# The BigDAWG Polystore by

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#### Purpose of BigDAWG (Intel ISTC on Big Data)

• Flatten BDAS (Badass)



### Outline

- Why do we need a polystore
- What exactly is a Polystore
- The BigDAWG stack
- The big kahuna



# **Why Polystores?**

- "One size fits all" is over
- Legacy RBMSs are now good for nothing
  - And should be sent to the "home for tired software"
  - In every vertical market I can think of, there is something that is 1 - 2 orders of magnitude faster
- And other data types are now important
  - Not just structured data



#### **One Size Does Not Fit All**

#### • Recorded Futures runs

- MongoDB for semi-structured data
- Postgres for structured data
- Lucene (elastic search) for text



#### **One Size Does Not Fit All**

#### • Tamr runs

- Postgres for OLTP
- Impala/Spark for analytics
- Lucene (elastic search) for materialized views



### **One Size Does Not Fit All**

- Mimic II data (40K ICU patients from Beth Israel Hospital)
  - Real time waveform data (from bedside monitors)
  - Historical time series data (waveform archive)
  - Patient metadata (standard structured data)
  - Nurse's and doctor's notes (text)
  - Prescriptions (semi-structured data)



# **Our BigDAWG Prototype**

- Real time waveform data
  - S-Store
- Historical time series data
  - SciDB
- Patient metadata
  - Postgres
- Nurse's and doctor's notes
  - Accumulo
- Prescriptions
  - Accumulo



# **BigDAWG Requirements**

- Real time support
  - "Code blue"
  - · Alert doctor if real time differs from history
- Cross-system queries
  - Find me everybody who is taking drug XXX
  - Find me the average age of patients listed as "very sick" by a nurse or doctor
- Analytics
  - · Correlate heart-rate to age for patients over 45
- Novel user-level functionality
  - "tell me something interesting"



## Without Help, This is a Programming Nightmare

- Programmer must learn K DBMS interfaces
- And copy data between systems
  - To do a cross system join
- And recode his application if any data moves
  - As requirements evolve



## **BigDAWG Needs a Federated DBMS** (reminiscent of the 1980's)

- K independent data bases
  - Usually on different storage software!!!
- With different schemas and query languages
- With a federation query language
  - Perhaps relational
  - "Shims" to mediate between federation language and local languages



#### Think of This as an "Island of Information"

- One query language
- N local DBMSs, with shims
- Preserve location transparency
  - Can move stuff for optimization
- Programmer codes against this "island interface"
  - Learns one interface!
  - His programs are insulated from data movement!



#### **Extension: Multiple Islands of Information**

- No esperanto query language
  - SQL, array-talk, text talk...
- Impossible to achieve location transparency for all DBMS functionality
  - Occasionally need to talk directly to underlying systems



## **BigDAWG Research Program**

- "Thin Middle" multi-island interface
  - Effort to make islands as semantically inclusive as possible
- Intra-Island middleware
  - Monitoring framework (MIT)
  - Machine-learning optimizer (Northwestern/MIT)
  - Data mover (Chicago, UW)
  - Query rewriter (Northwestern, UW)
  - Myria island (UW)
  - Spark island (MIT)



## **BigDAWG Research Program**

- Novel Storage Managers (for islands to integrate)
  - S-Store (MIT)
  - TileDB (MIT)
  - Tupleware (Brown)
- Novel User-interface systems (which call the thin middle)
  - ScalaR/ForeCache (MIT)
  - SeeDB (MIT/UIUC)
  - VizDom (Brown)
  - Searchlight (Brown)



# **BigDAWG Stack**

- All of this stuff
- Plus Postgres, Accumulo, SciDB
- Open Source
- Available on Github in a few months (as soon as we make it reliable and usable)
  - In staged releases (Bulldog, Rotweiller, Pit Bull)



### So Why Not Just Use Hadoop?

- Map-Reduce is good for nothing
  - Is being effectively jettisoned from the Hadoop stack
- Systems built on top of HDFS (e.g. Impala) can be be integrated into BigDAWG islands



# So Why Not Just Use Spark?

- Spark is not currently location transparent
  - Matei is looking at this
  - I.e. making Spark an island
- Spark has limited scope (analytics)
  - No OLTP
  - No text



## So Why Not Just Use Spark?

#### • Spark has serious architecture issues

- Always a good idea to send the query to the data (push all possible functionality into storage managers)
- Not bring the data to the query (do queries in middleware)
- Spark does the latter loses to SciDB by X20 on joins
- Spark supports only column representation and row representation
  - Killed on analytics by an array store



# **The Big Kahuna**

- BigDawg currently assumes:
  - The data "integration-ready" i.e. is not a legacy structure which needs curation
- I.e. appropriate for new applications not Alastair's RBS problem



# **Data Curation**

- Ingest
- Clean (-99 means null)
- Transform (Euros to dollars)
- Schema integrate (bottom up or top down)
- Entity consolidation (M.Stonebraker and Mike Stonebraker are the same entity)



# **Typical Curation (e.g. Tamr)**

- Does curation with a human assist when necessary
- Using a push-based architecture
  - Data sources shoved through a workflow



# **The Big Kahuna**

- Integrate BigDawg (pull-based architecture) with curation
- Plus discovery and privacy
- Future focus of our ISTC

