

Financial Data Professional (FDP) The *Global Designation* for Finance Professionals in a Data-Driven Industry

### Intro To Alt Data



Ronan Crosson, CFA Director, Data Strategy and Analytics



Thomas Combes Head of Data Science



Keith Black, Ph.D., CAIA, CFA, FDP Managing Director, Content Strategy, CAIA



Mirjam Dekker PM FDP Institute







#### The Global Designation for Finance Professionals in a Data-Driven Industry

#### The FDPi was created by CAIA to

- ✓ Provide financial professionals with the knowledge necessary to succeed in an industry disrupted by the advent of big data and machine learning.
- ✓ Advocate for the highest levels of professional ethics and standards.
- Establish the FDP Charter as a global professional designation in the area of financial data science.



#### EARN YOUR FDP DESIGNATION

A globally-recognized charter is awarded to FDP charter holders



#### **TWO ONLINE CLASSES\***

- Choose either Python or R
- Can be completed before or after the exam



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Offered twice per year March & November

#### VALUE ADD



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#### **FDP EXAM**

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- 2. Machine Learning: Introduction to Algorithms
- 3. Machine Learning: Regression, Support Vector Machine & Time Series Models
- 4. Machine Learning: Regularization, Regression Trees, Random Forest & Overfitting
- 5. Machine Learning: Classification & Clustering
- 6. Machine Learning: Performance Evaluation, Backtesting & False Discoveries
- 7. Data Mining & Machine Learning: Naïve Bayes & Text Mining
- 8. Big Data & Machine Learning: Ethical & Privacy Issues
- 9. Big Data & Machine Learning in the Financial Industry

A self-study program developed by financial professionals, for financial professionals.

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 Exam Day: December 1, 2020

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# Agenda

- About Eagle Alpha
- The Growth in Alternative data
- Building an Alternative Data Strategy
- Data Quality:
  - Challenges of Working with Alternative Data
  - When data formats break your parser
  - Eagle Alpha's Backend Process
  - Demo of Findings on Alternative Datasets
- Closing Remarks



#### **Speakers**



Ronan Crosson, CFA Director, Data Strategy and Analytics in

Investment experience: 16.5 yrs Alternative data experience: 5.5 yrs

Ronan leads the analyst team and overseas Eagle Alpha's Data Strategy solution.

Ronan's background is as a senior analyst in State Street Global Advisors and he has a postgraduate diploma in Data Analytics.



Thomas Combes Head of Data Science

in

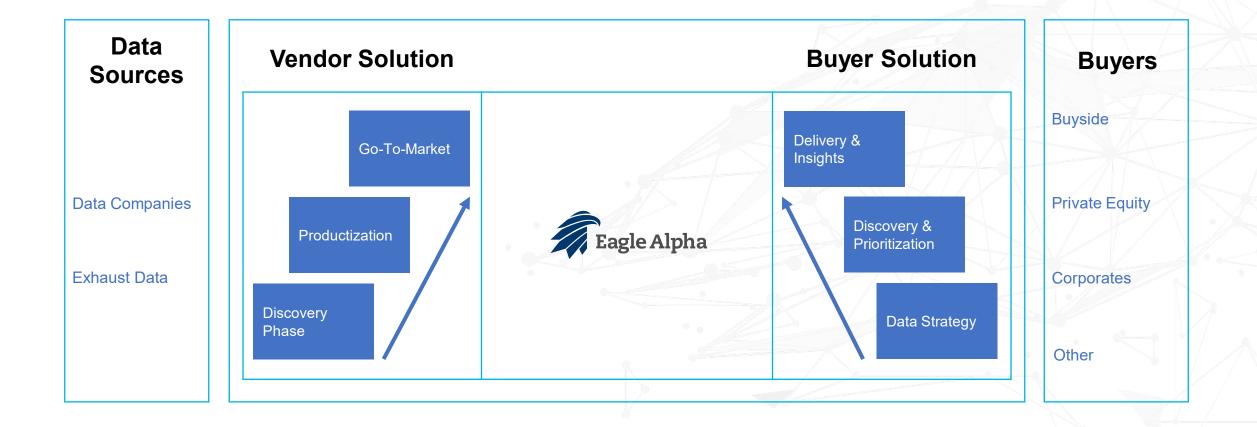
Aerospace Engineer: 6.5 yrs Data Scientist: 3 yrs

Thomas leads the Data Science team, which builds data products and tests 3<sup>rd</sup> party datasets for quality and robustness.

Thomas previously worked at Boeing developing software for real-time, large-scale analysis of flight test data.

Thomas.combes@eaglealpha.com

#### Eagle Alpha Has Been A Pioneer In The Alternative Data Space Since 2012



# Eagle Alpha 's Data Credentials are Validated By Leading Wall Street Firms ...

#### May 2020



#### The Data on Data

#### May 2020

In this day and age, data is often referred to as the oil that fuels the investment machine. Some go as far as tagging the search for alternative data as the new oil rush. In this article, we attempt to examine the growth and trends in alternative data, whilst also presenting various challenges and insights into how investment managers can adopt it to unlock its value. In summary: what is the 'data on data'?

For institutional investor, qualified investor and investment professional use only. Not for retail public distribution.

