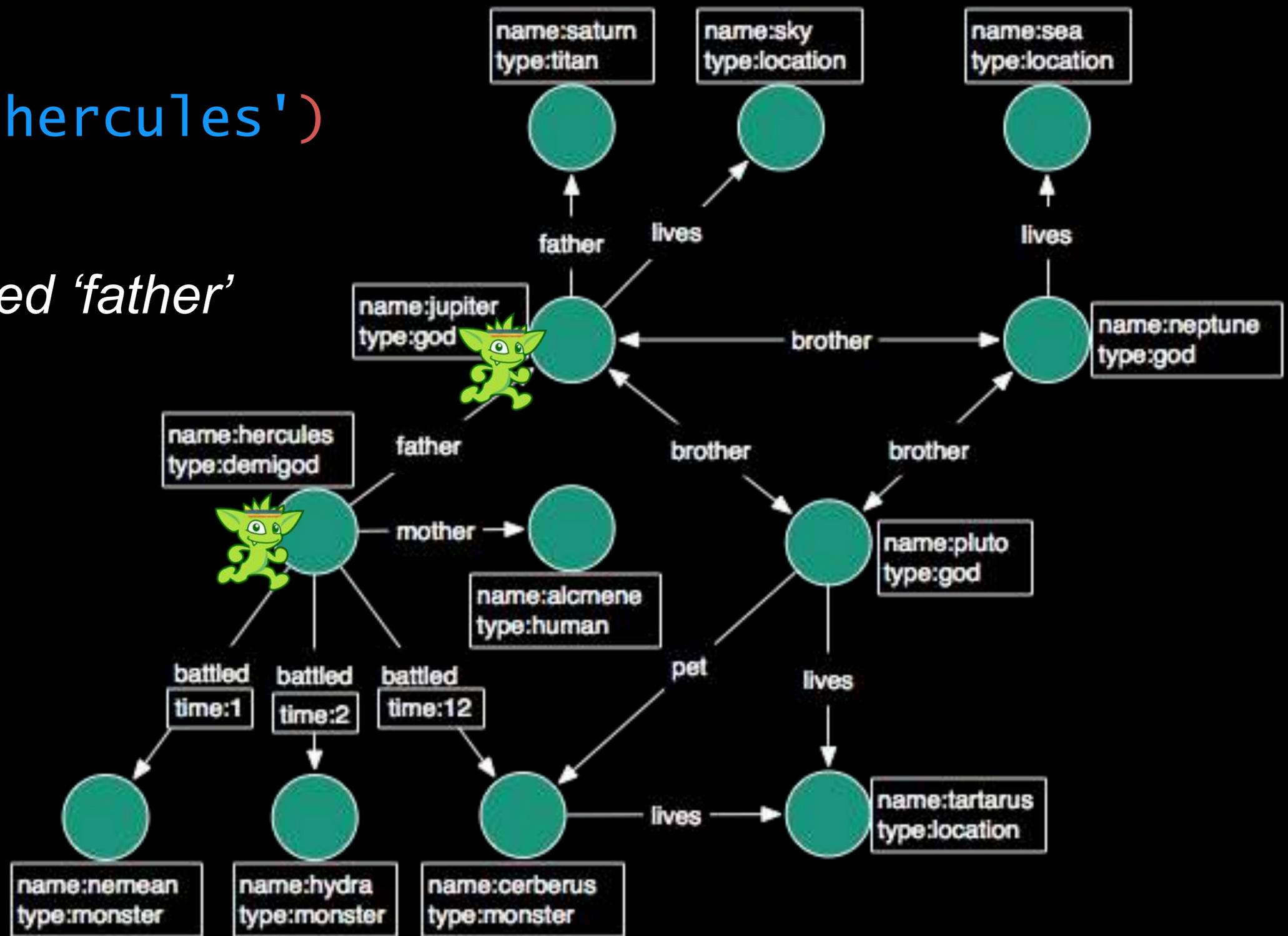
*Find the vertex that has a 'name' Property with the value of 'hercules'*



```
gremlin>
```

```
g.v().has('name', 'hercules')  
  .out('father')
```

