Data Mesh

Was ist ein Datenprodukt?





Hi, Iam Jochem

Jochen Christ

Senior Consultant at INNOQ



L Java



Software Architecture



Data-driven Development





A data mesh architecture is a decentralized approach that enables domain teams to perform cross-domain data analysis on their own. At its core is the domain with its responsible team and its operational and analytical data. The domain team ingests operational data and builds analytical data models as data products to perform their own analysis. It may also choose to publish data products with data contracts to serve other domains' data needs.

adatamesh-architecture.com

Data Mesh Architecture Federated Governance Compliance Policy 8 Interoperabilit Documentation Policy Security Policy Privacy Policy 8 Policy Governance Group Domain Analytics 2 Consulting Domain Team Examples Operational Data Data Produc Data Data Contract Domain Best Domain Practices Data Product use Data Flow Enabling Team Usage Policy Automo Data Product Catalog Data Contract Monitoring Storage and Query Engine Automation Management datamesh-architecture.com

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O'REILLY®

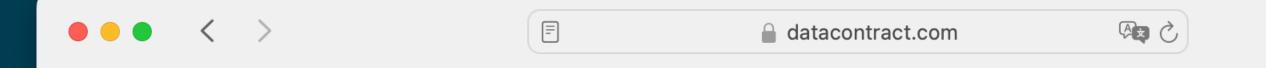
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Data Mesh

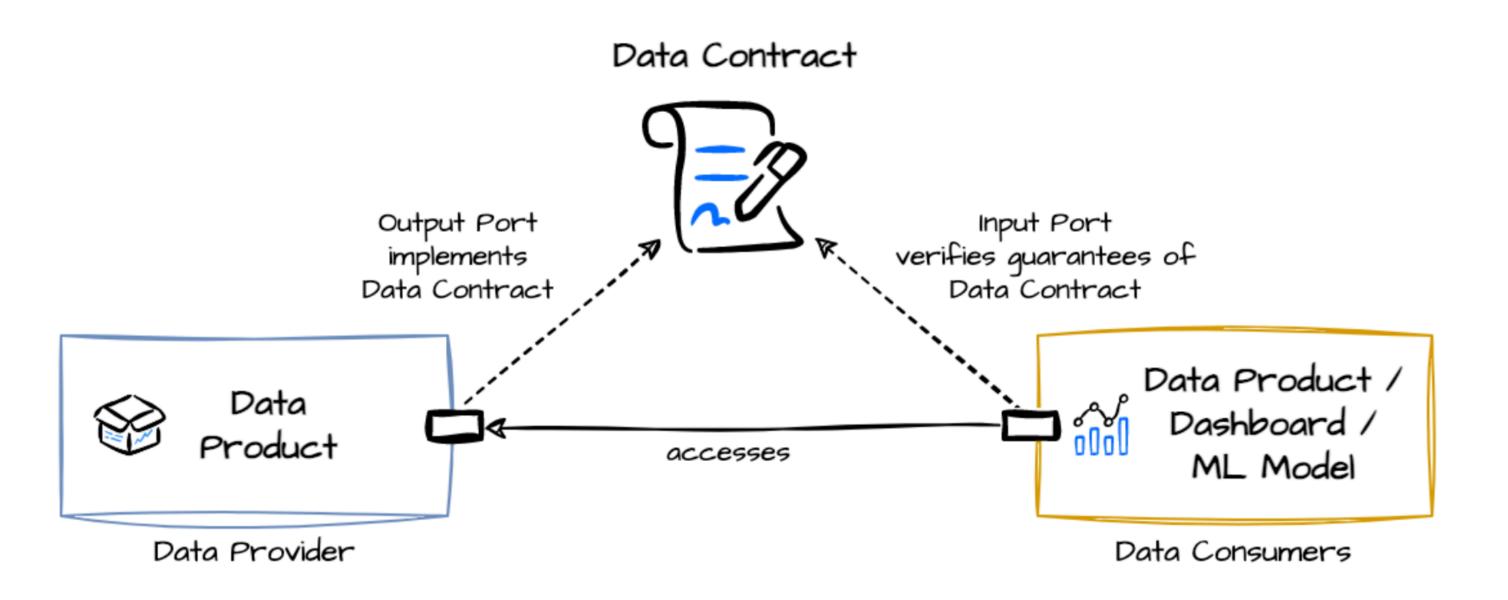
Eine dezentrale Datenarchitektur entwerfen



Vorwort von Martin Fowler Übersetzung von Jochen Christ und Simon Harrer



Data Contract Specification

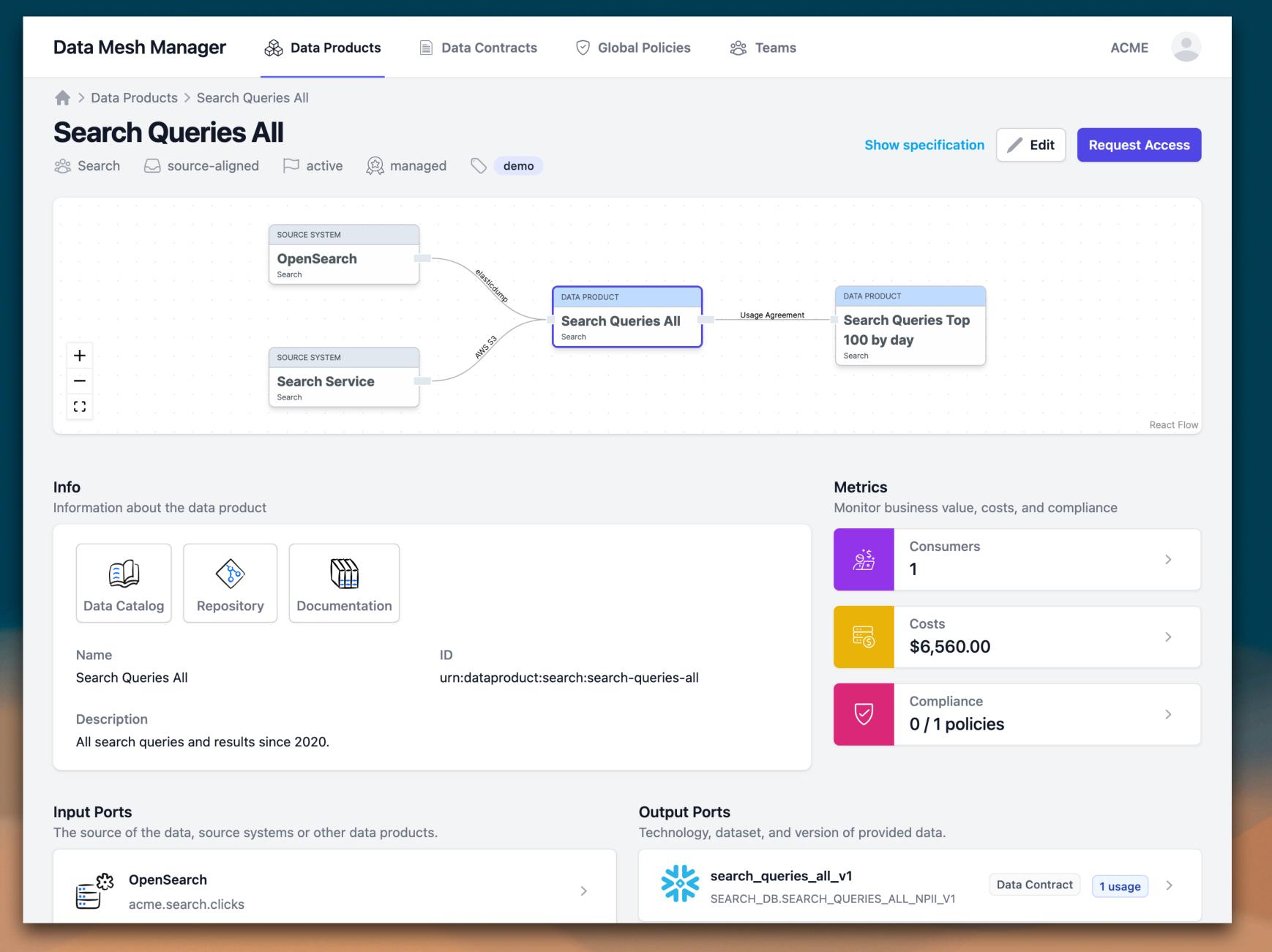


Data contracts bring data providers and data consumers together.

A data contract is a document that defines the structure, format, semantics, quality, and terms of use for exchanging data between a data provider and their consumers. A data contract is implemented by a data product's output port or other data technologies. Data contracts can also be used for the input port to specify the expectations of data dependencies and verify given guarantees.

The data contract specification defines a YAML format to describe attributes of provided data sets. It is data platform neutral, yet supports well-known formats to express schemas (e.g., dbt models, JSON Schema, Protobuf, SQL DDL) and quality tests (e.g., SodaCL, SQL queries) to avoid unnecessary abstractions. The data contract specification is an open initiative to define a common data contract format. Think of an OpenAPI specification, but for data sets.

datacontract.com



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Recap Data Mesh

Decentralized Data Architecture



A decentralized data architecture gives ownership and competence for (analytical) data to the teams that understand the business context.

-- Jochen

Decentralized Data Architecture

Why?



Make qualified datadriven decisions

in your domain

Use data to better understand your users and system behavior. Derive features from insights, qualify value, and fast iterations. Also qualified rejection of unnecessary tasks.

Do the right things, purpose, motivation



Build innovative services

in your domain

Enhance your customer experience with data technologies, such as LLMs, visualizations, classifications, and ML models for predictions and recommendations.

Customer value through innovation



Provide data as business value for other domains

Domain data is valuable for other business units as reference data and to aggregate. Needs managed, explained, high-quality and easy accessible data as products.

Company success

What Is Data Mesh?