Man Group views our database of alternative datasets as market leading. It selected Eagle Alpha as a co-author on a paper entitled 'The Data on Data. Extract: "in today's day and age, data is often referred to as the oil that fuels the investment machine. Some go as far as tagging the search for alternative data as the new oil rush. We look at the data on data to find out what really matters in this new boom".

#### 2019 & 2020

### J.P.Morgan

J.P Morgan's quantitative research team views our proprietary data quality testing tool as world-class. It invited us to give workshops to its clients in Boston, New York, London and Sydney between October 2019 and March 2020

#### October 2019



J.P. Morgan quantitative research team has published two major reports on big data. Both feature Eagle Alpha.

#### Since 2018



Since 2018 J.P. Morgan's prime broking team has been the lead partner on all our conference (New York, London, Singapore, Hong Kong, Sydney, virtual).

#### March 2017



Citi published the first primer on alternative data. It contained a 10-page profile of Eagle Alpha.





Eagle Alpha introduced Jupiter to the world of alternative data. They navigated us through the taxonomy, helped us think about how we might use alternative data across our business, introduced us to a wide range of data providers and educated our investment teams in possible ways of extracting value from alternative data. They even helped us think through what would be needed to evolve our own data science capability within the firm. Eagle Alpha's insights, experience and contacts have been invaluable to us.

- Magnus Spence, Head of Investments (Alternatives)

https://www.jupiteram.com/



Eagle Alpha has provided substantial insight into new frontiers of alternative data and through our partnership with them we have been able to dramatically scale our footprint in this critical component of our research.

- Mani Mahjouri, CEO (#12 hire at AQR)

https://www.blueshift.am/

#### 

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We recognize the increasing importance of alternative data to the trading industry, and feel that Eagle Alpha is prime placed to help firms capitalize on this. Emmett and his team have a broad and integrated business plan that allows clients to get the best from the space, across a number of areas. We feel that Eagle Alpha is also marked out by the high quality of its personnel, and we have been impressed with the strength and depth of their team and the value they can bring to the investment process. We have been actively partnering with the EA business for some time, and are looking forward to this next step and continuing to watch the business succeed.

- Chris Udy, CEO

#### BRIGHTRIVER

https://www.tibra.com/

Eagle Alpha has been an invaluable ally as my firm has integrated alternative data into our private equity investment process. The due diligence solution in particular is an innovative way to meet our alternative data needs, which are different from public markets investors. I've appreciated Eagle Alpha's active engagement with us to understand our needs and develop the solution. It's the only solution of this type I've seen in the market.

- Wesley Barnes, CEO

# The Growth of Alternative Data

# Alternative data is defined as non -traditional data that can be used to augment decision making.

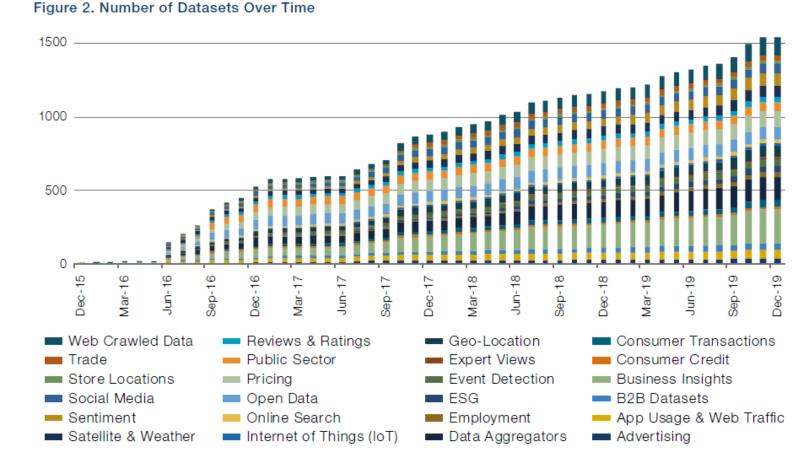
- Eagle Alpha was the first company to create a taxonomy of "alternative" data.
- There are currently 26 categories of data in Eagle Alpha's taxonomy: 24 nontraditional data categories and 2 traditional categories.



Note: numbers in the chart reflect the number of dataset profiles in the category as at 13 July 2020. A dataset may be included in more than one dataset category.



### There are currently over 1,355 in Eagle Alpha's database. This is expected to grow to 5,000 by 2024.

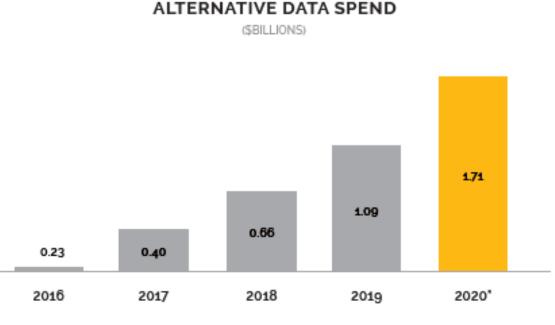


 Geographical distribution of datasets: US: 55%, EMEA: 30% and APAC: 15%.

Source: Eagle Alpha; As of December 2019. Datasets are split into Eagle Alpha categories<sup>1</sup>.