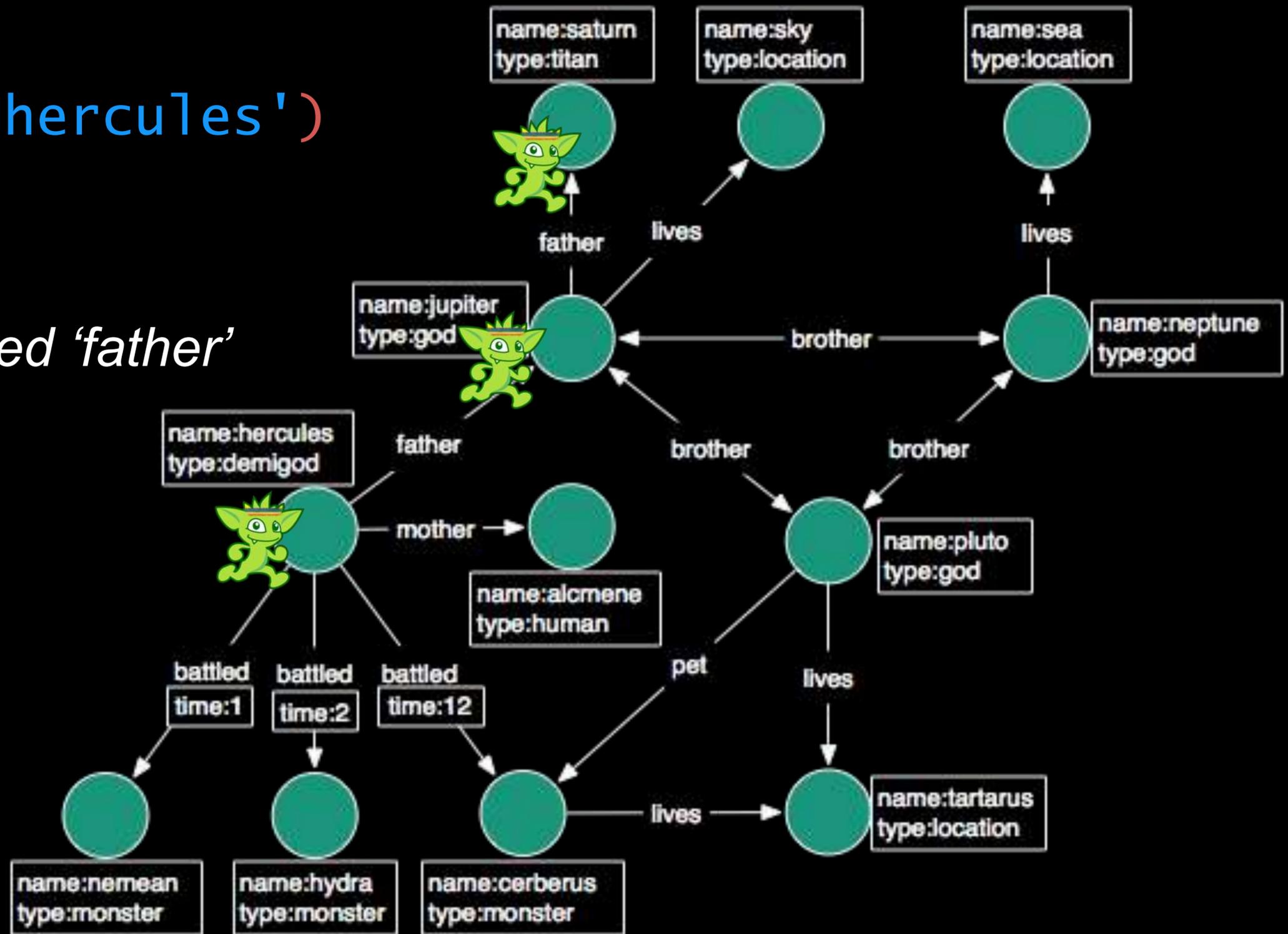
*Follow outbound edge named 'father'  
to the connected vertex*



```
gremlin>
```

```
g.v().has('name', 'hercules')  
  .out('father')  
  .out('father')
```

