



Sigma Computing

EPIC Data Lab Retreat 2023

About

SaaS startup for cloud business data analytics

Founded in 2014

Sutter Hill Ventures + Rob Woollen & Jason Frantz

Series C, ~500 employees

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Sigma Workbooks

Spreadsheet for cloud data warehouses (CDWs)

Familiar, Scalable, Collaborative, Expressive

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Sigma Workbook: A Spreadsheet for Cloud Data Warehouses

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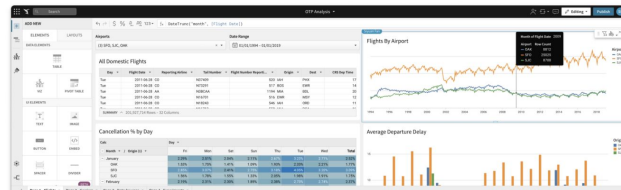


Figure 1: Sigma Workbook is an interactive workspace for analyzing enterprise-scale data in cloud data warehouses (CDWs). Its interface builds on spreadsheets while automatically compiling data operations to SQL queries and executing them on the CDW. Workbook enables users to benefit from the characteristics of SQL and CDWs using their knowledge of spreadsheets.

ABSTRACT

Cloud data warehouses (CDWs) bring large-scale data and compute power closer to users in enterprises. However, existing tools for analyzing data in CDWs are either limited in ad-hoc transformations or

1 INTRODUCTION

Enterprise data is increasingly stored in cloud data warehouses (CDWs) as they enable the storage of large-scale datasets with reliability and compliance guarantees while reducing costs. Business

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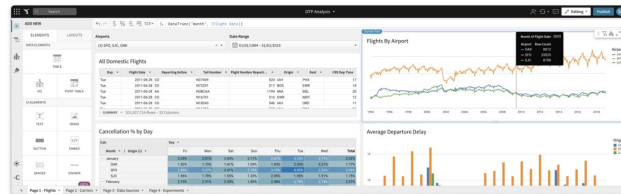


Figure 1: Sigma Workbook is an interactive workspace for analyzing enterprise-scale data in cloud data warehouses (CDWs).

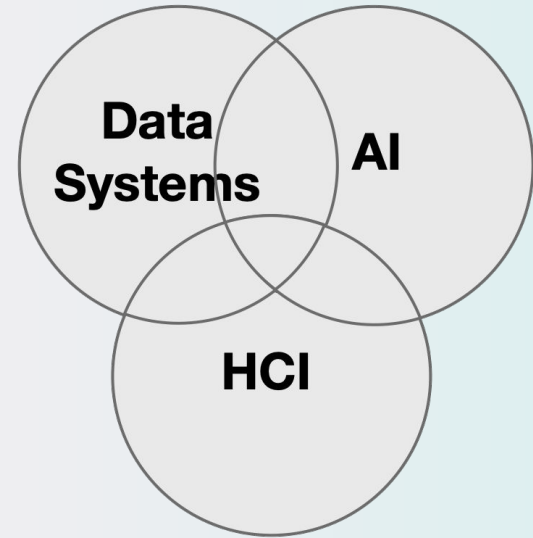
<https://www.sigmacomputing.com/free-trial>

Sigma Computing Research

Multidisciplinary [intelligent] data systems
research group

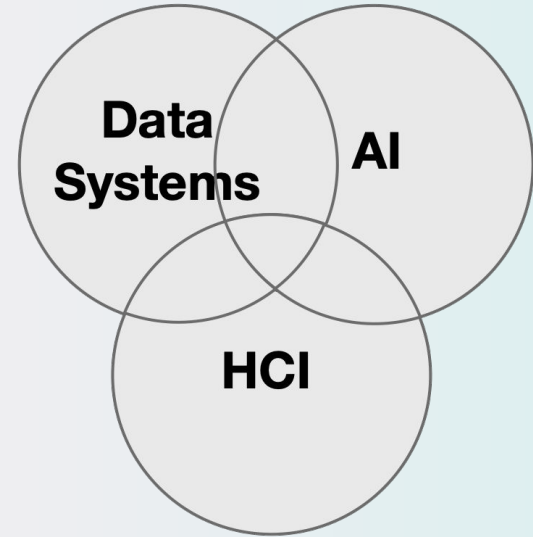
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Data Systems: Includes, e.g, databases, information retrieval, programming languages.