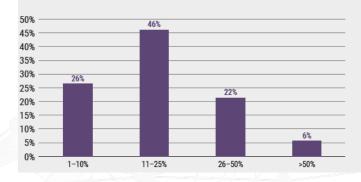
# Alternative Data Spend Is Estimated At >\$1bn In 2019; Budgets Growing Rapidly But Adoption <50%



\* FORECASTED

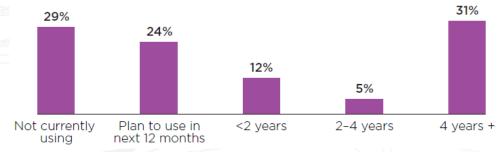
Source: Element 22/UBS "ANALYTICS POWER 2019" report

By what percentage does your organization plan to increase its budget?



**Source:** Lowenstein Sandler "Alternative Data = Better Investment Strategies, But Not Without Concerns" report (2019)

#### LENGTH OF TIME USING ALTERNATIVE DATA



Source: Greenwich Associates 2019 Alternative Data Study



### The Ranking Of Most Popular Datasets Varies By Manager Style

38% 38%

38%

38%

36%

45%

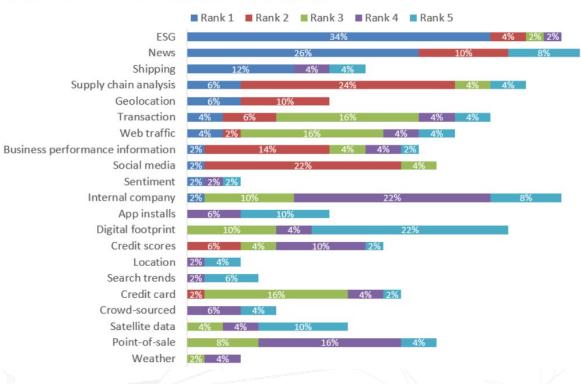
#### **Discretionary Funds**

#### USAGE OF ALTERNATIVE DATA SETS

Web-scraped data	21%				24	
Crowd-sourced data	17%		21%			
Credit cards and POS systems	14%		24	4%		
Social media sentiment	14%		24	4%		
Search trends	12%		26%			
Web traffic	12%		24%			
Other supply chain data	17%		1		7%	
Energy production data	19%		10%		29%	
Business sector performance metrics			12%		26%	
Business transactions	14%		12%	26%		
Expert networks data	12%	1	14%		%	
Other logistics data	10%	11%	21%			
Consumer profiles	<mark>2%</mark> 19%	6	21%			
Weather	12%	7%	19%			
Satellite imagery/geospatial	7% 10	% 1	7%			
Shipping manifests/bills of lading	5% 12%	5 17	7%			
Technology data incl. component and infrastructure	5% 12%	1	7%			
Footfall and geolocation		% 14%				
Automotive production data, sale and ownership		% 14%				
App installs	5% 9%	14%				
Ocean vessel tracking	5% 9%	14%				
Wearables/Drones/IoT sensors	<mark>2%</mark> 5% 7%					
Other	<mark>2%</mark> 5% 7%					
	Currently usir	ng 📕 F	Plan to us	e		

#### Quant Funds

#### Alternative Content Rank by Value (Future)



Source: Greenwich Associates 2019 Alternative Data Study

Source: https://insight.factset.com/the-future-of-quantitative-analysis-data-sources



### Alternative Data Is Typically Used As A Complementary Input Into An Investment Process

#### MAIN USES OF ALTERNATIVE DATA



Source: AIMA "Casting the Net - How Hedge Funds are Using Alternative Data" report (2019)

#### For which of the following purposes do you use alternative data? (Select all that apply.)

To generate greater insights into a 75% particular sector, industry, or issues To provide additional support for findings or assumptions in fundamental research To understand competitive markets To develop unique investment strategies To predict volatility in financial markets To generate profits To improve business operations and internal risk management To generate higher returns 44% while managing risk To increase client acquisition/retention 10% 10% 20% 30% 40% 50% 60% 70% 80% 90% 0%

**Source:** Lowenstein Sandler "Alternative Data = Better Investment Strategies, But Not Without Concerns" report (2019)



### The ROI On Alternative Data Is Not Straight Forward To Measure

- ✓ Market spend on alternative data is growing at  $50-60\%^{1}$
- ✓ Buyside data budgets are growing 15-20%<sup>2</sup>
- ✓ Renewal rates on datasets are >80%<sup>3</sup>
- ✓ European hedge funds using AI returned almost triple the global industry average in the three years through May 2020.<sup>4</sup>



<sup>1 -</sup> Element 22/UBS "ANALYTICS POWER 2019" report

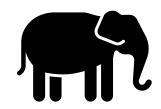
<sup>2 -</sup> Lowenstein Sandler "Alternative Data = Better Investment Strategies, But Not Without Concerns" report (2019)

<sup>3 -</sup> Eagle Alpha analysis

<sup>4 -</sup> Cerulli Associates research: https://www.institutionalinvestor.com/article/b1mssrswn1mpr0/AI-Powered-Hedge-Funds-Vastly-Outperformed-Research-Shows

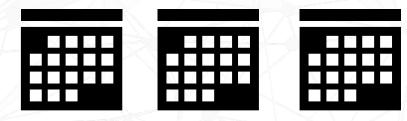
# Building an Alternative Data Strategy

### **Lessons From Alternative Data Early Adopters**



### Senior Management Buy-In

#### **Long-Term Investment**





**Involve Multiple Stakeholders** 



### **Recommended First Steps in Alternative Data**



1. Audit









### Data Quality: Challenges of Working with Alternative Data

### Knowing what you don't know – Data Quality

Alternative Data Universe	Pro filin g	Data Ingest	Quality Issues	Finding Alpha	Legal	Purchase