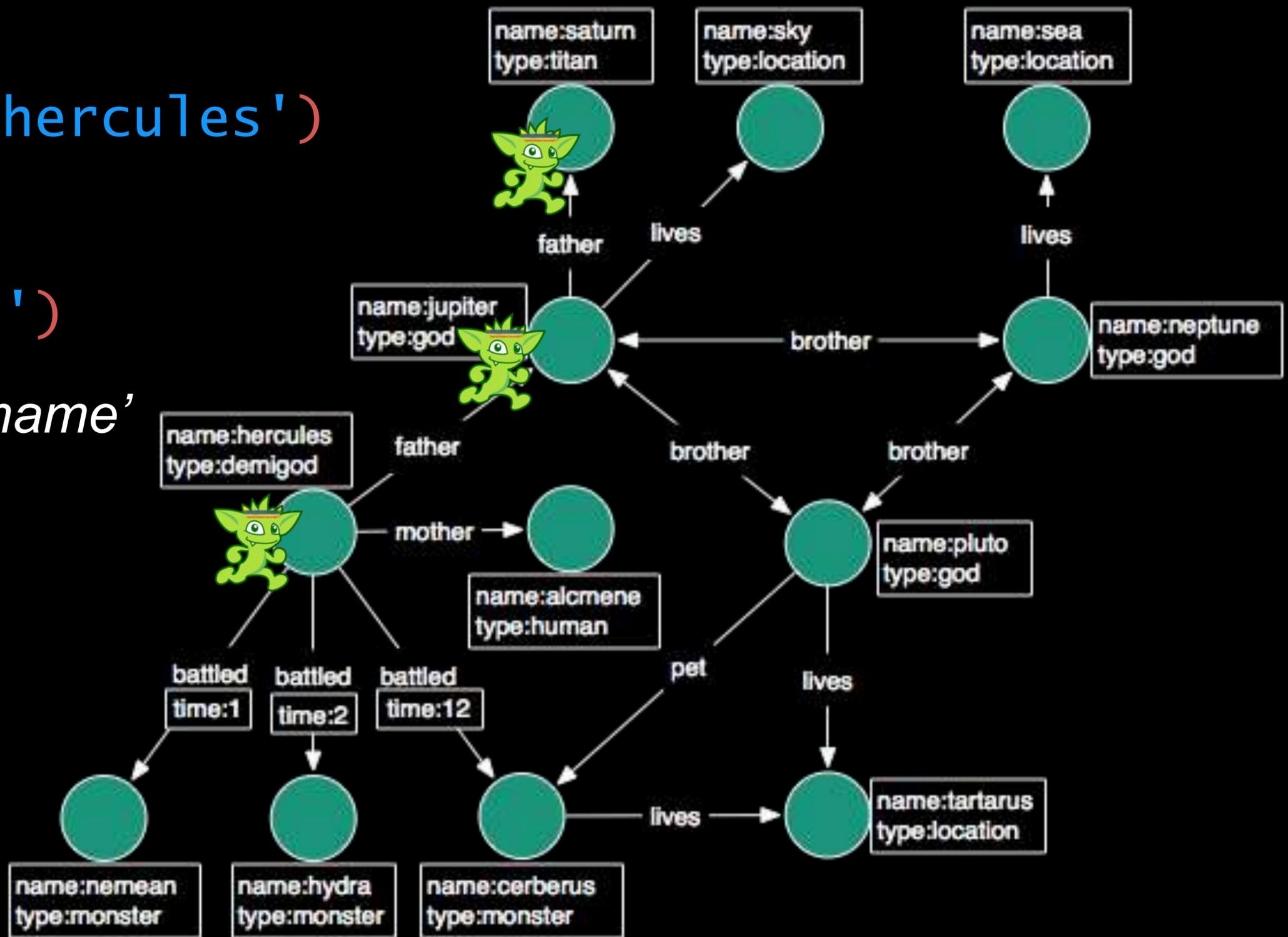
*Follow outbound edge named 'father' to the connected vertex*



gremlin>

```
g.v().has('name', 'hercules')  
  .out('father')  
  .out('father')  
  .values('name')
```