Strategic Domain-driven Design

Socio-technical Perspective

Technology

Domain Ownership

Domain

Bounded Context

Domain Teams れれ

Operational & Analytical Data

Data as a Product

Product Thinking

ራቸኝ Data Product by Domain Team

Interoperability
Interfaces

Self-serve Data Platform

Domain-agnostic

Data Platform Team

Self-serve Data Platform Federated Governance

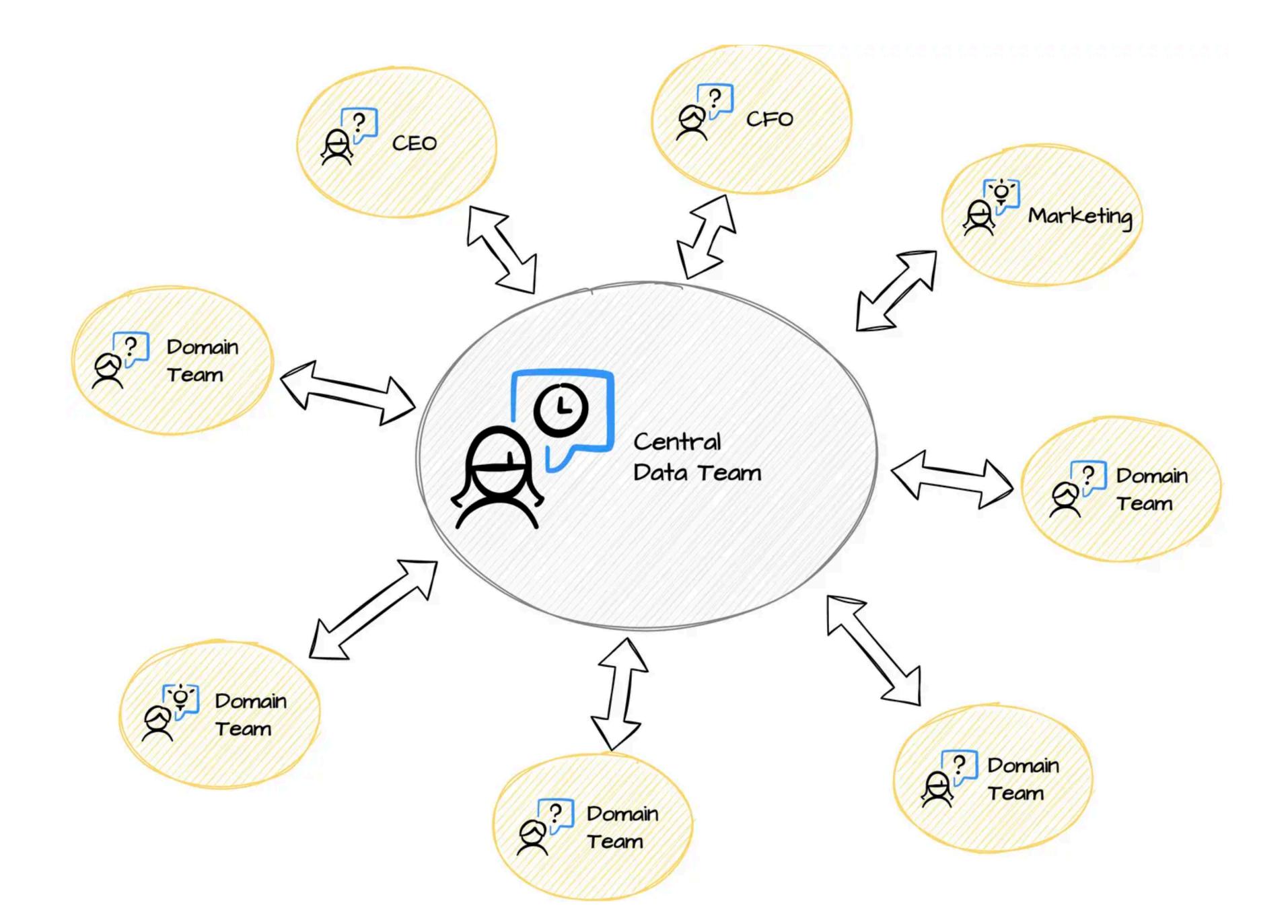
Context Mapping

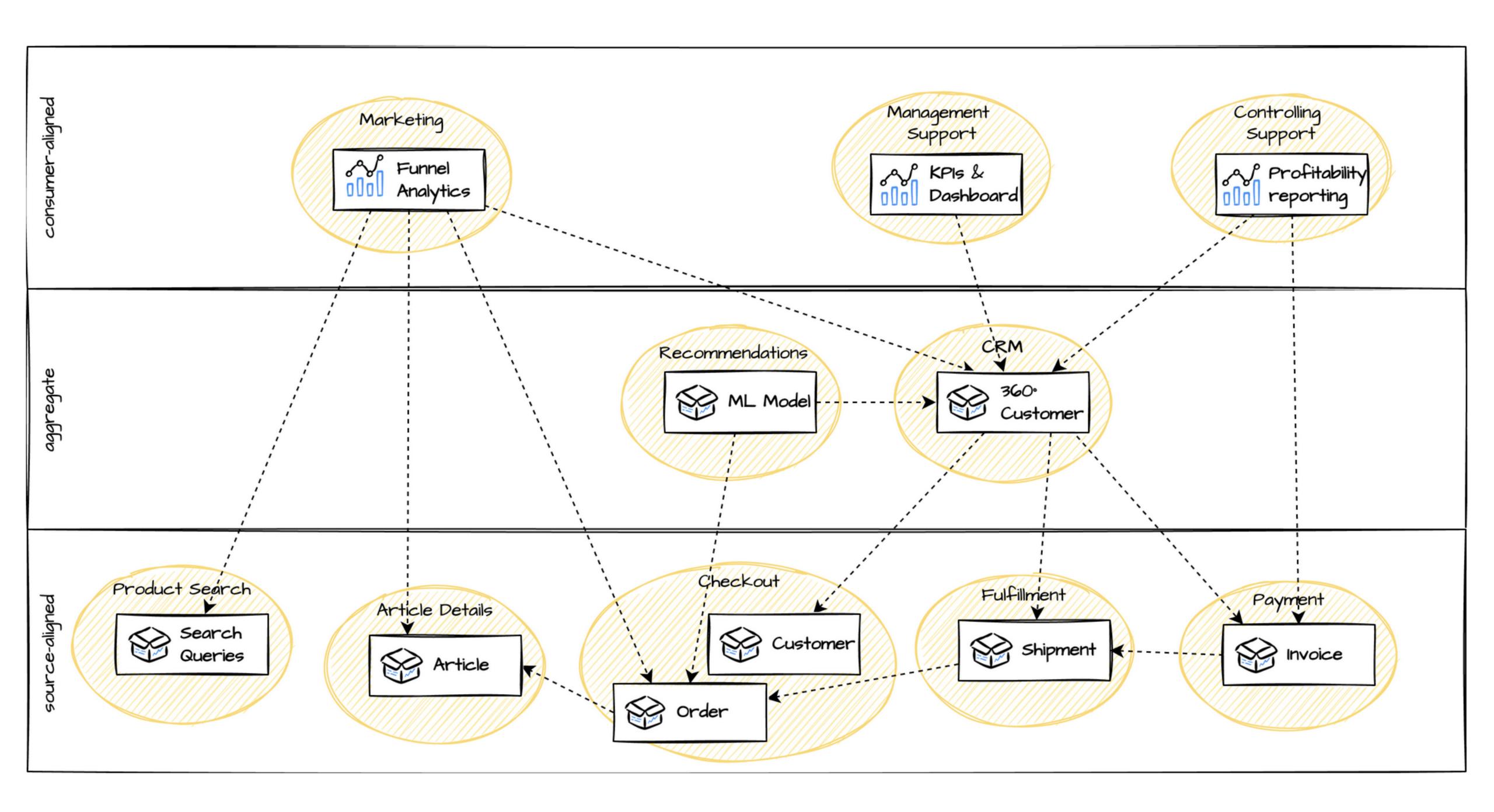
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Governance Group