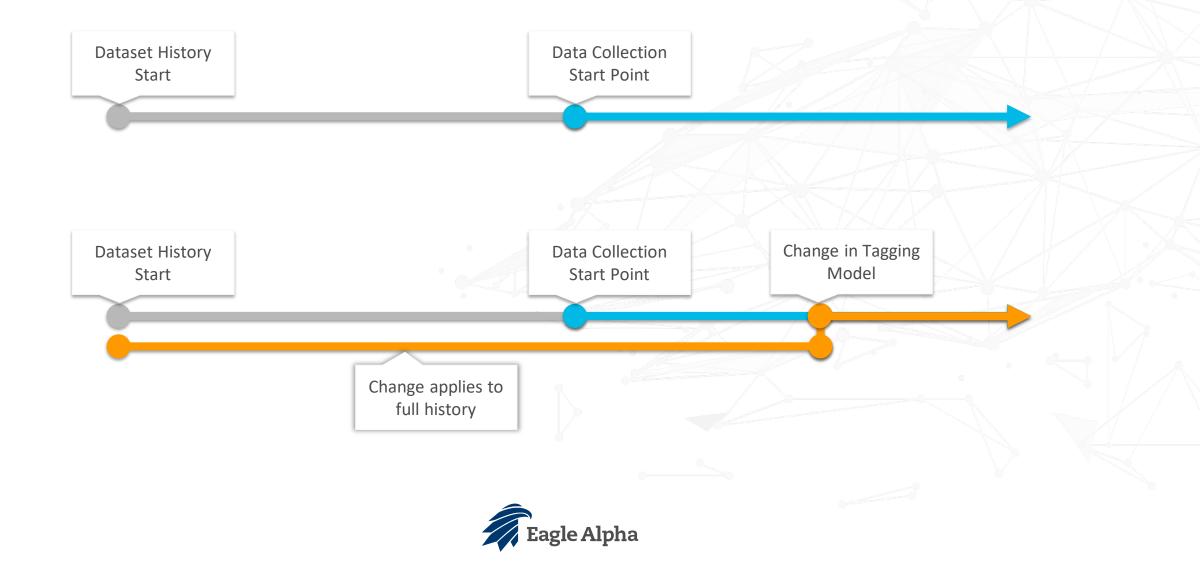


### **Data Assessment: the Trial Process**

- Trials typically use live data for a period of 3 months
- Data ingest and exploration often consume the first third of the trial period



### Data Buyer Challenges: Point -in-Time



### Data Buyer Challenges: Mapping Entities

Name	Ticker	Exchange Code
Filter	Filter	Filter
TESCO PLC	TSCO	XL
TESCO PLC	TSCO	XF
TRACTOR SUPPLY COMPANY	TSCO	UB
TESCO PLC	TSCO	BQ
TESCO PLC	TSCO	XA
TESCO PLC	TSCO	SW
TRACTOR SUPPLY COMPANY	TSCO	AV
TRACTOR SUPPLY COMPANY	TSCO	UA



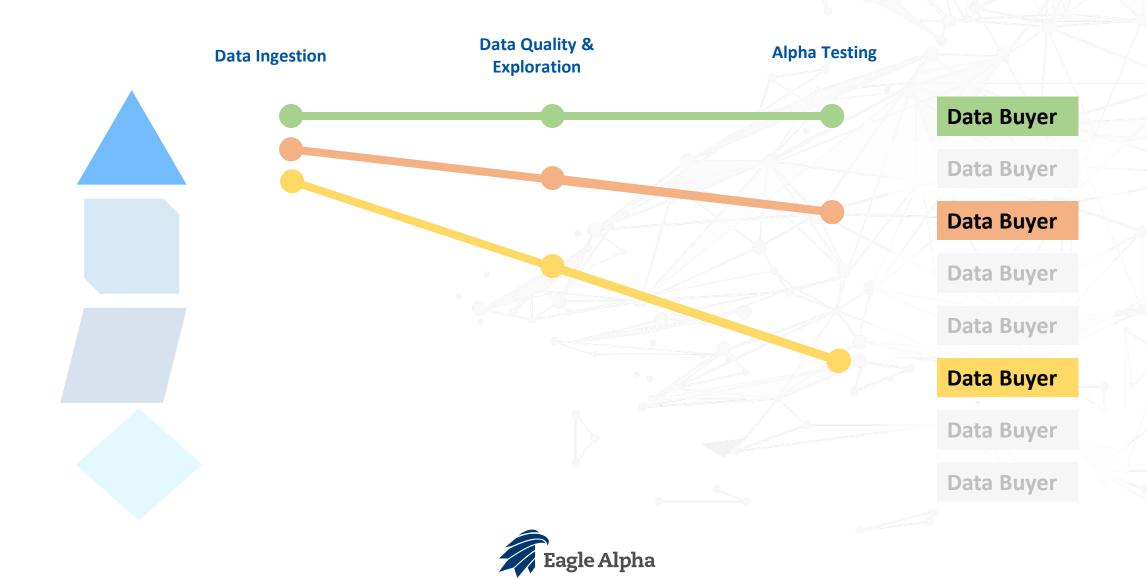
### Data Buyer Challenges: Data Delivery Issues

Week 1 Week 2 Week 3 Week 5 No Delivery 📈 Delivery Delivery Delivery Delivery ....