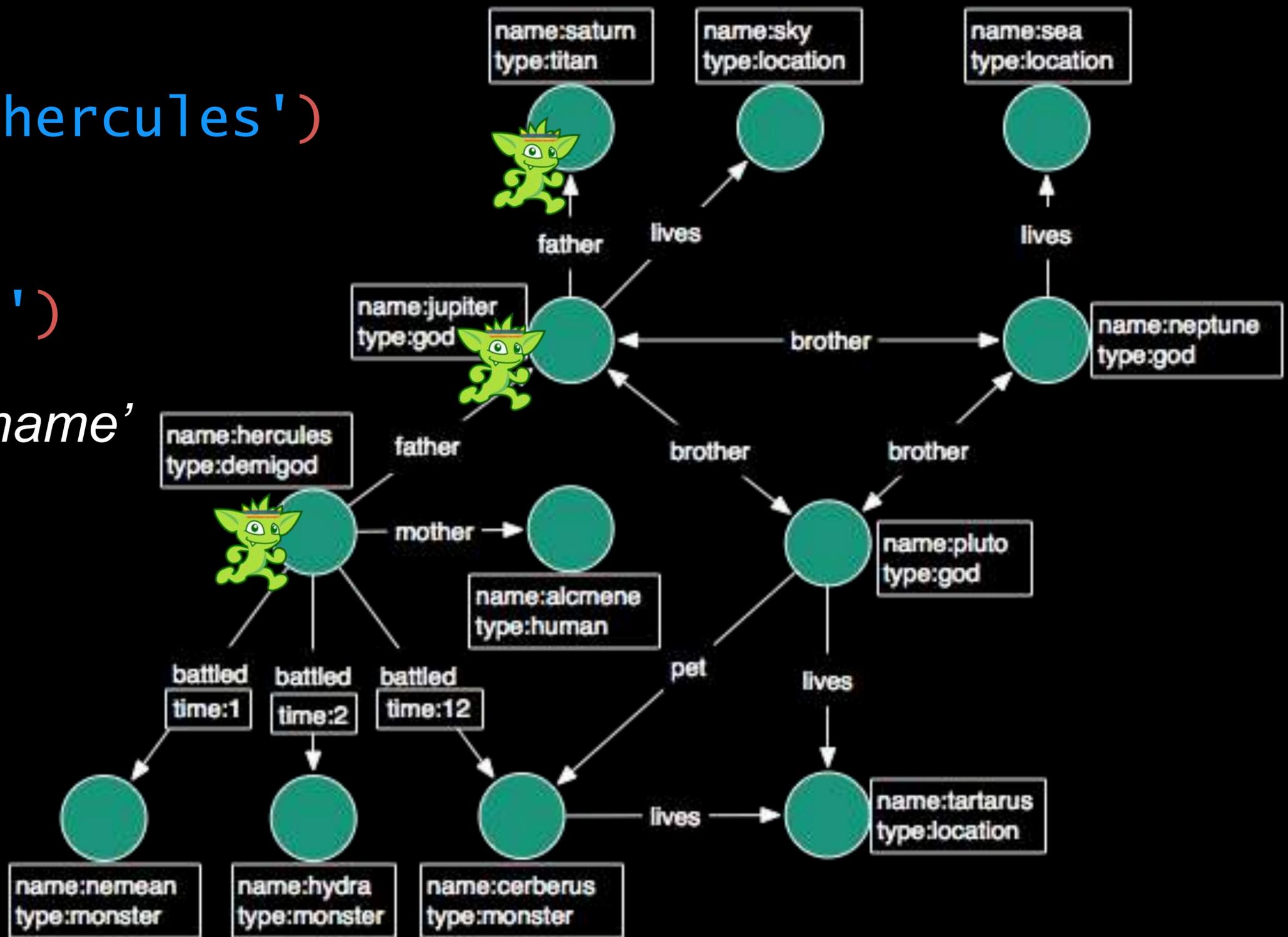
Select the vertex property 'name'



gremlin>

```
g.v().has('name', 'hercules')  
  .out('father')  
  .out('father')  
  .values('name')
```