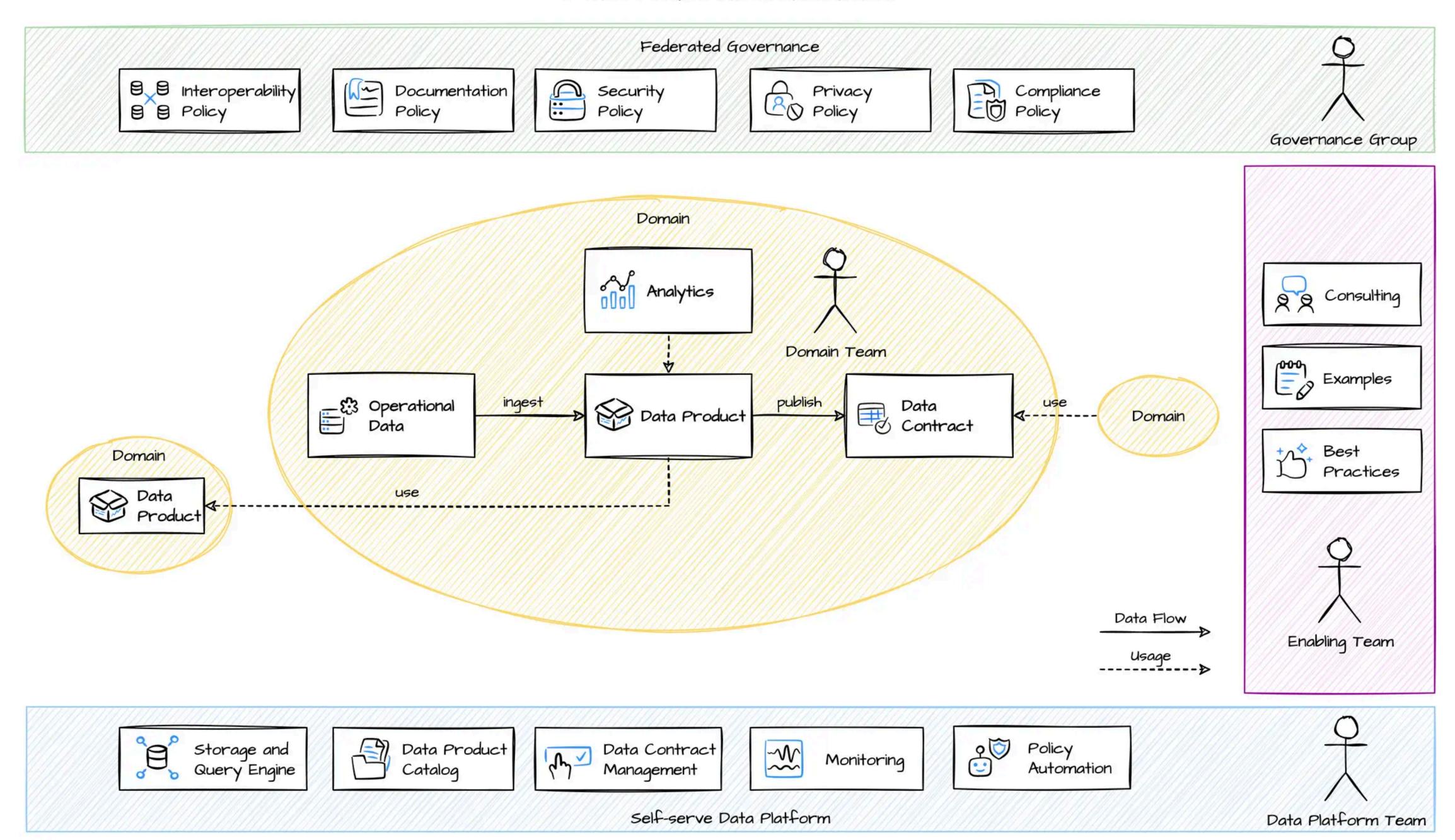
Policy Automation

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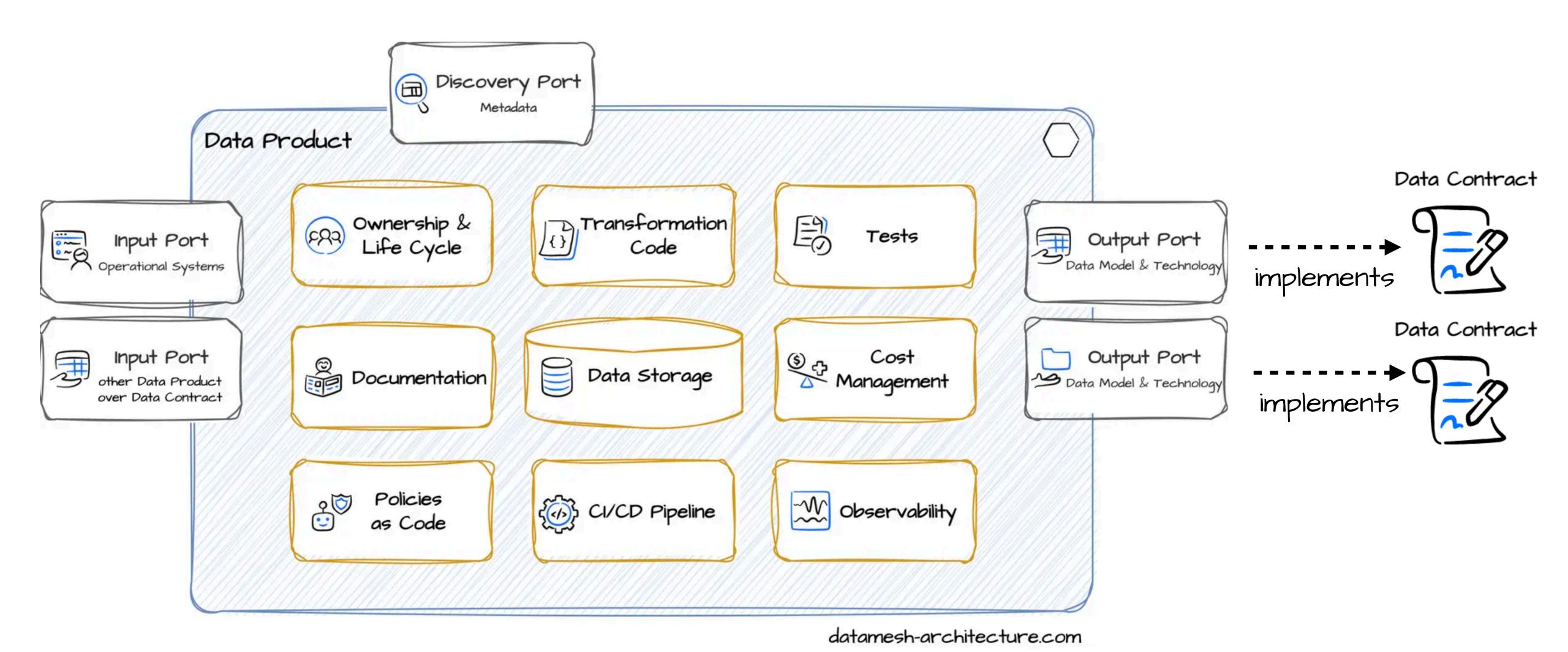




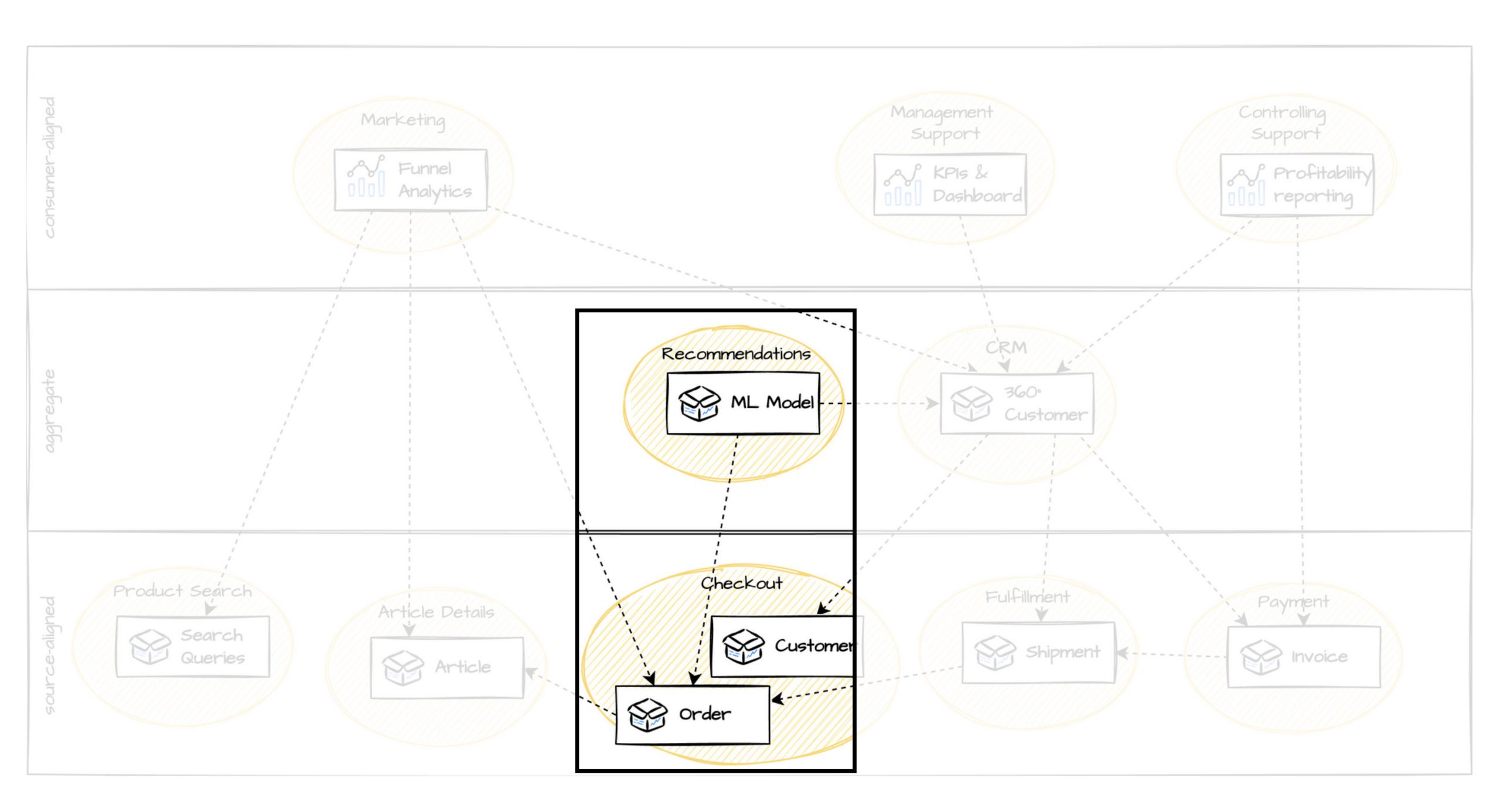
Data Mesh Architecture



Data Products are Modules



Example Data Product Orders for Team Recommendations

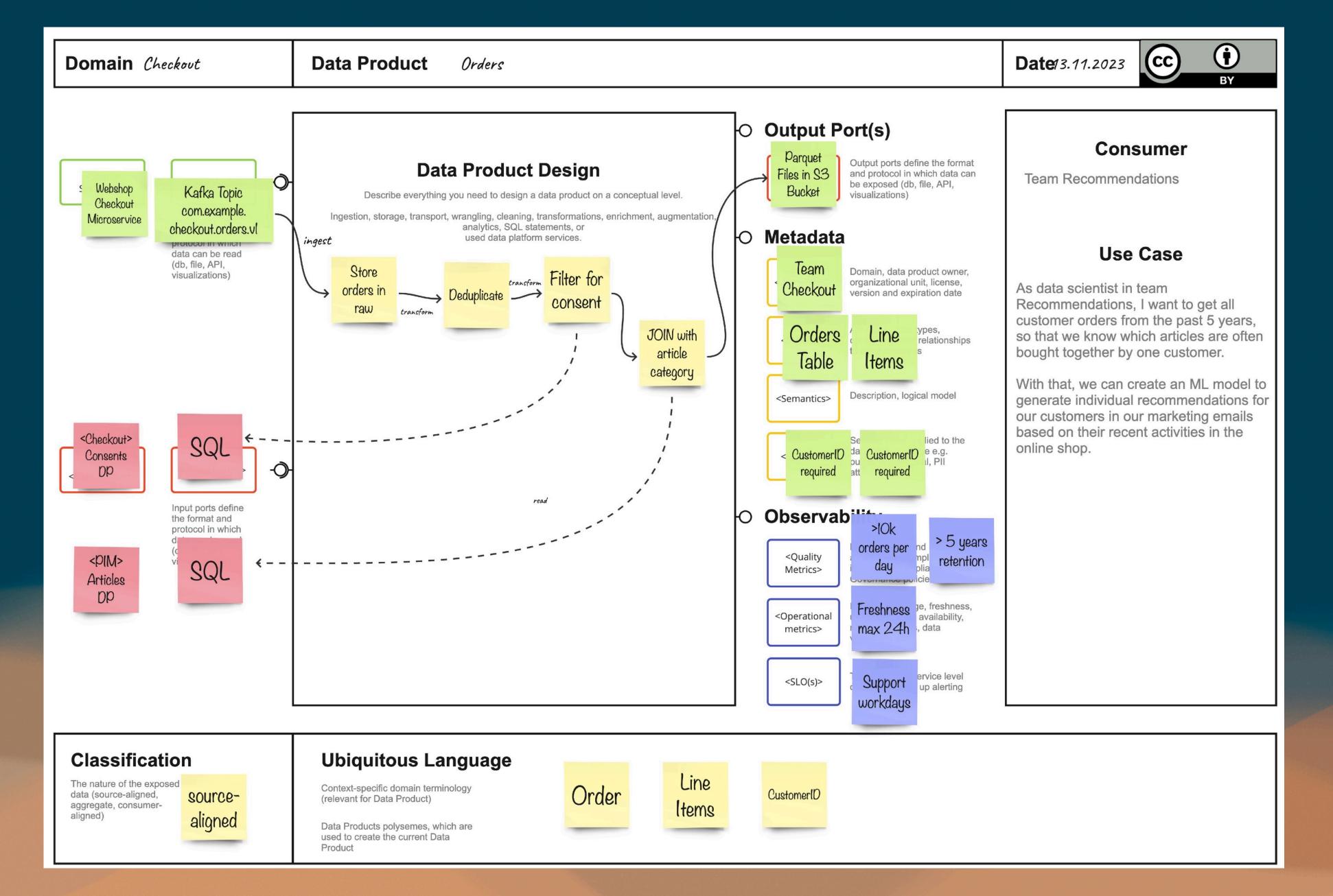


Drive Data Product Development by Business Case

"As data scientist in team Recommendations, I want to get all webshop orders from the past 5 years, so that we know which articles (categories) are often bought together by one customer.

With that, we can create an ML model to generate individual recommendations for our customers in our marketing emails based on their recent activities in the online shop."





