



Parquet

**If you have your own Columnar format,
stop now and use Parquet**



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Principal Architect, Dremio
VP Apache Parquet



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About Dremio

- Enabling self-service data discovery, exploration and analysis on modern data
- Founded in June 2015
- Building on open source technologies including Drill, Parquet, Spark

Top Silicon Valley VCs



Tomer Shiran
Founder & CEO

- Apache Drill Founder
- MapR (VP Product); Microsoft; IBM Research
- Carnegie Mellon, Technion



Jacques Nadeau
Founder & CTO

- Apache Drill PMC Chair
- Recognized SQL & NoSQL expert
- Quigo (AOL); Offermatica (ADBE); aQuantive (MSFT)



Julien Le Dem
Architect

- Apache Parquet Founder
- Apache Pig PMC Member
- Twitter (Lead, Analytics Data Pipeline); Yahoo! (Architect)



Background of Parquet

- **Twitter's data**
 - Lots of data: Instrumentation, User graph, Derived data, ...
 - Complex: deeply nested structures
- **Analytics infrastructure:**
 - Several 1000s nodes Hadoop clusters
 - Log collection to HDFS in Thrift
- **Parquet**
 - Columnar: space and query efficient
 - Inspired from the Google Dremel Paper
 - supports complex data
 - interoperable