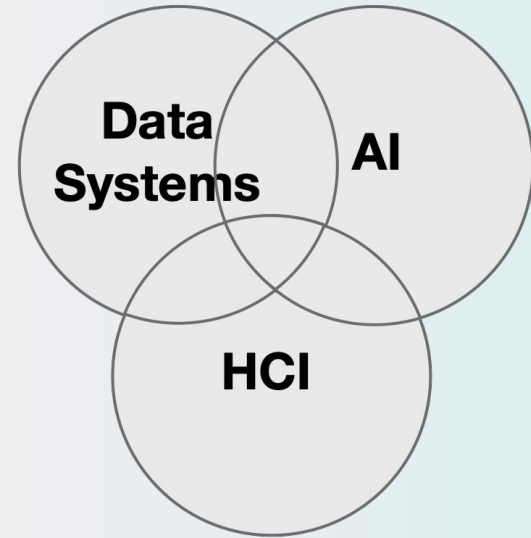
AI: Artificial intelligence, including machine learning (ML) and natural language processing (NLP).

HCI: Human-computer interaction, including data visualization and visual analytics.

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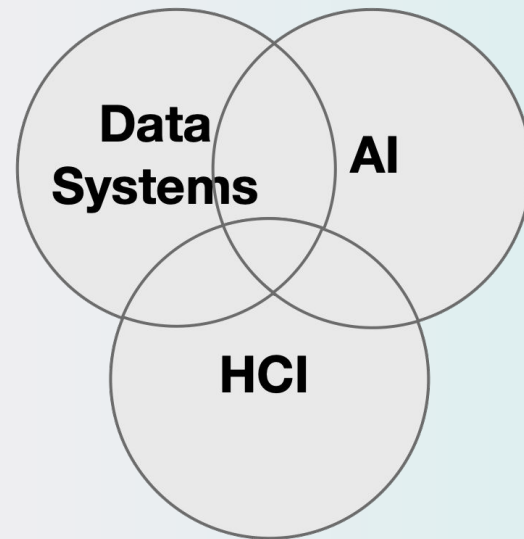
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Team

Alex Bäuerle Çağatay Demiralp Georg Menzl *Jim Gale*



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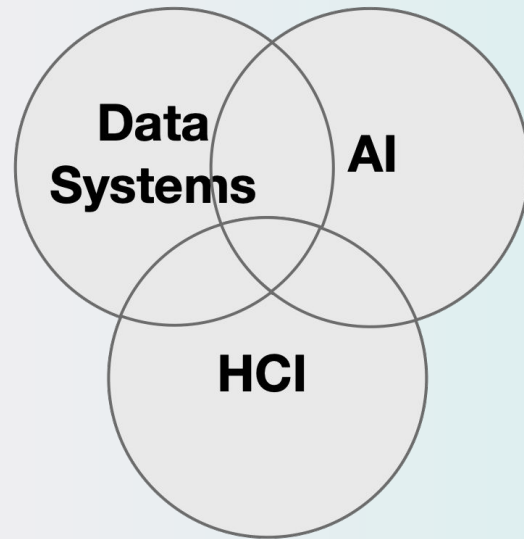
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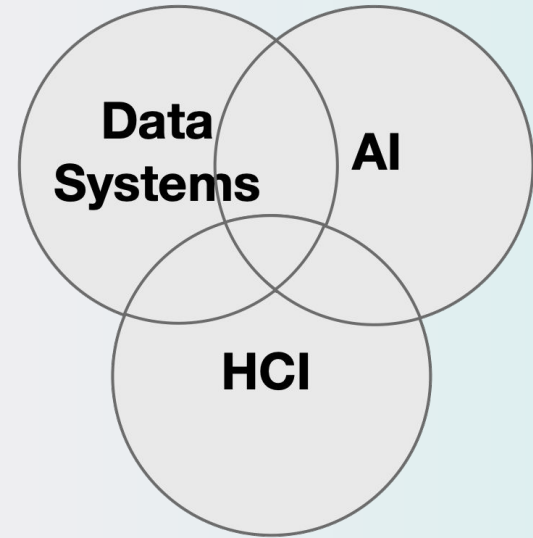
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Coming soon! <https://research.sigmacomputing.com>