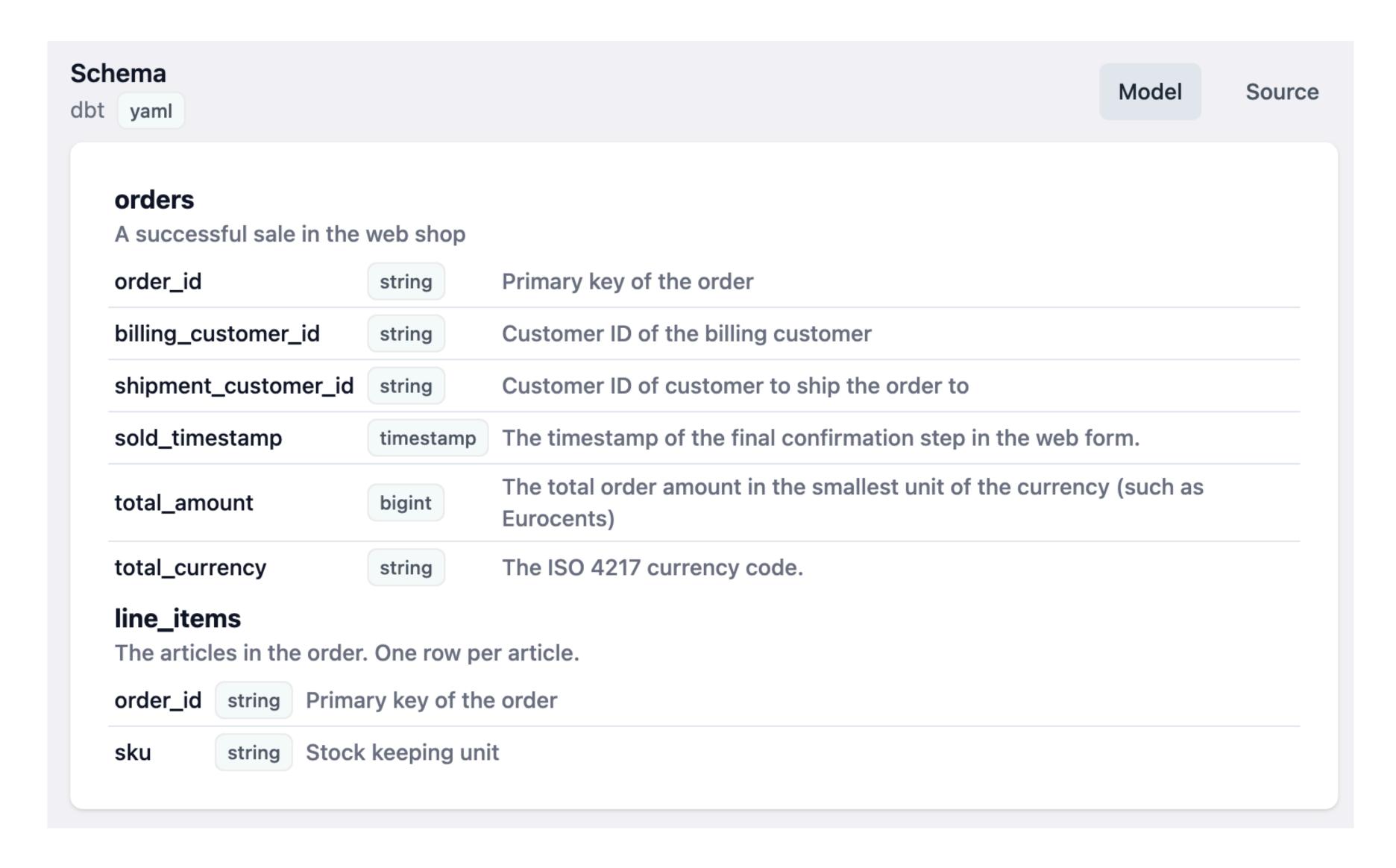
Work with Examples

Α	В	С	D	E	F	G	Н	1	J	K	L	M	N	0	Р	Q	R
ws_sold_dat	ws_sold_tim \	ws_ship_dat v	ws_item_sk	ws_bill_cust	vs_bill_cder	ws_bill_hder	ws_bill_addr w	/s_ship_cus \	ws_ship_cde	ws_ship_hde w	vs_ship_adc	ws_web_pag	ws_web_site w	s_ship_mo	ws_warehou	ws_promo_s ws	_order_nur \
2451383	73313	2451482	4591	83074	596485	1096	40907	85919	41329	1140	1351	43	4	4	5	6	1
2451383	73313	2451411	3566	83074	596485	1096	40907	85919	41329	1140	1351	28	7	3	2	271	1
2451383	73313	2451413	7286	83074	596485	1096	40907	85919	41329	1140	1351	58	28	10	5	300	1
2451383	73313	2451393	2755	83074	596485	1096	40907	85919	41329	1140	1351	2	7	6	1	63	1
2451383	73313	2451502	2516	83074	596485	1096	40907	85919	41329	1140	1351	56	16	2	5	18	1
2451383	73313	2451421	16966	83074	596485	1096	40907	85919	41329	1140	1351	50	7	2	2	185	1
2451383	73313	2451457	10402	83074	596485	1096	40907	85919	41329	1140	1351	56	16	16	3	293	1
2451383	73313	2451430	1735	83074	596485	1096	40907	85919	41329	1140	1351	25	19	14	3	202	1
2451383	73313	2451458	15464	83074	596485	1096	40907	85919	41329	1140	1351	13	26	8	5	49	1
2452625	34964	2452675	8925	42296	436090	2684	37278	57428	1447713	3907	30901	12	6	20	2	107	2
2452625	34964	2452716	11041	42296	436090	2684	37278	57428	1447713	3907	30901	55	30	9	1	253	2
2452625	34964	2452715	645	42296	436090	2684	37278	57428	1447713	3907	30901	36	3	6	2	171	2
2452625	34964	2452729	12453	42296	436090	2684	37278	57428	1447713	3907	30901	19	27	18	5	289	2
2452625	34964	2452741	13831	42296	436090	2684	37278	57428	1447713	3907	30901	6	12	19	2	75	2
2452625	34964	2452725	9559	42296	436090	2684	37278	57428	1447713	3907	30901	49	15	11	1	54	2
2452625	34964	2452743	8085	42296	436090	2684	37278	57428	1447713	3907	30901	12	13	5	1	294	2
2452625	34964	2452702	12081	42296	436090	2684	37278	57428	1447713	3907	30901	9	13	16	3	267	2
2452625	34964	2452638	15739	42296	436090	2684	37278	57428	1447713	3907	30901	1	13	16	2	221	2
2451754	1529	2451774	17431	74800	1219525	3450	3375	84180	1487225	5550	41475	14	20	7	5	246	3
2451754	1529	2451819	4694	74800	1219525	3450	3375	84180	1487225	5550	41475	56	11	3	5	237	3
2451754	1529	2451836	2189	74800	1219525	3450	3375	84180	1487225	5550	41475	17	19	1	2	223	3
2451754	1529	2451769	151	74800	1219525	3450	3375	84180	1487225	5550	41475	5	20	6	4	72	3
2451754	1529	2451763	10793	74800	1219525	3450	3375	84180	1487225	5550	41475	44	2	18	2	276	3
2451754	1529	2451863	12782	74800	1219525	3450	3375	84180	1487225	5550	41475	8	26	3	2	94	3
2451754	1529	2451868	15769	74800	1219525	3450	3375	84180	1487225	5550	41475	23	2	9	4	99	3
2451754	1529	2451833	5549	74800	1219525	3450	3375	84180	1487225	5550	41475	5	23	1	5	69	3
2451754	1529	2451858	12475	74800	1219525	3450	3375	84180	1487225	5550	41475	5	23	8	4	23	3
2451754	1529	2451785	5324	74800	1219525	3450	3375	84180	1487225	5550	41475	47	23	20	1	299	3
2451754	1529	2451839	15686	74800	1219525	3450	3375	84180	1487225	5550	41475	47	26	17	2	7	3
														_	_ 1		_

Data Contract: Schema

```
Schema
                                                                                Model
                                                                                         Source
dbt yaml
  models:
  - name: orders
    description: A successful sale in the web shop
    columns:
    - name: order_id
      data_type: string
      description: Primary key of the order
    - name: billing_customer_id
      data_type: string
      description: Customer ID of the billing customer
    - name: shipment_customer_id
      data_type: string
      description: Customer ID of customer to ship the order to
    - name: sold_timestamp
      data_type: timestamp
      description: The timestamp of the final confirmation step in the web form.
    - name: total_amount
      data type: higint
```

Data Contract: Schema



Data Contract: Quality

```
Quality
SodaCL yaml
   checks for orders:
   - freshness(order_timestamp) < 24h</pre>
   - row_count > 500000
   - duplicate_count(order_id) = 0
   checks for line_items:
   - row_count > 500000
```

Drive Data Product Development by Business Case

"As data scientist in team Recommendations, I want to get all webshop orders from the past 5 years, so that we know which articles (categories) are often bought together by one customer.

With that, we can create an ML model to generate individual recommendations for our customers in our marketing emails based on their recent activities in the online shop."



Ah, good to know. That is OK for us.

Sophia, Data Scientist



"Sorry, we cannot give you *all* orders, but only orders when the customer expressed their consent for analytical use. That are around 80% of all orders.

John, Product Owner

Data Contract: Terms

Terms

Terms and conditions of the data contract

Usage

The data can be used for analytical and data science use cases, as the customer has expressed their consent.

Limitations

As the dataset is filtered, these data set cannot be used to aggregate financial KPIs. Not suited for real-time use cases.

Billing

\$1000 per month

Notice Period

3 months

Data Contract: Info

Info

Information about the data contract

Title

Web Orders With Consent V1 1.0.0

Description

All orders made through the web channel.

Filtered for orders where customers have expressed consent for analytical use.