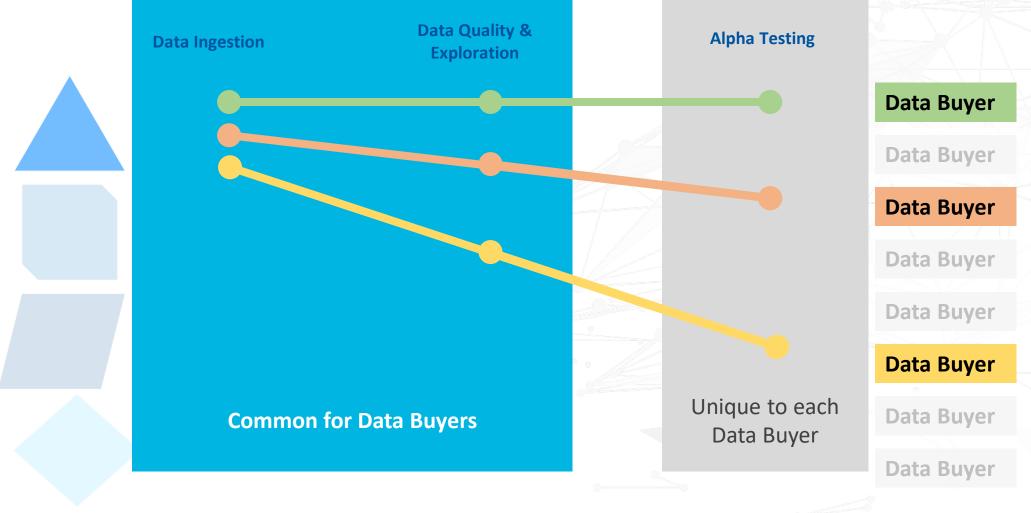
Week1:Week 2Week 3Week 4:Week 5Schema ASchema ASchema BSchema BSchema B					 			
Schema A / Schema A / Schema B Schema B Schema B Schema B	$\overline{\ }$	Week1:	Week 2	• Week 3	Week 4:	~	Week 5	
		Schema A	Schema A	Schema B	 Schema B	• / • • •	Schema B	