Research Challenges & Opportunities

Usability

Performance

Discovery

Integration

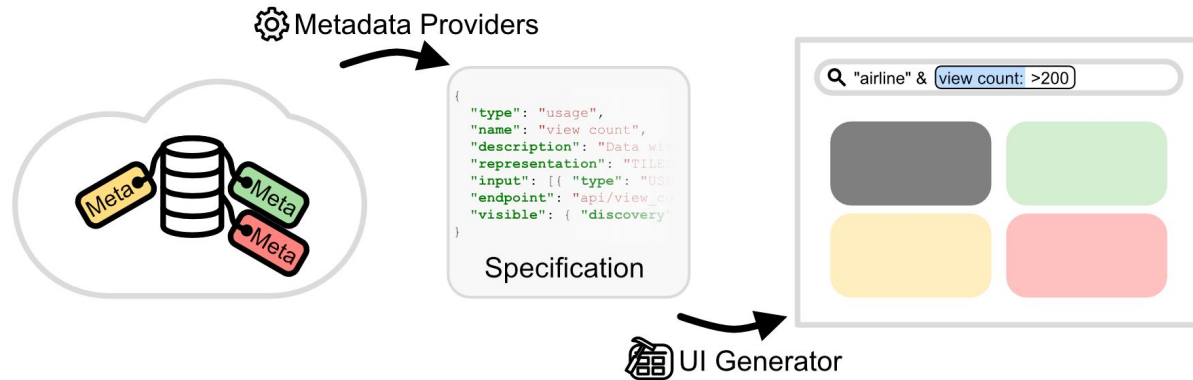
Administration

Infrastructure



Humboldt: Metadata-Driven Extensible Data Discovery

Joint work with Mike Stonebraker, MIT





Large number of tables + derived artifacts



**“Either you know where the data is
or you ask an expert who knows.”**



**“Either you know where the data is
or you ask an expert who knows.”**



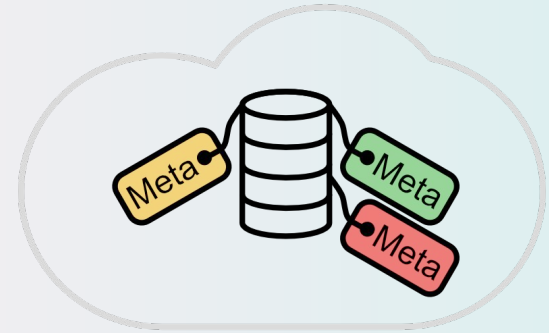
*“Anyone who can use a
spreadsheet can do data
analysis.”*

Data Discovery

Finding data first step to analysis

Metadata readily available

Manual process of visualizing data

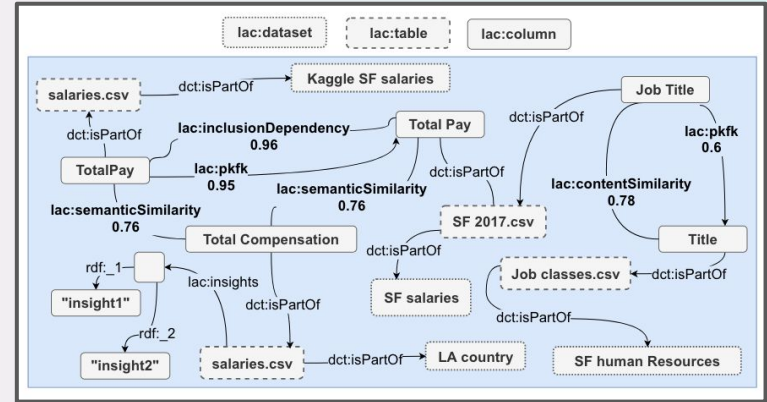


Data Relationships

Existing techniques to create data relationships.