Owner Contact

John Doe https://teams.example.com/datacontracts/web-orders-

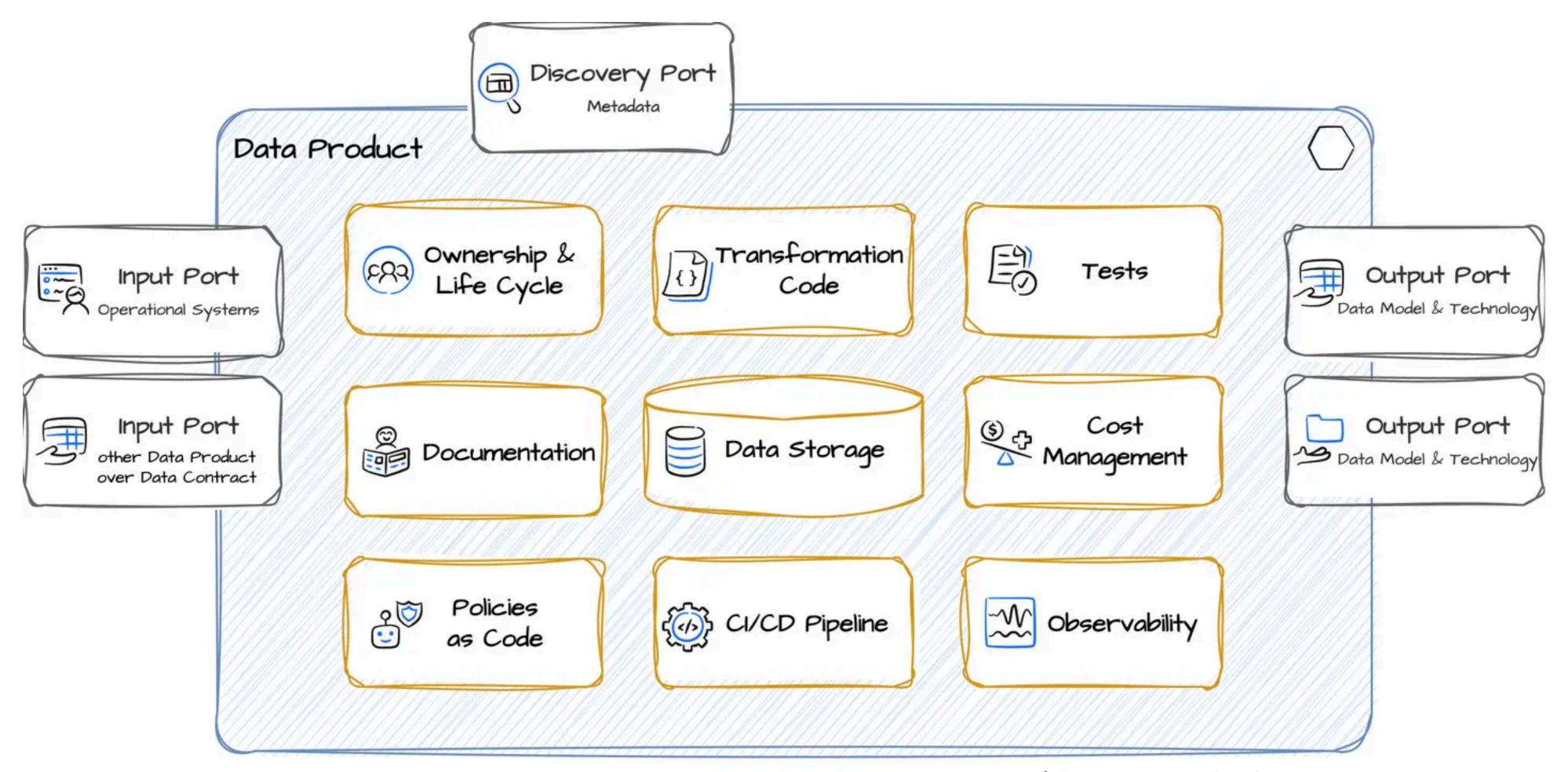
with-consent-v1

Data Contract as YAML

```
dataContractSpecification: 0.9.0
id: web-orders-with-consent-v1
info:
  title: Web Orders With Consent V1
  version: 1.0.0
  description: "All orders made through the web channel.\r\nFiltered for orders where customers have expressed consent for analytical use."
  owner: John Doe
  contact:
   url: https://teams.example.com/datacontracts/web-orders-with-consent-v1
terms:
 usage: "The data can be used for analytical and data science use cases, as the customer has expressed their consent."
  limitations: "As the dataset is filtered, these data set cannot be used to aggregate financial KPIs.\r\nNot suited for real-time use cases."
  billing: $1000 per month
  noticePeriod: P3M
schema:
  type: dbt
  specification:
    models:
    - name: orders
      description: A successful sale in the web shop
      columns:
      - name: order_id
        data_type: string
        description: Primary key of the order
      - name: billing_customer_id
        data_type: string
```

datacontract.com

How to implement a Data Product?

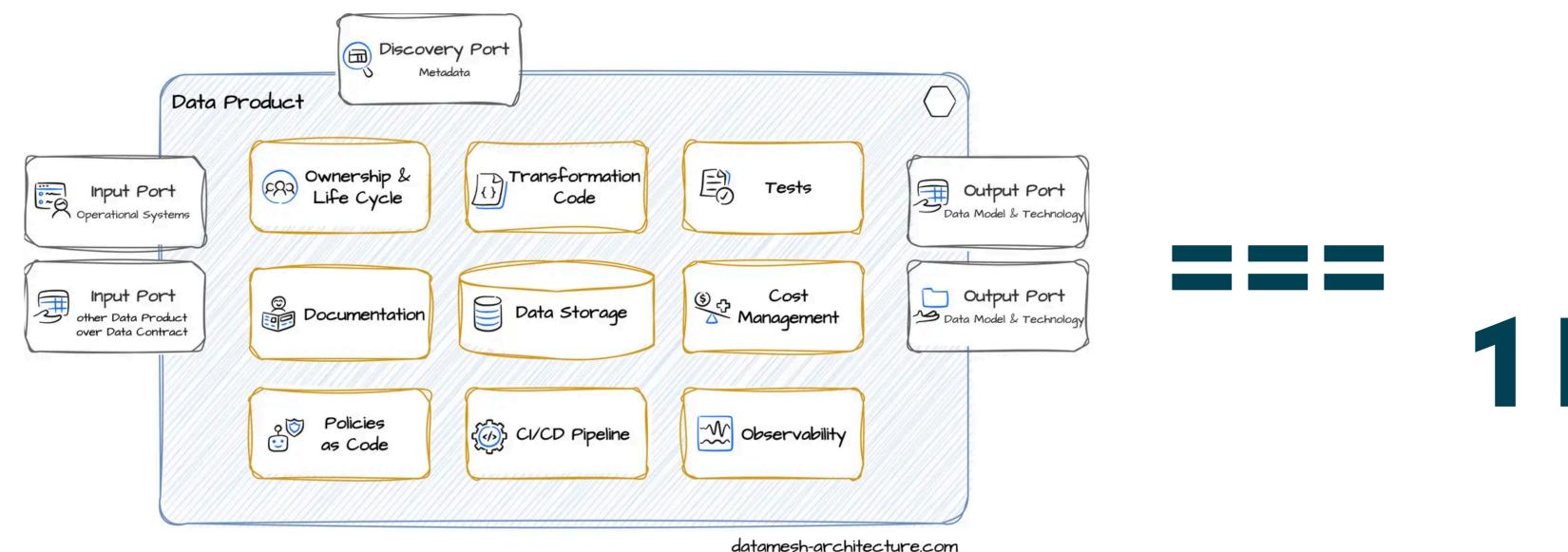


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Implementation depends on Tech Stack

Stack	Storage	Query Engine	Framework
AWS	S3	Athena (SQL)	Lambda / Step Functions
Google Cloud	BigQuery	BigQuery (SQL)	dbt
Azure (MS Fabric)	OneLake	Spark	Fabric notebook
Databricks	Deltalake	Spark	Databricks Asset Bundles
Snowflake	Snowflake	Snowflake (SQL)	dbt
On-Premise	S3 compliant	Presto (SQL)	dbt
Java	S3 compliant	Java	Spring Cloud Data Flow
DuckDB	S3 compliant	DuckDB (SQL)	dbt