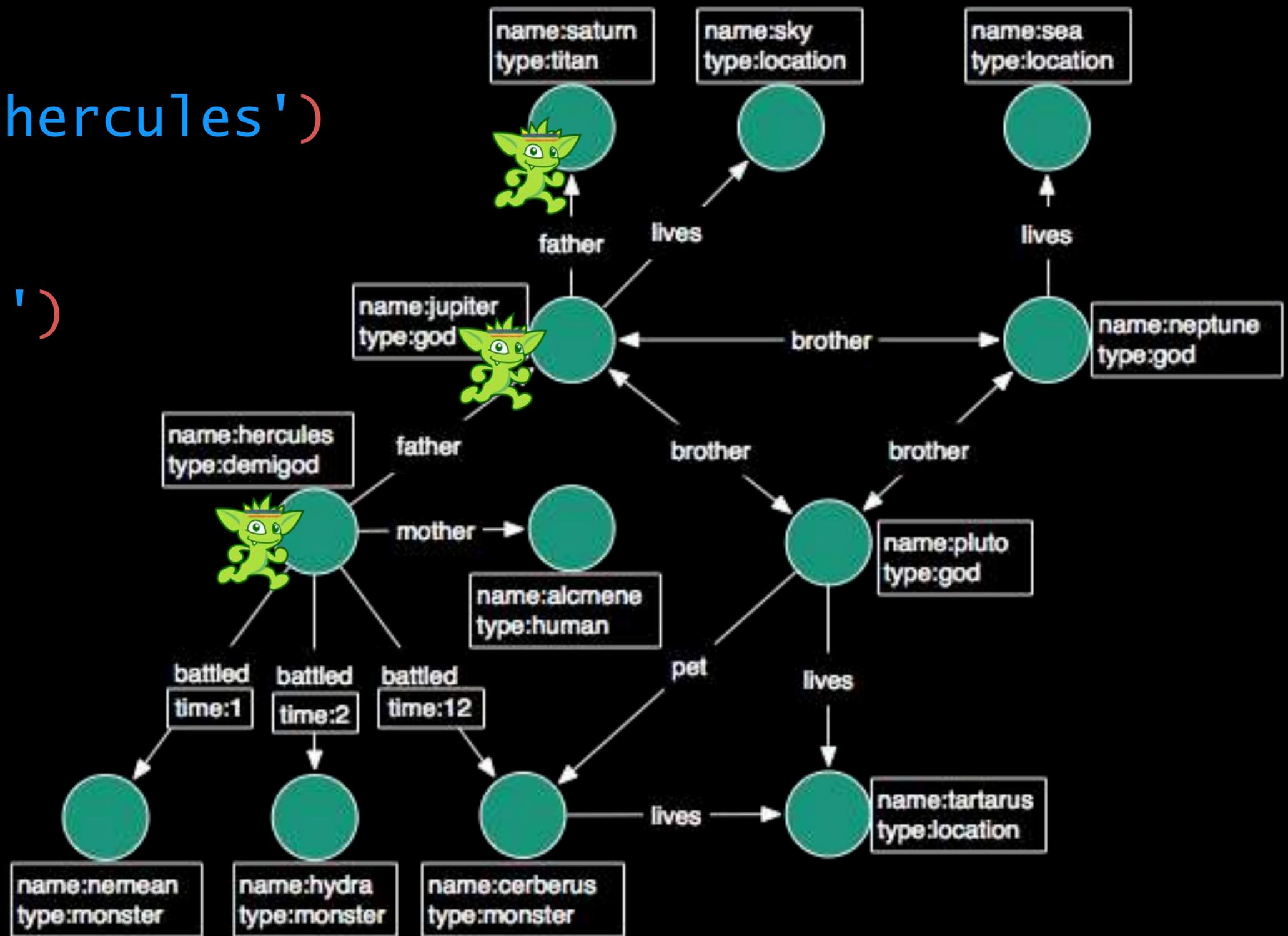
Select the vertex property 'name'



```
gremlin>
```

```
g.v().has('name', 'hercules')  
  .out('father')  
  .out('father')  
  .values('name')
```

```
==> saturn
```



# What's in a version number?



1.1

*Unreleased*



JanusGraph

0.1.1

*May 16, 2017*

# Contributions Welcome!

- Website: <http://janusgraph.org>
- GitHub Organization: <https://github.com/JanusGraph>
- User Mailing List: [janusgraph-user@googlegroups.com](mailto:janusgraph-user@googlegroups.com)
- Developer Mailing List: [janusgraph-dev@googlegroups.com](mailto:janusgraph-dev@googlegroups.com)

# Thank you!

Questions?

P. Taylor Goetz, Hortonworks  
@ptgoetz