Aurum¹, Seeping Semantics², KGLac³, WarpGate⁴, ...

People don't want to explore raw knowledge graphs or embeddings.



¹ Fernandez, Raul Castro, et al. "Aurum: A data discovery system." ICDE (2018).

² Fernandez, Raul Castro, et al. "Seeping semantics: Linking datasets using word embeddings for data discovery." ICDE (2018).

³ Helal, Ahmed, et al. "A demonstration of kglac: A data discovery and enrichment platform for data science." VLDB (2021).

⁴ Cong, Tianji, et al. "WarpGate: A Semantic Join Discovery System for Cloud Data Warehouse." CIDR (2022).

Metadata Providers

Methods to get data based on metadata

Best represented with different visualizations

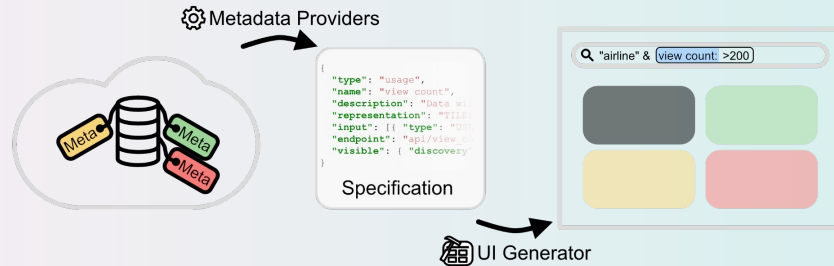
Require different input data



Humboldt

System framework to connect metadata with UI

Specification to generate UI automatically

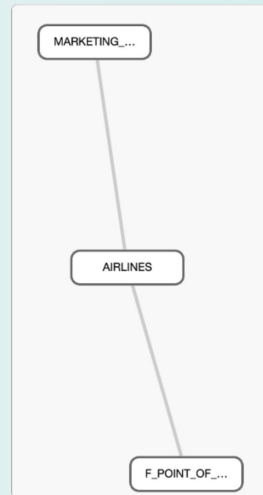


Specification-based UI

Specify parameters of the provider

Automatically generate a UI

```
{  
  "type": "joinable",  
  "name": "Name-Based",  
  "description": "Informs about joinable  
tables by looking at column names.",  
  "representation": "GRAPH",  
  "input": [  
    { "type": "TABLEID", "required": true }  
  ],  
  "endpoint": "api/name_joinability",  
  "visible": {  
    "discovery": true,  
    "search": true,  
  },  
}
```

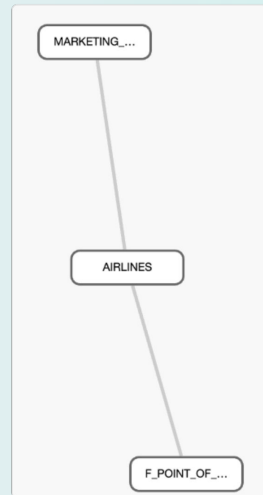


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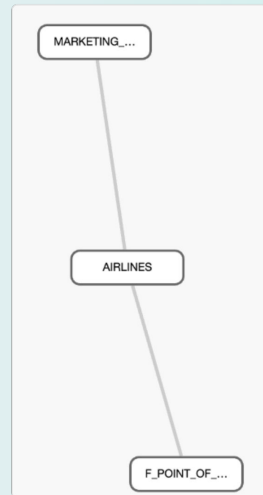