1 Git Project per Data Product

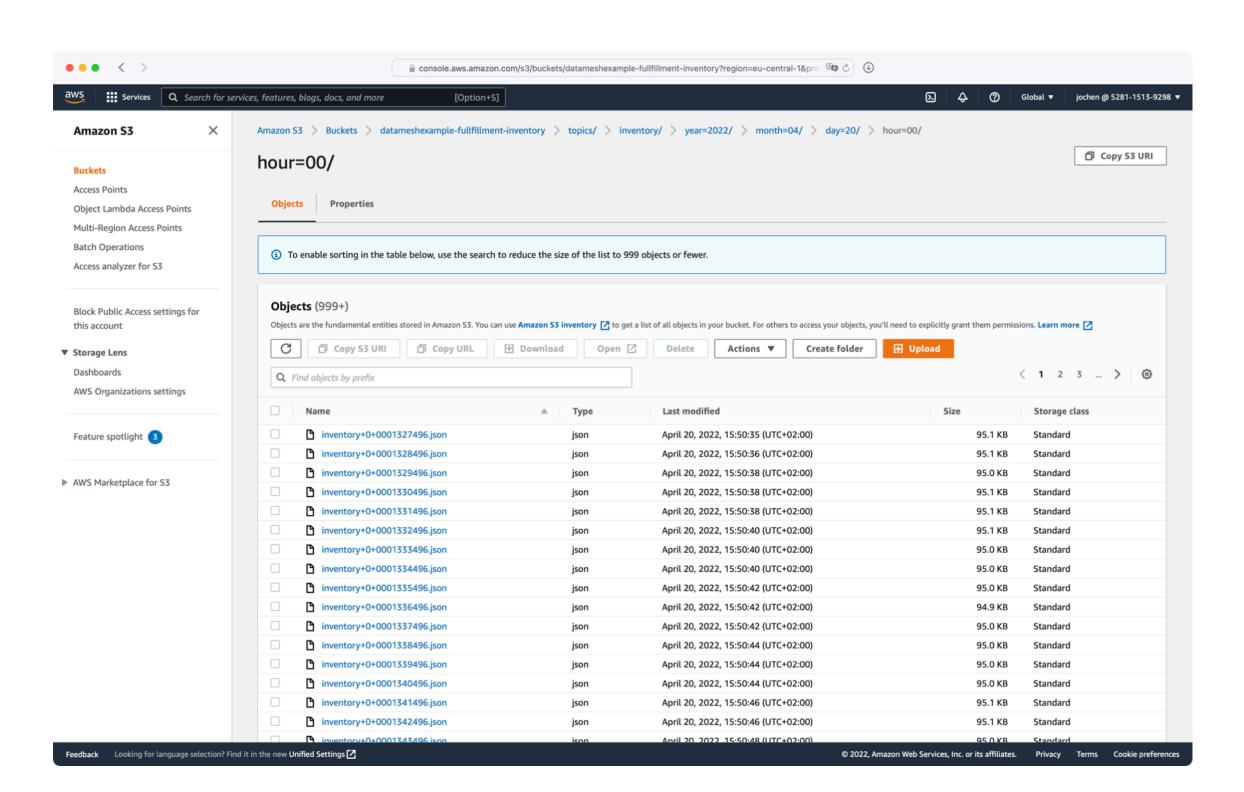




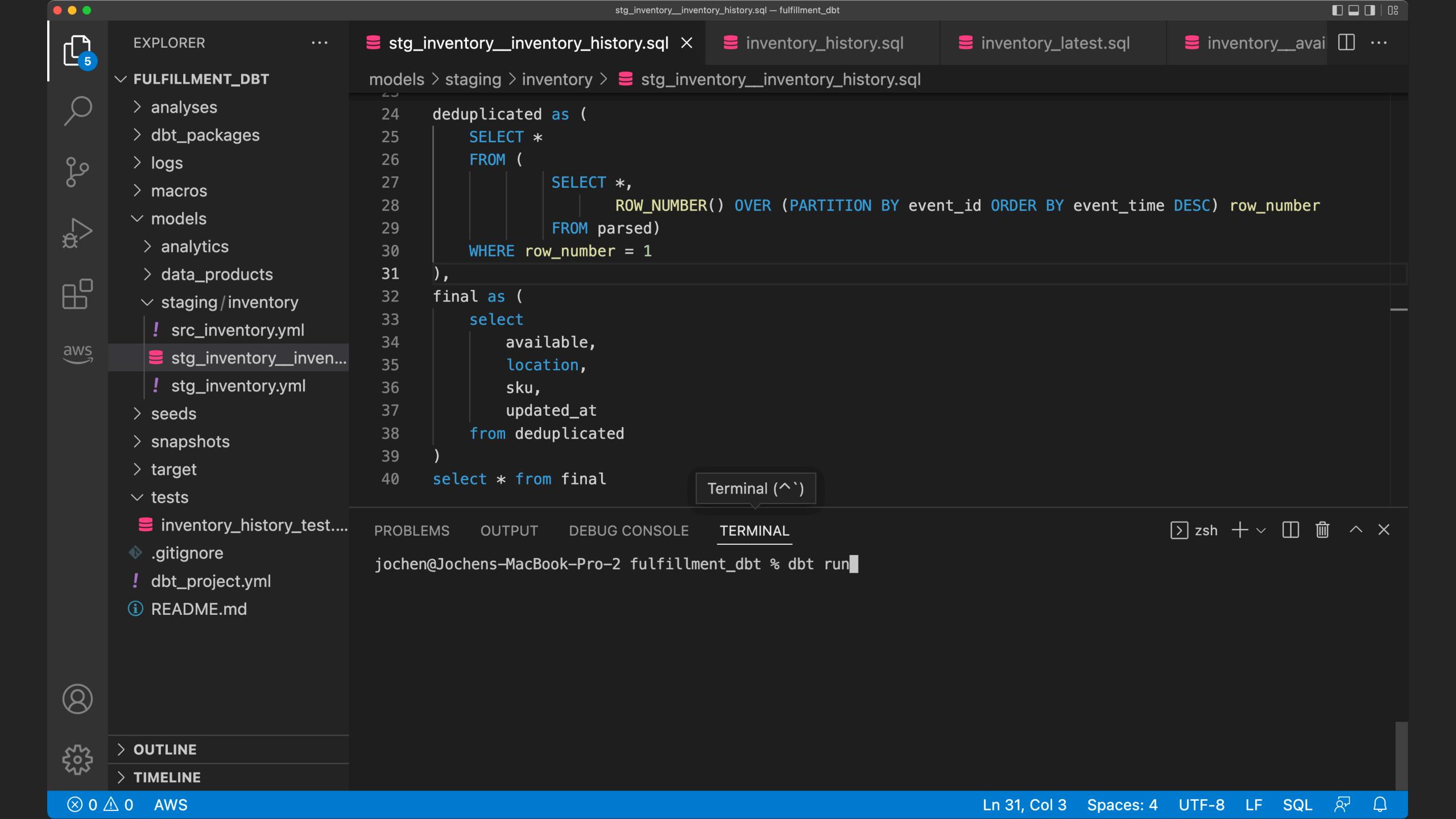
Input Port: Kafka -> S3



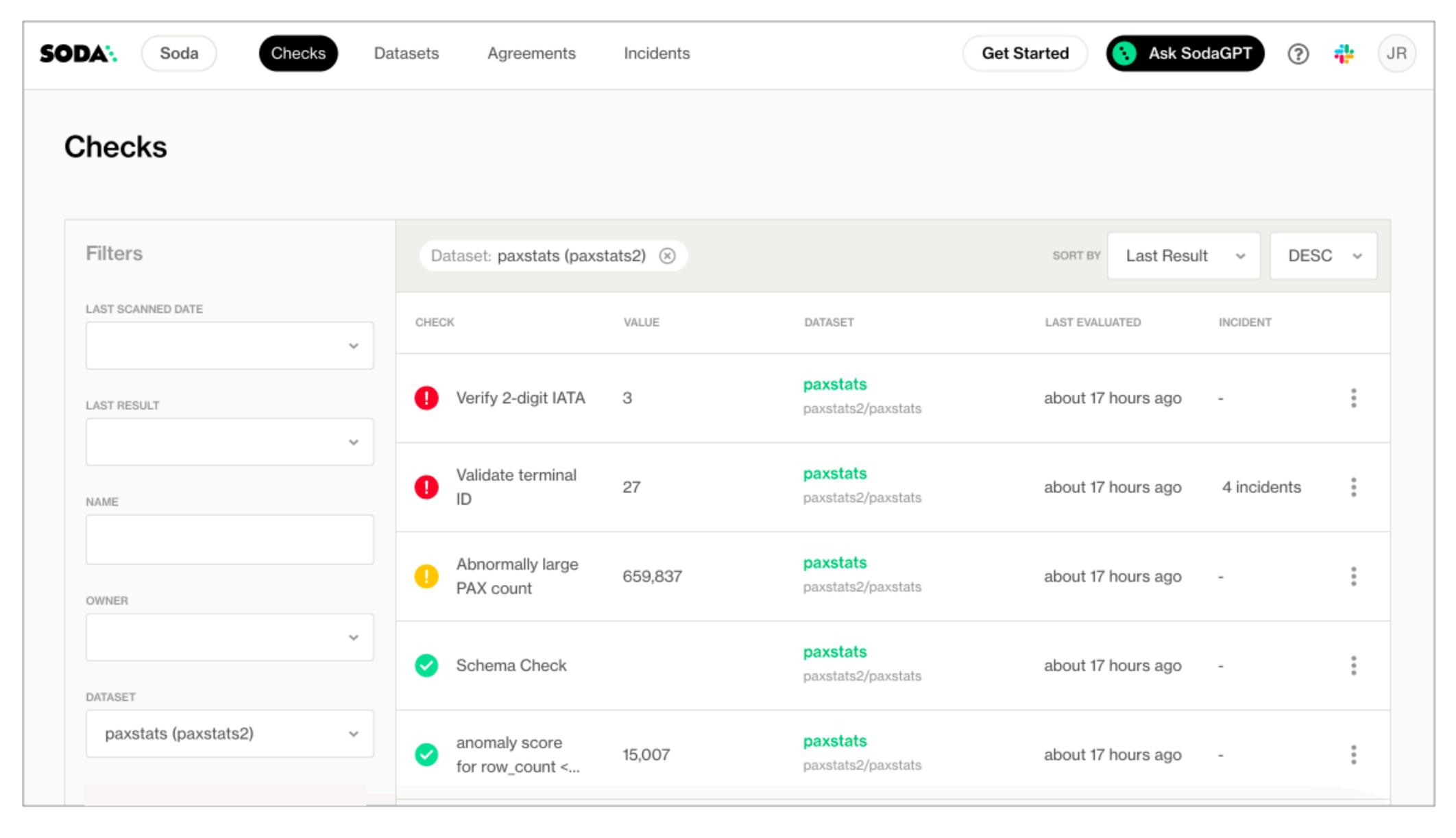
CONFLUENT		Q Stream Catalog
ENVIRONMENTS > DATAMESHEXAM	PLE-FULFILLMENT-PROD > CLUSTER_FULFILLMENT >	
> B Cluster overview	Edit "S3_SINKConnector_0"	
⊡ Topics		
& Data integration	Overview Settings	II Pause
Clients		
Connectors	1. Edit connection 2. Test and verify	¢0.020020EE
API keys		\$0.03993055
→ Carrown linears	Which topics do you want to get data from?	
	topics —	\$0.0345
ksqlDB	inventory x	USD/GB
		Connector Summary
	+ Create topic	Name
	How should we connect to your data?	S3_SINKConnector_0
	Connector class ①	Connector Class S3_SINK
		Topics
	Name	inventory
		Max Tasks
	Input messages	1
	_ Input Kafka record value format* ①	input.data.format JSON
	JSON	kafka.auth.mode
		KAFKA_API_KEY
	Kafka Cluster credentials	s3.bucket.name
	← Kafka Cluster Authentication mode ①	datameshexample-fullfillment-inv
	KAFKA_API_KEY ~	output.data.format JSON
	_ Kafka API Key —	time.interval
	••••••	DAILY
E John Registry	Kafira ADI Casasa	flush.size
	Kafka API Secret	1000



Stream operational data into analytical data platform to preserve historic states and enable efficient JOIN and aggregate operations.



Tests: Test Engine to ensure Quality



Deployment: Terraform Module

```
Configured and deployed by domain team
```

```
source = "git@github.com:datamesh-architecture/terraform-dataproduct-aws-athena.git"
        = "checkout"
domain
        = "orders"
name
schedule = "0 0 * * ? *" # Run at 00:00 am (UTC) every day
input = [{
   source = "s3"//example-bucket/orders"
 },{
   source = "s3"//example-bucket/consents"
transform = {
 query = "sql/orders-web-sales-filtered.sql"
output = {
          = "PARQUET"
 format
          = "schema/orders-web-sales-filtered.schema.json"
  schema
```