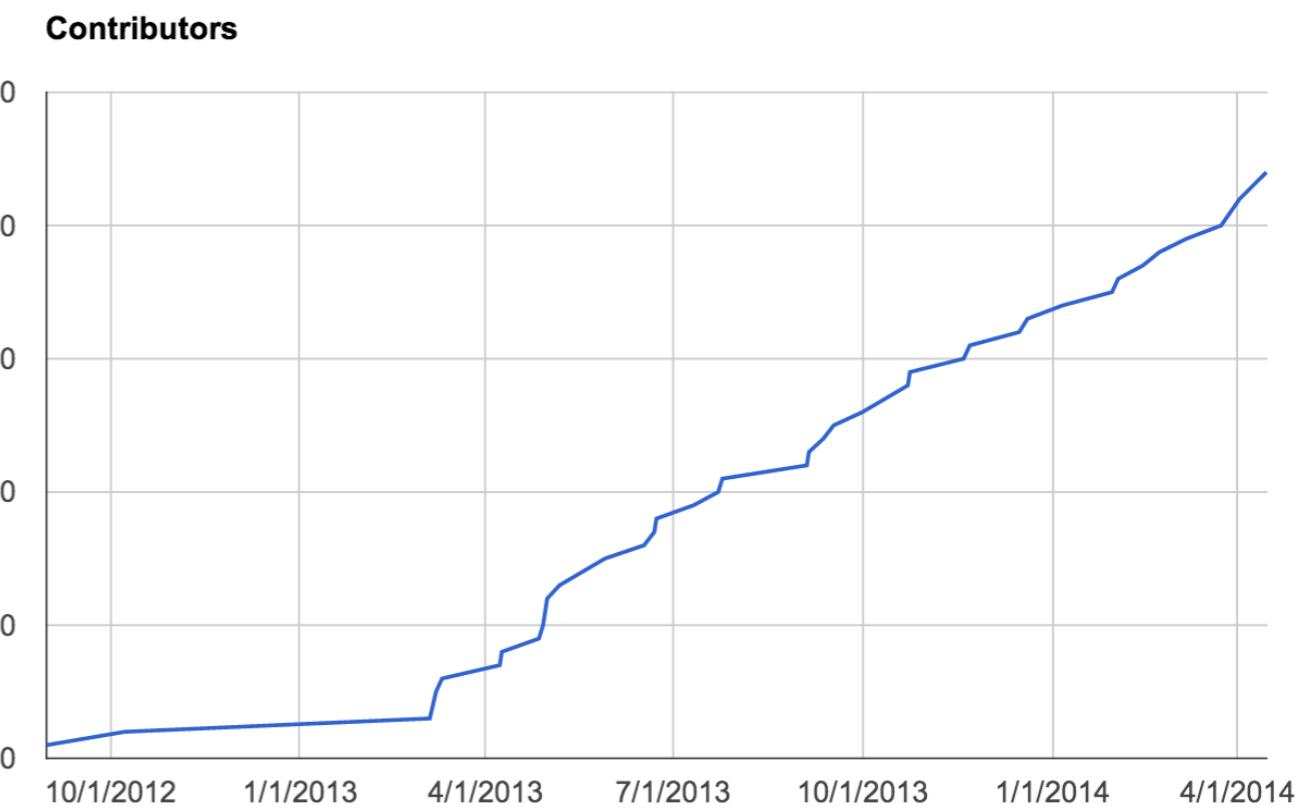


Caillebotte: The Parquet Planers



Parquet timeline

- **Fall 2012:** Twitter & Cloudera's Impala team merge efforts to develop columnar formats.
- **March 2013:** OSS announcement; Criteo signs on for Hive integration.
- **July 2013:** 1.0 release. 18 contributors from more than 5 organizations.
- **August 2013:** Drill chose Parquet as its primary storage format.
- **May 2014:** Apache Incubator. 40+ contributors, 18 with 1000+ LOC. 26 incremental releases.
- **Apr 2015:** Parquet graduates from the Apache Incubator.



What does Parquet do?



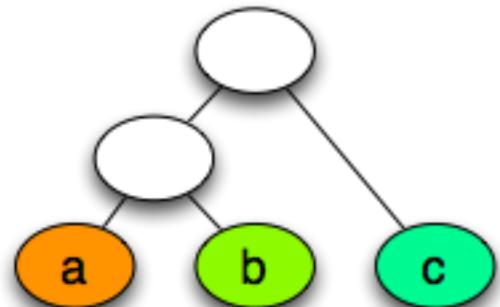
Interoperability

Space efficiency

Query efficiency



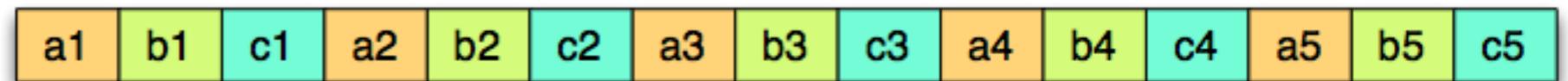
Columnar storage



On Disk:

Nested schema

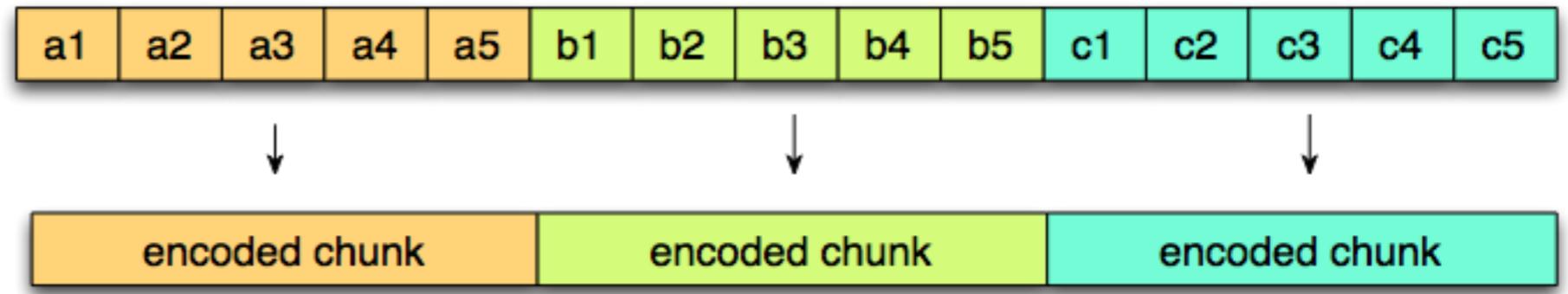
Row layout



Logical table representation

a	b	c
a1	b1	c1
a2	b2	c2
a3	b3	c3
a4	b4	c4
a5	b5	c5

Column layout



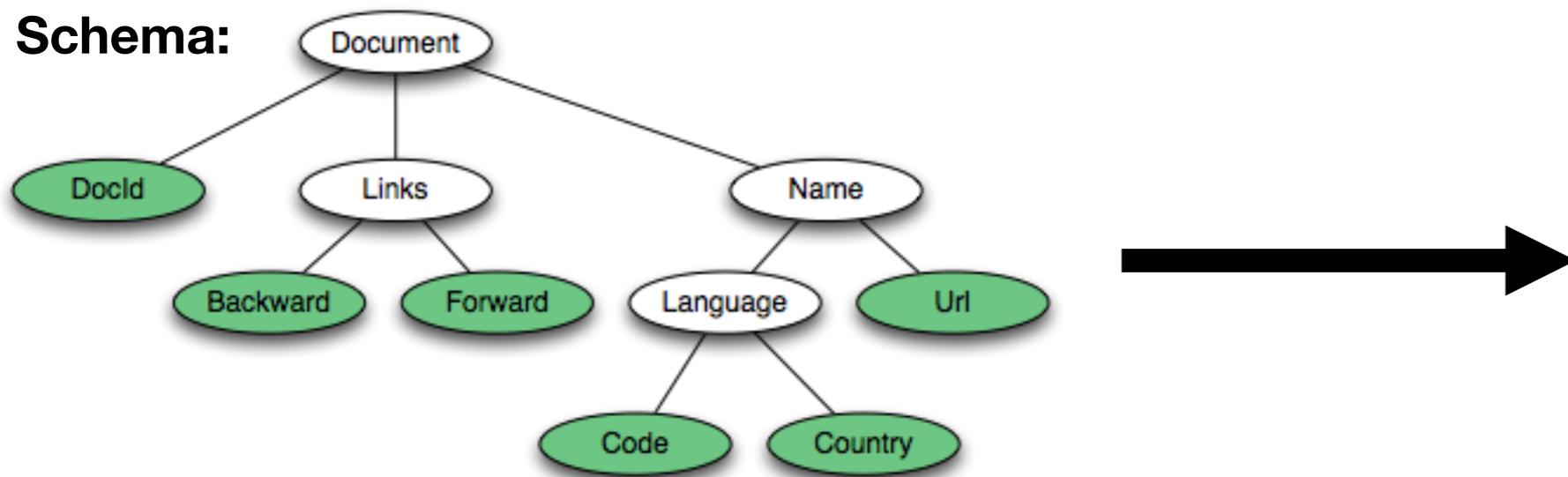
Encodings: Dictionary, RLE, Delta, Prefix



Nested representation

Borrowed from the Google Dremel paper

Schema:



Columns:

docid
links.backward
links.forward
name.language.code
name.language.country
name.url

<https://blog.twitter.com/2013/dremel-made-simple-with-parquet>



Statistics

Vertical partitioning
(projection push down) + Horizontal partitioning
(predicate push down) = Read only the data
you need!