### Data Assessment Today

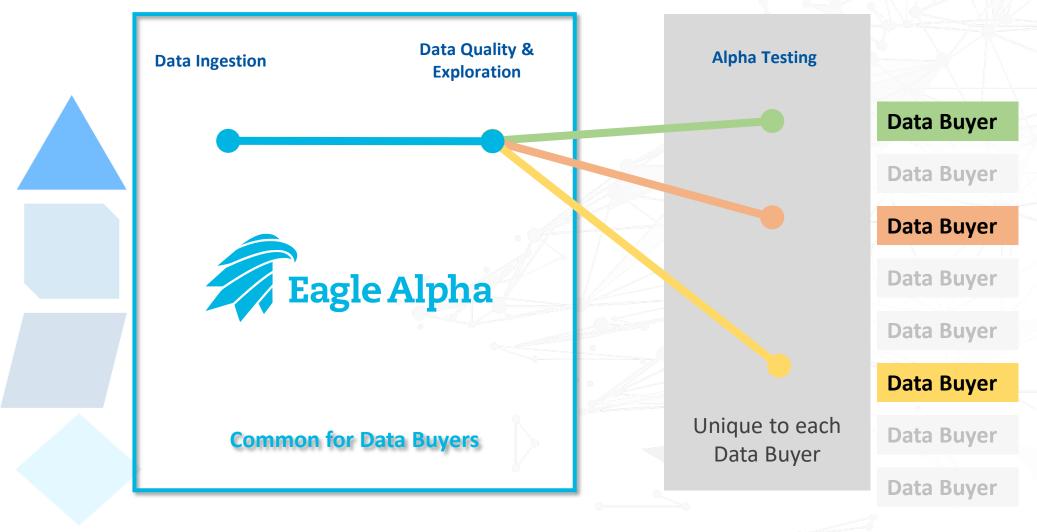


### **Analysis Commonality**



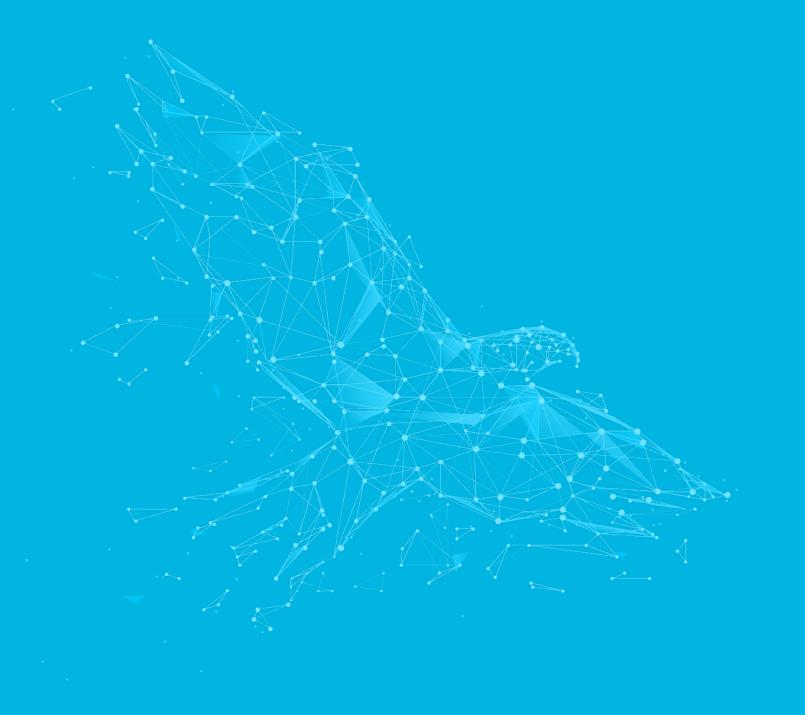


### Addressing a Common Problem in One Place









### **Pros and Cons of Different Dataset File Formats**

#### **Raw Text Formats**

- PSV Pipe delimited value file
- TSV Tab delimited value file
- CSV Comma delimited value file

\*When raw text appears in one of these formats, often you can accidentally push data into incorrect fields or onto new rows

#### XML: eXtensible Markup Language

• Require lots of memory, can be cumbersome – stay away

#### JSON

- JSON: JavaScript Object Notation
- Can requires lots of memory, JSON lines is better in this case

#### Columnar File Formats: Parquet, ORC

- Benefit from a defined association between a column and the data in that column (no confusion see above)
- Can be highly compressible if lots of repetition of column values such as categorical columns



### **Data Structure Horror Stories**

**Comma Delimited** 

Tab Delimited

File extension: TSV



### Dates and Times: What time is it?

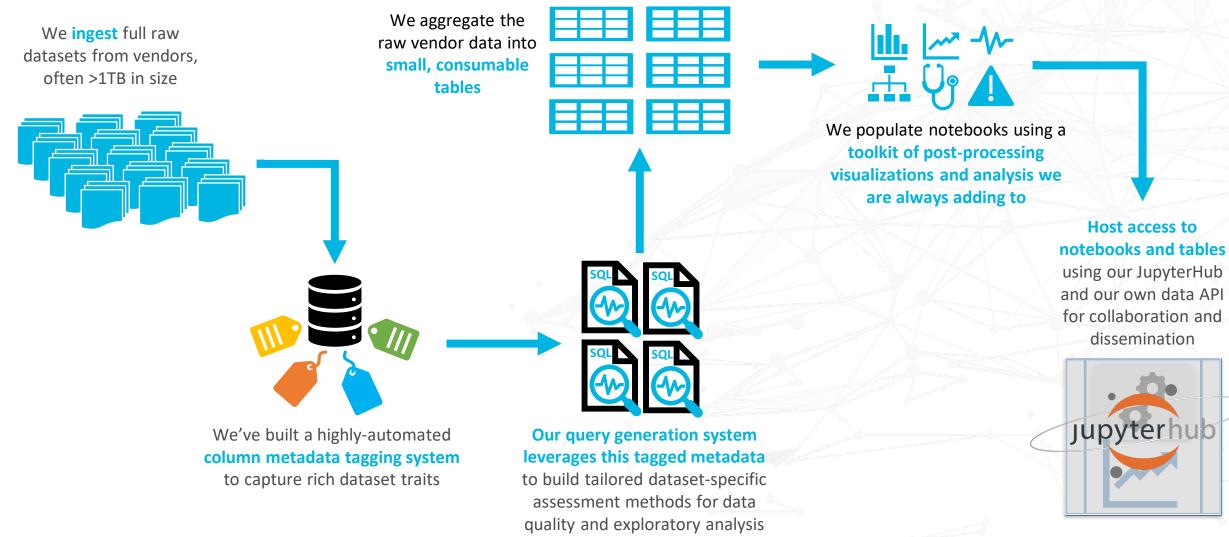


- ISO 8601 is great but few vendors appear to follow it: <u>https://en.wikipedia.org/wiki/ISO\_8601</u>
- Date types we have seen in datasets (equal to April 10<sup>th</sup> 2011):
  - European: 10/4/2011
  - United States: 4/10/2011
  - ISO 8601 Lexicographically sortable: 2011-04-10
  - ISO no dashes: 20110410
  - Year + Month spelled out: 2011Apr
  - Timestamp with timezones
  - Variable timezones with no reference to a fixed timezone (i.e UTC)
  - Unix time: 1302393600
  - Unix time milliseconds: 1302393600000
  - Year + Month + Day in multiple columns
  - Week of Year
- Never edit a CSV in Excel that has a time or date column
- Is this capture time, model prediction time, or publication time?