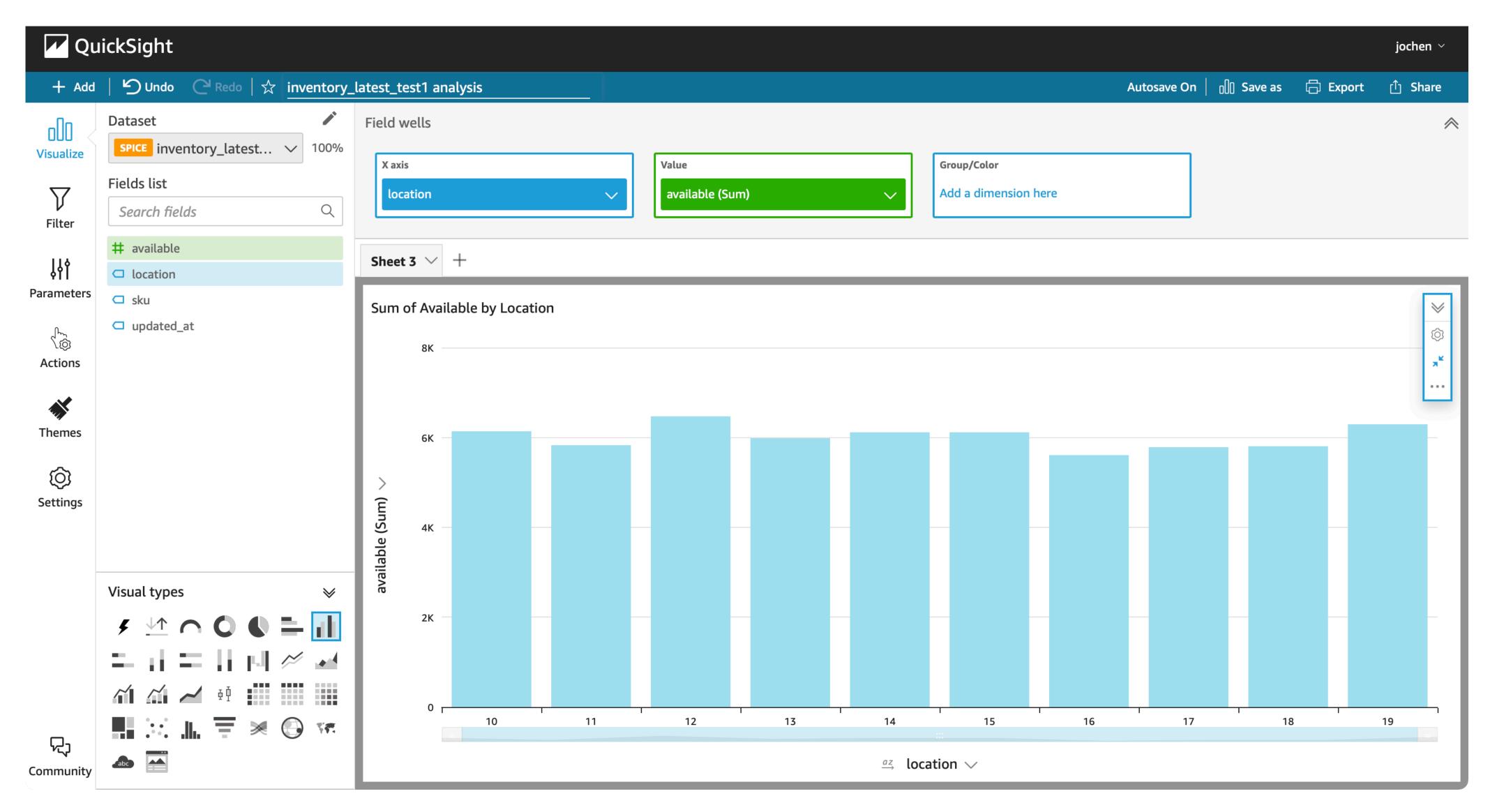
module "orders_data_product" {

Terraform module provided by data platform team

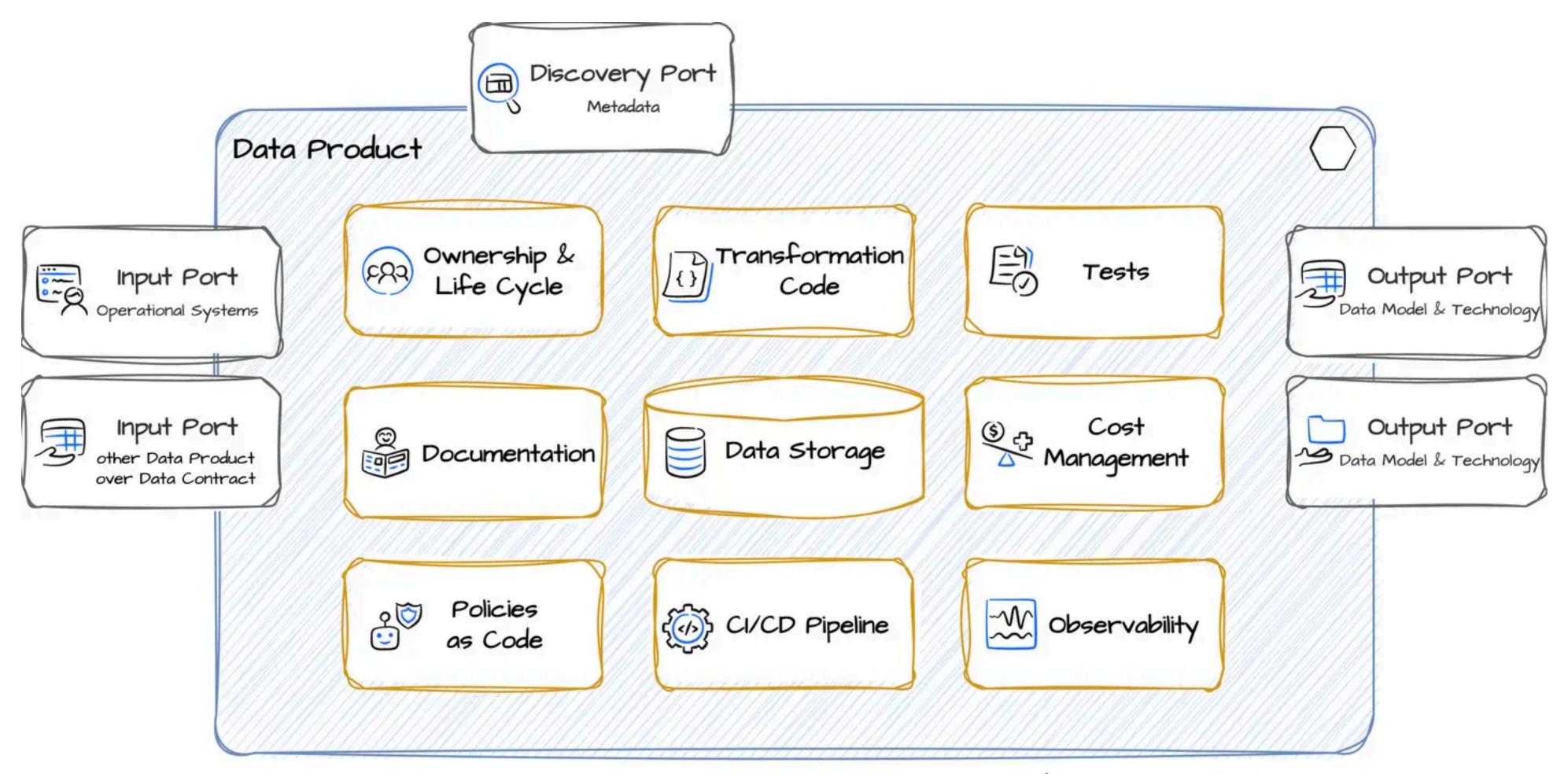
Example:

https://github.com/datamesharchitecture/terraform-awsdataproduct-aws-athena

Analytics Tooling



How to promote my data product?



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Meta Data

```
dataProductSpecification: 0.0.1
id: urn:dataproduct:checkout:orders
info:
  title: Orders
  description: Successful customer orders in the webshop.
  owner: checkout
  status: active
  archetype: source-aligned
  maturity: managed
inputPorts:
- id: kafka-orders
  name: Orders Kafka
  description: Order Updates in Kafka
  sourceSystemId: checkout-orders-service
  type: Kafka Topic
```

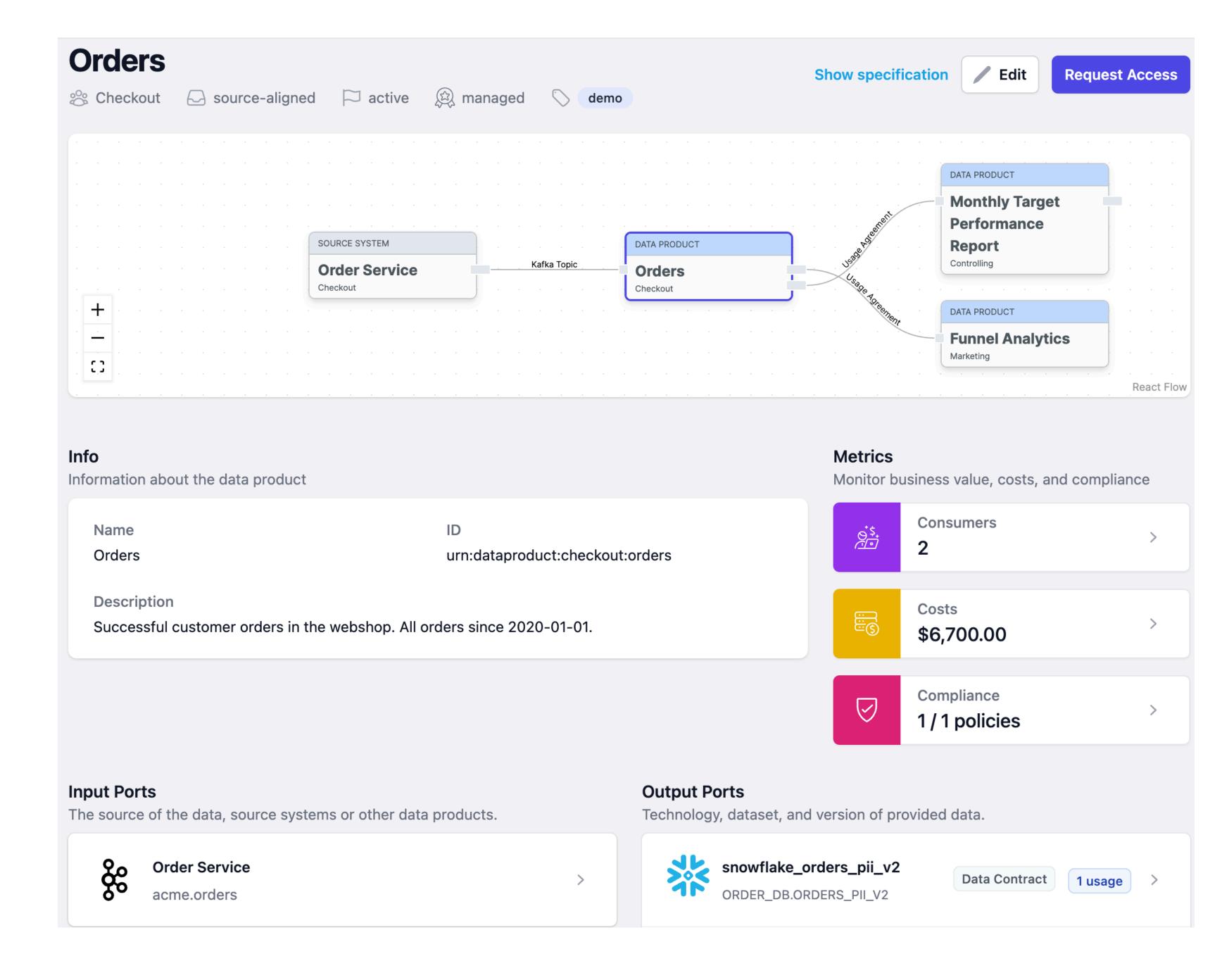
Discovery: Find Data Products

Data Mesh Manager Data Products **Data Contracts Global Policies Contract** Teams **ACME** n > Data Mesh Map **Data Mesh Map** + Register Data Product View as list **Search Service** DATA PRODUCT DATA PRODUCT Usage Agreement **Search Queries All Search Queries Top** 100 by day SOURCE SYSTEM **OpenSearch** DATA PRODUCT DATA PRODUCT DATA PRODUCT **Realtime User Customer Cohorts** Customer Classification **Order Service Funnel Analytics** DATA PRODUCT DATA PRODUCT **Monthly Target** Performance Report Controlling