a	b	c
a1	b1	c1
a2	b2	c2
a3	b3	c3
a4	b4	c4
a5	b5	c5

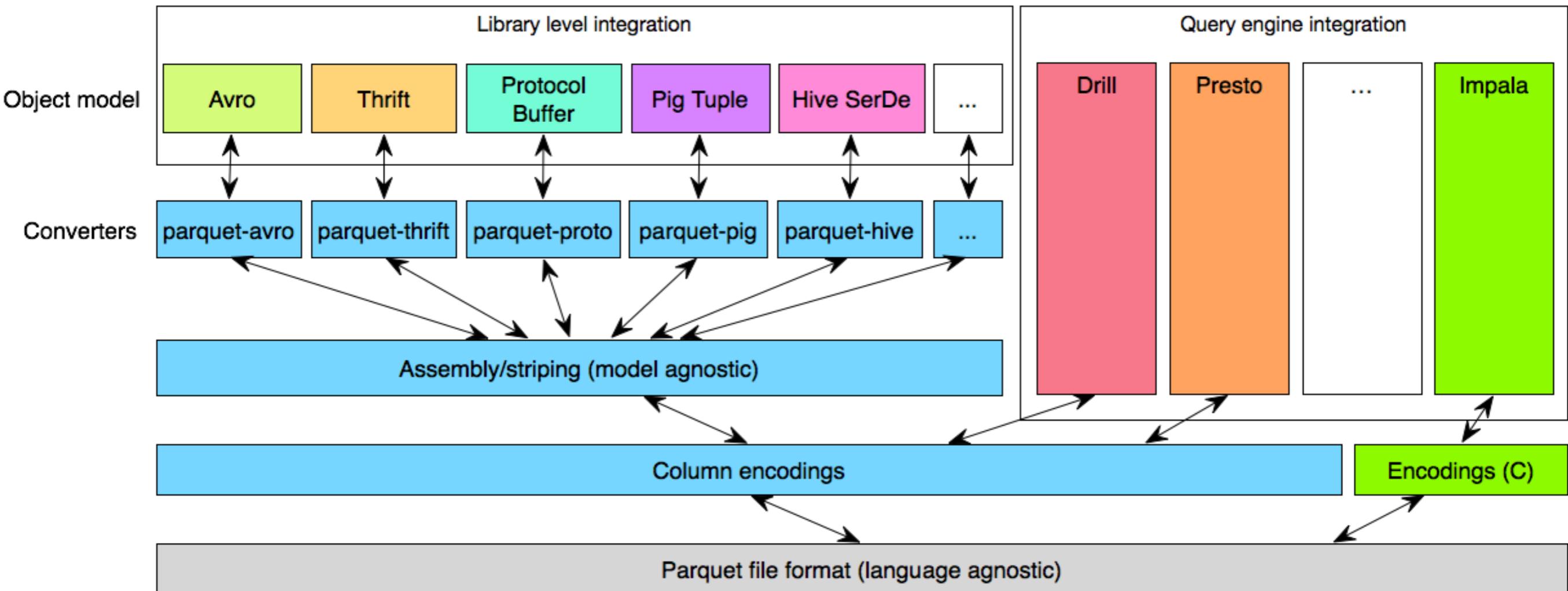
+ =

a	b	c
a1	b1	c1
a2	b2	c2
a3	b3	c3
a4	b4	c4
a5	b5	c5

a	b	c
a1	b1	c1
a2	b2	c2
a3	b3	c3
a4	b4	c4
a5	b5	c5



Interoperability



Query engines, frameworks and libraries integrated with Parquet (non exhaustive)

Query engines:

Hive, Impala, HAWQ,
IBM Big SQL, Drill, Tajo,
Pig, Presto, SparkSQL

Frameworks:

Spark, MapReduce, Cascading,
Crunch, Scalding, Kite

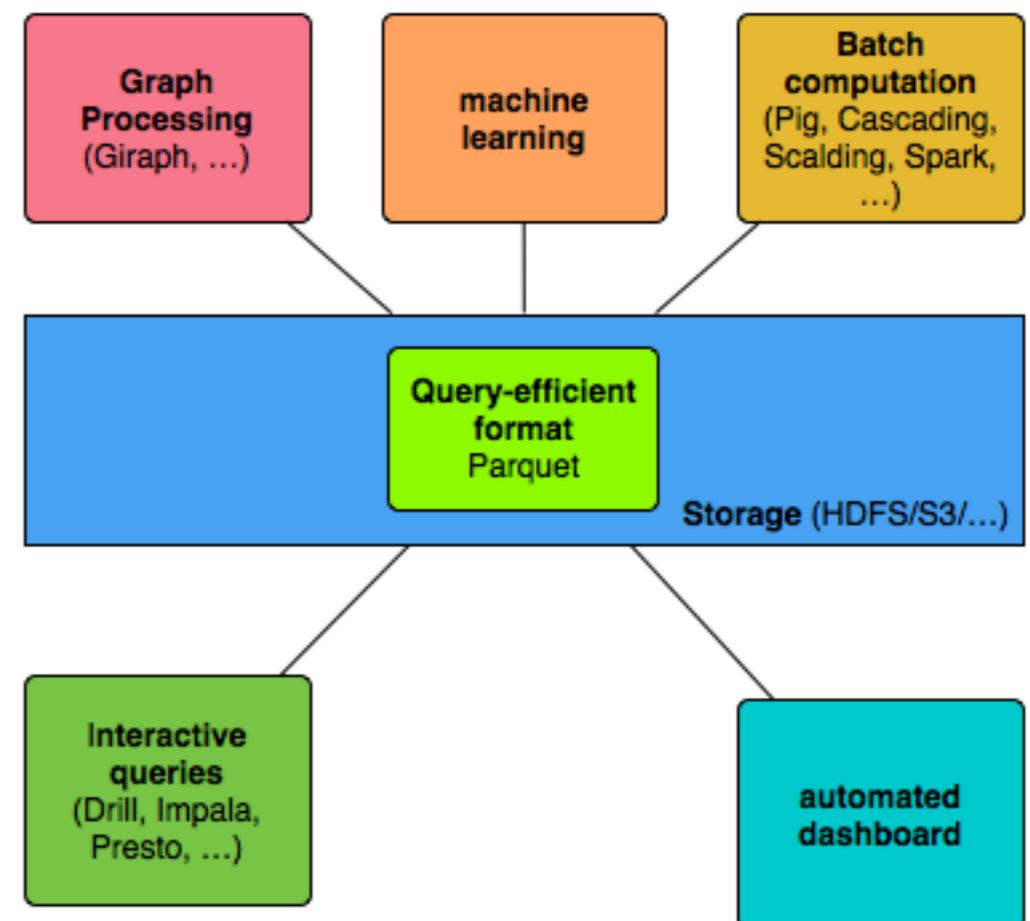
Data Models:

Avro, Thrift, ProtocolBuffers,
POJOs



Loose coupling

- Users don't want to load their data into every tool.
- Many tools are available and show up every day.
- The cost of trying a new tool should be minimal



Get involved

Twitter:

- @ApacheParquet

Mailing list:

- dev@parquet.apache.org

Github repo:

- <https://github.com/apache/parquet-mr>

Parquet sync ups:

- Regular meetings on google hangout