### **Eagle Alpha Data Quality Testing Process**





### Data on Data: why column -based metadata tagging is useful



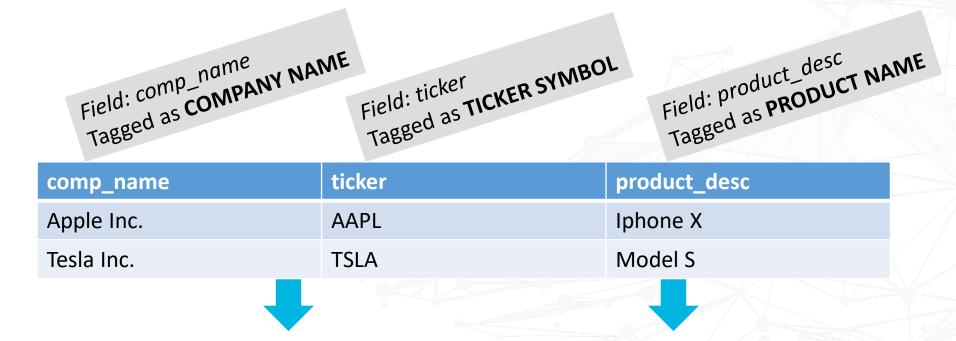
Input type identification

: beyond string, int, and float

- Categorical data
  - Ticker, Product name, user ID?
- Temporal data
  - Master time or a Start / Stop time?
- Metric data
  - Price, lat/long coordinates, unstructured text?
- Join logic between primary and reference tables
- Filtering logic to rank / limit values in a column
- **Tag = classification** for training machine learning systems



### **Constructing Training Sets by using Common Data Models**

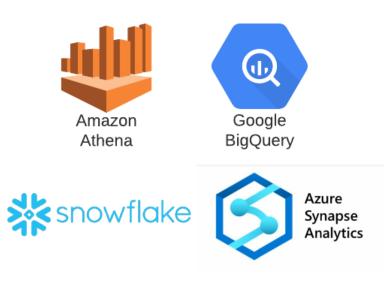


Company Name "Apple Inc." with Ticker symbol "AAPL" has a product named "Iphone X"

Company Name "Tesla Inc." with Ticker symbol "TSLA" has a product named "Model S"



### Cloud Query as a Service models: Pros and Cons

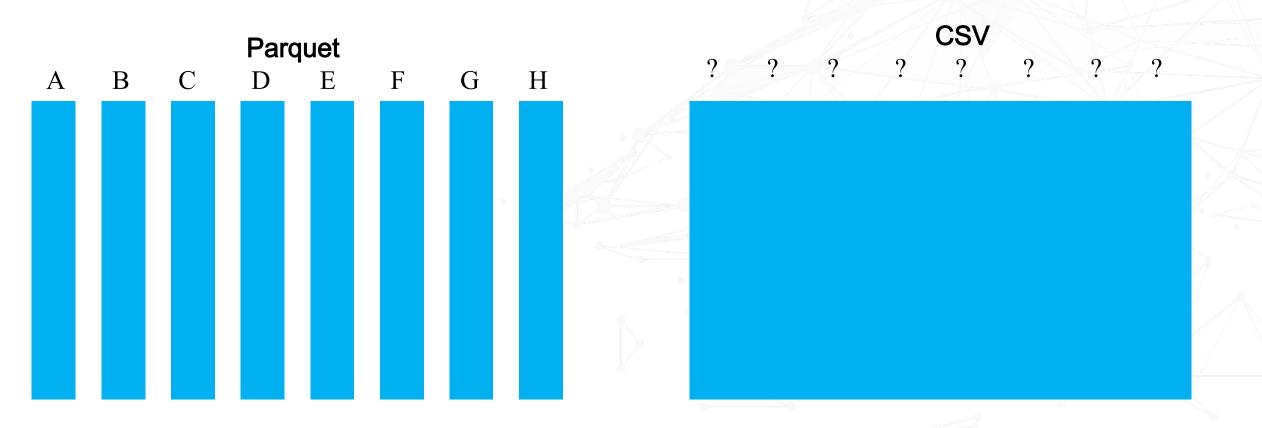


- Pros:
  - useful for ad -hoc or non -recurring queries scanning large data sources
  - Data stays in its original form
  - Focus on queries instead of the infrastructure coordination
- Cons:
  - Most cloud -based services are some form of pay by-data-scanned, which means scrutiny of each query is required so as not to explode costs