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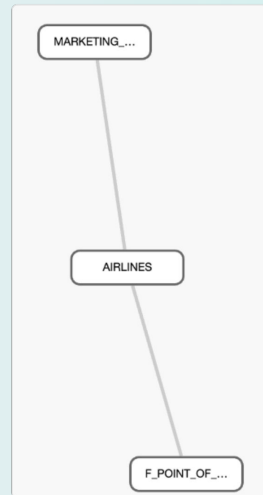
Specification-based UI

Specify parameters of the provider

Automatically generate a UI

No manual UI updates when changing or adding providers

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    "search": true,  
  },  
}
```





Tiles

AIRLINES ENDORSED 2 29

Bike Exploration ENDORSED ALEX BAUERLE

BITCOIN_PRICES 2 3

WEATHER 2

List

NAME	OWNER	LAST UPDATED
AIRLINES ENDORSED ★		10/11/2022
Bike Exploration ENDORSED ★	Alex Bäuerle	10/24/2022
STATIONS		10/12/2022

Hierarchy

AIRLINES ENDORSED 29

used in

- Up in the air! ALEX BAUERLE
- Which flight should I take? SISTER DORETTA

Graph



Embedding

References

ViewCount

BITCOIN_PRICES 2 3

CENSUS WARNING 2

WEATHER 2

Categories

▼ ENDORSED

NAME	OWNER	LAST UPDATED	LOCATION
AIRLINES ENDORSED ★		10/11/2022	Shared with me
Bike Exploration ENDORSED ★	Alex Bäuerle	10/24/2022	Shared with me

> NONE

Search & Filters

Informed by same specification

Can infer input variables and filter types



Configuration

Modify the specification

UI-based modifications

Teams / A Team Delete Team

A Team Edit

Home

Show	Name	Description
<input checked="" type="checkbox"/>	Team's Inodes	Provides a list of inodes for a selected team.
<input checked="" type="checkbox"/>	Combined	Provides a combined list of recommendations from different sources.
<input type="checkbox"/>	Recommended Documents	Provides a list of recommended documents.
<input type="checkbox"/>	Endorsed	Provides a list of items that have the endorsed badge.
<input type="checkbox"/>	Views and Derived	Provides an overview of data usage and the amount of derived artifacts.
<input type="checkbox"/>	Recent Documents	Provides a list of recently used documents.
<input checked="" type="checkbox"/>	Favorites	Provide a list of favorite data items.
<input type="checkbox"/>	Shared with Me	Provides a list of all items share with me.



Search and Filter

Owned By - ownership User: Alex Bäuerle X & Data Type - type Type: Workbook X

search category favorites lineage recommendations trash usage badged ownership type

Combined
Provides a combined list of recommendations from different sources. Combined

Bike Exploration ENDORSED
ALEX BÄUERLE

hackathon_plain
ALEX BÄUERLE

My Workbook Test
ALEX BÄUERLE

Python_Experiment
ALEX BÄUERLE

Bike Exploration Overview Open X

STATIONS

Id	Name	Lat	Long	Dock Count	City	Installation Date
2	San Jose Diridon Caltrain Station	37	-122	27	San Jose	2013-08-06 00:00:00
3	San Jose Civic Center	37	-122	15	San Jose	2013-08-05 00:00:00

- A
- B
- C
- D

User types

Sigma Experts

Work is repeated.

Hard to find and identify the data they are looking for.

User types

Sigma Experts

Work is repeated.

Hard to find and identify the data they are looking for.



Discovery UI
Filters & Search



“I don’t even know what to do.”

User types

Sigma Experts

Work is repeated.

Hard to find and identify the data they are looking for.

Sigma Novices

Don't know what data exists.

Don't know what to do with data.

User types

Sigma Experts

Work is repeated.

Hard to find and identify the data they are looking for.

Sigma Novices

Don't know what data exists.

Don't know what to do with data.



Tailored views for recommended data

Humboldt: Metadata-Driven Extensible Data Discovery



Alex Bäuerle, Çağatay Demiralp, and Michael Stonebraker

[Click](#) to see the demo



Questions?