### Example Query Strategy: Columnar Stored (Parquet) vs. CSV

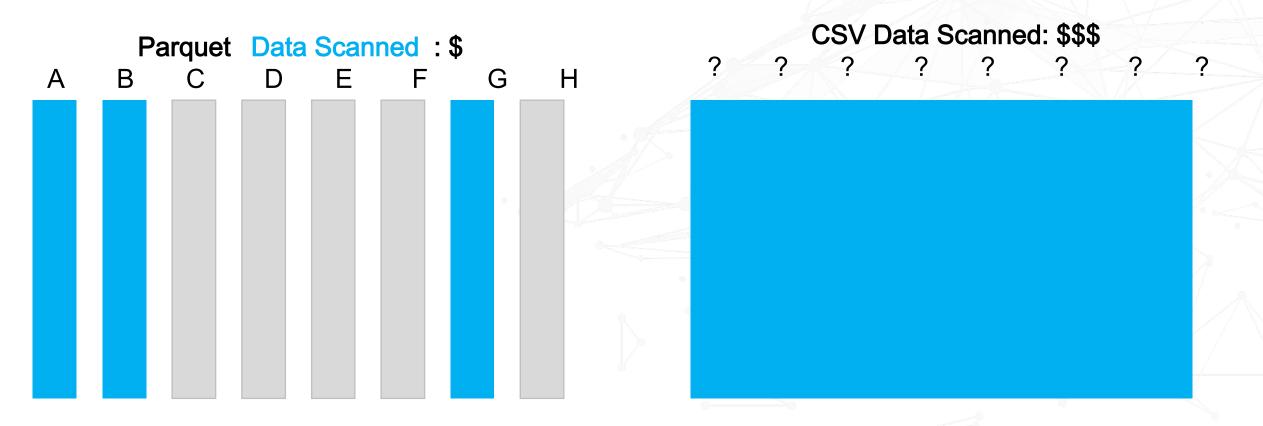
Query: Group By A, B, average G





#### Example Query Strategy: Columnar Stored (Parquet) vs. CSV

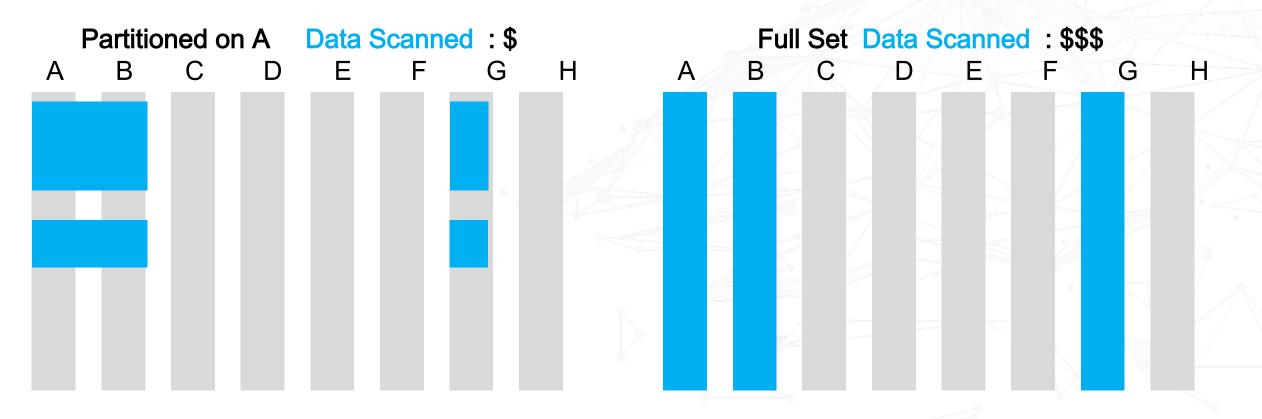
Query: Group By A, B, average G





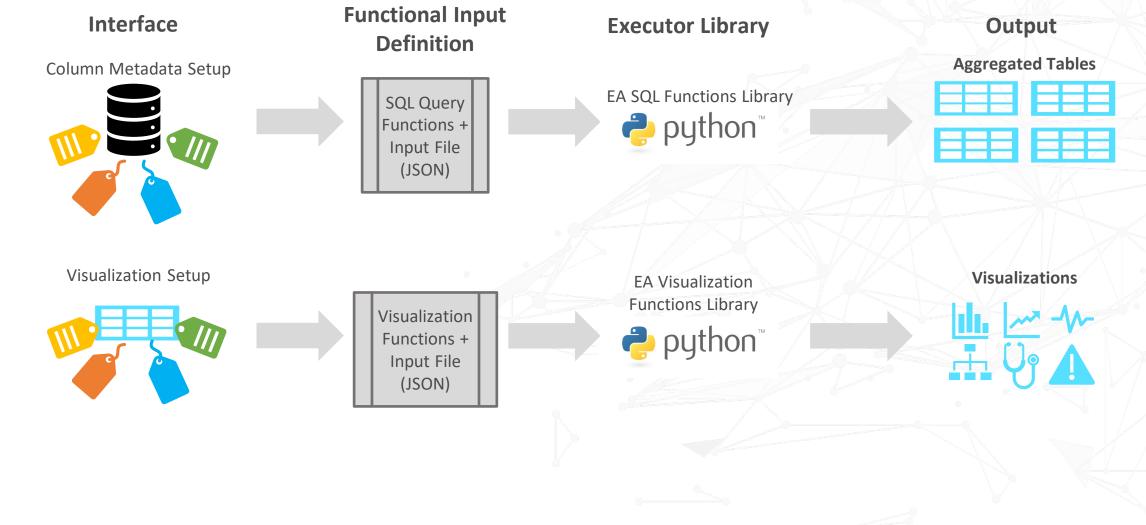
### Example Query Strategy: Partitioning Data before Querying

Query: Group By A, B, average G where A=Alpha

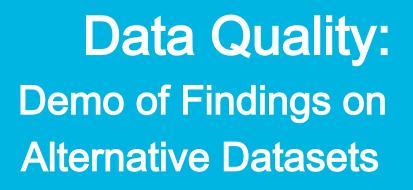




### Reproduceable Queries, Analysis, and Visualizations







# **Closing Remarks**

# **Closing Remarks**

- Alternative data is here to stay!
- Alternative data complements existing inputs
- Having an alt data plan is all important for success
- Not all data is created equal. Investing time in robust data quality testing is essential for alternative data.



• Join Eagle Alpha's Virtual Data Conference September 8th - 10<sup>th</sup>

#### Q&A Add your questions to the chat room





3 Half Days - 50 Alternative Data Industry Leading Experts Book 1-on-1 Meetings With Over 100 Vendors

September 8th - 10th 2020



AWS Data Exchange





October 2<sup>nd</sup> @ 11 am EDT



## In Closing



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Eagle Alpha

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