Discovery: Find Data Products

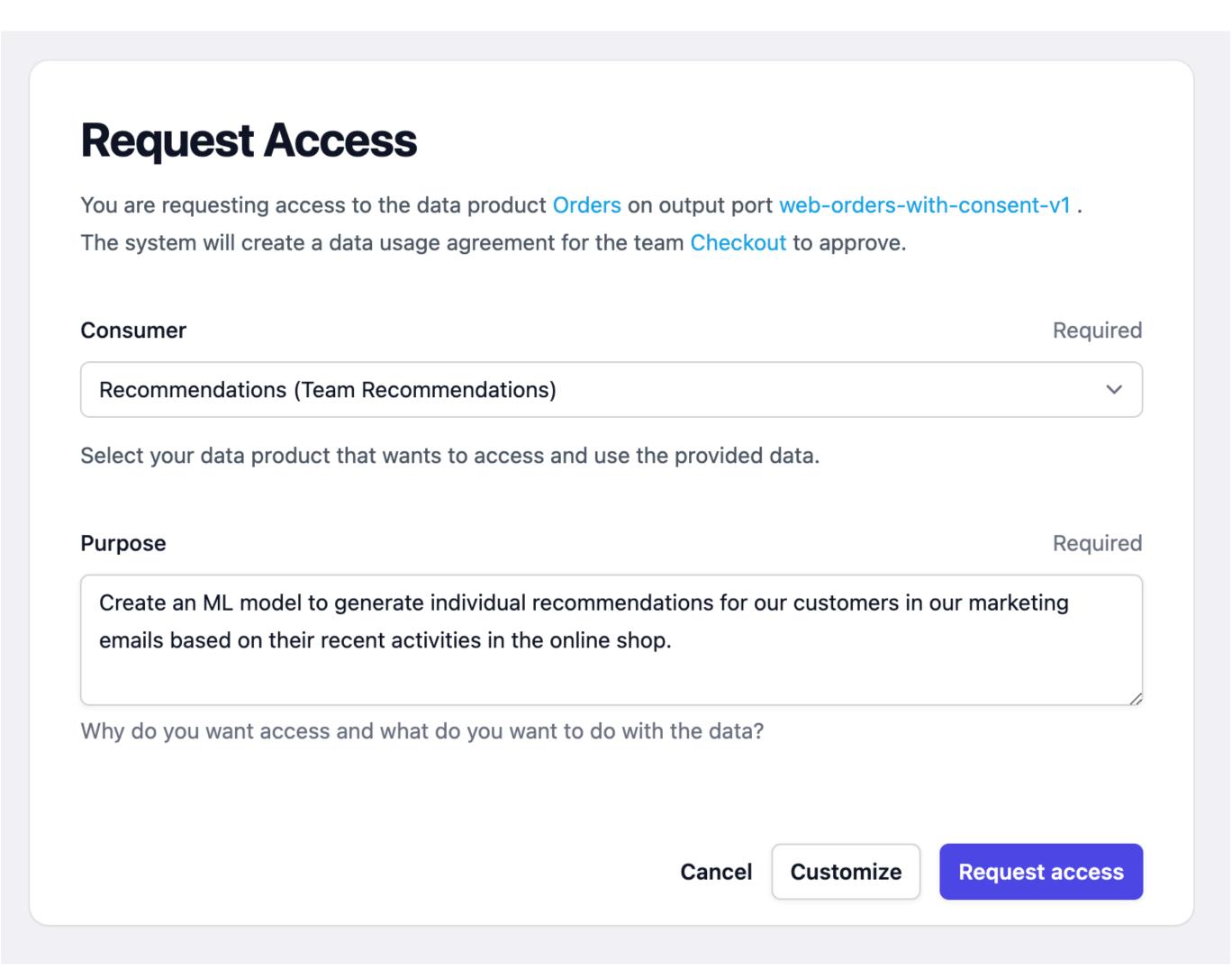
Data Mesh Manager A Data Products **Data Contracts** Global Policies **Teams ACME** Data Products **Data Products** + Register Data Product View as map Q Search Owner V Status V Sort V s3_customers_history_pii_v1 Data Contract **Customers** ✓ 1/1 Policies Checkout Orders ✓ 1/1 Policies Checkout **Article Profitability Analysis** ✓ 1/1 Policies Controlling **Monthly Target Performance Report** √ 1/1 Policies looker_target_performing_report Controlling **Shelf Warmers** √ 0 / 1 Policies Fulfillment

Discovery: Details



Data Usage Agreements

- One-to-one relationship between data provider and data consumer
- Automate permissions
- Data providers know their consumers
- Lifecycle: Can be terminated with notice period
- Data product evolution (e.g., for breaking changes)



Data Product Controlling

Data Mesh Manager





Global Policies

Example 2 Teams





> Data Products > Search Queries All > Costs

Cost Management

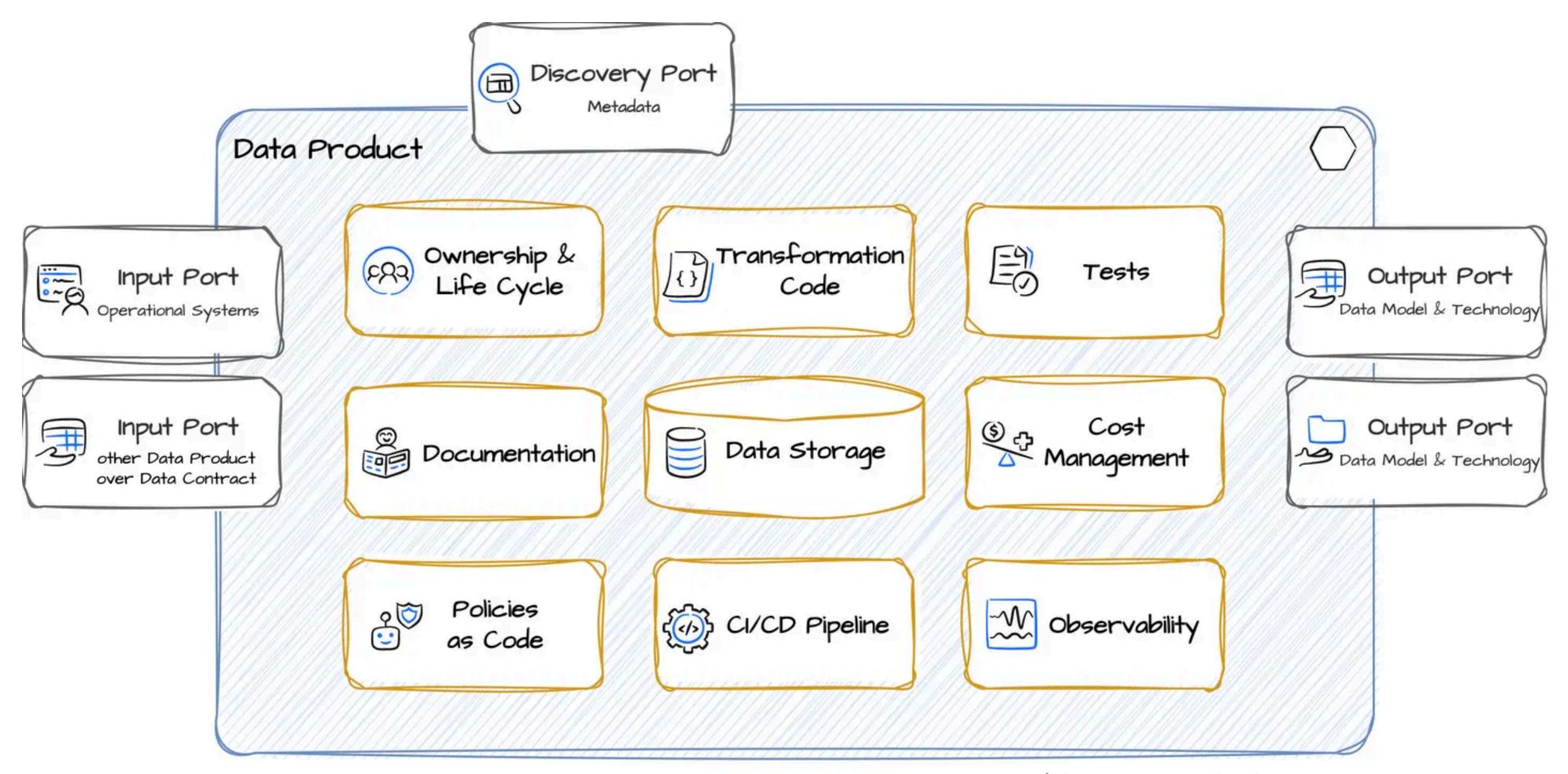
Expenses

Monthly expenses for running and maintaining the data product

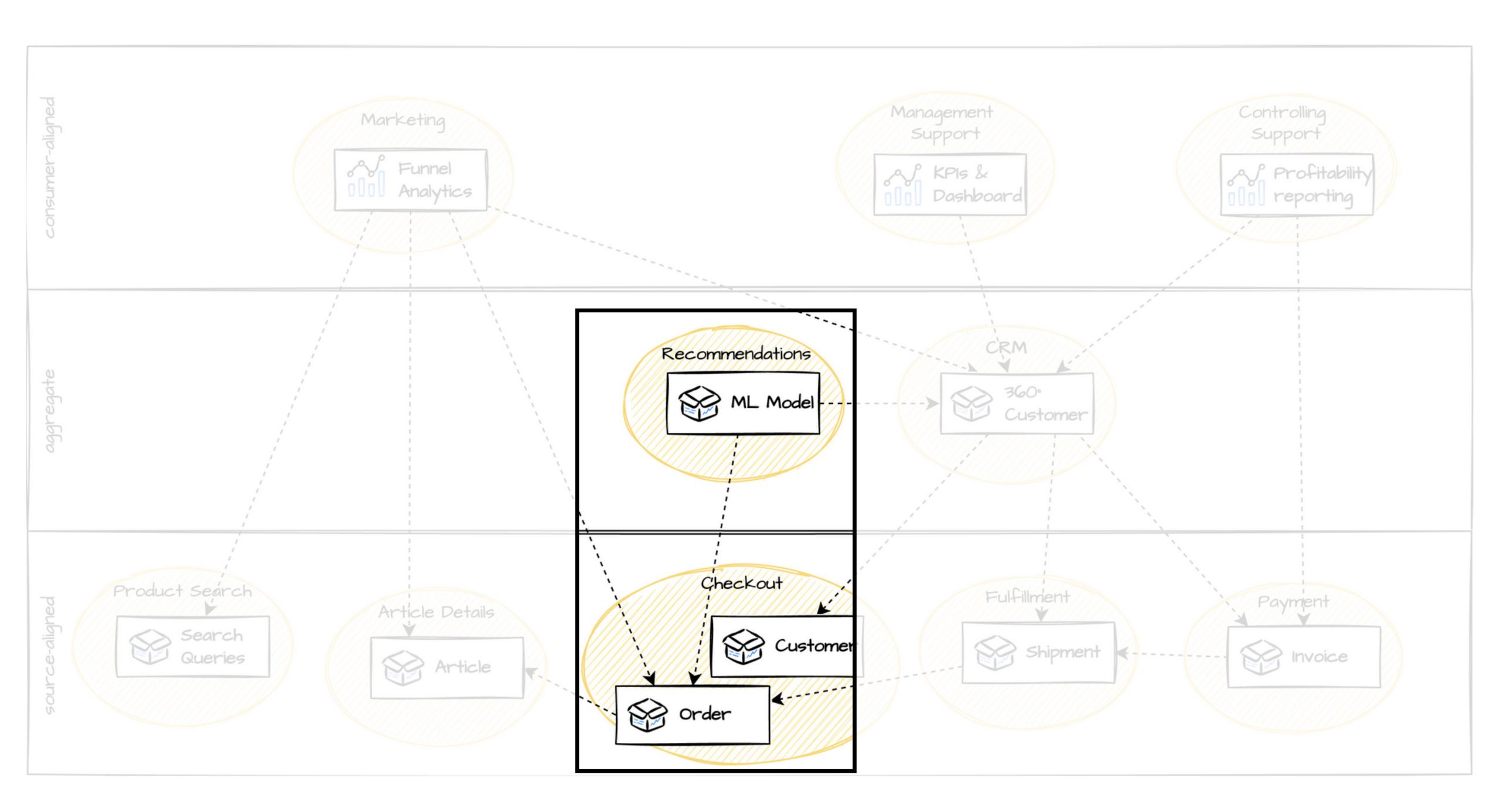
Add expense

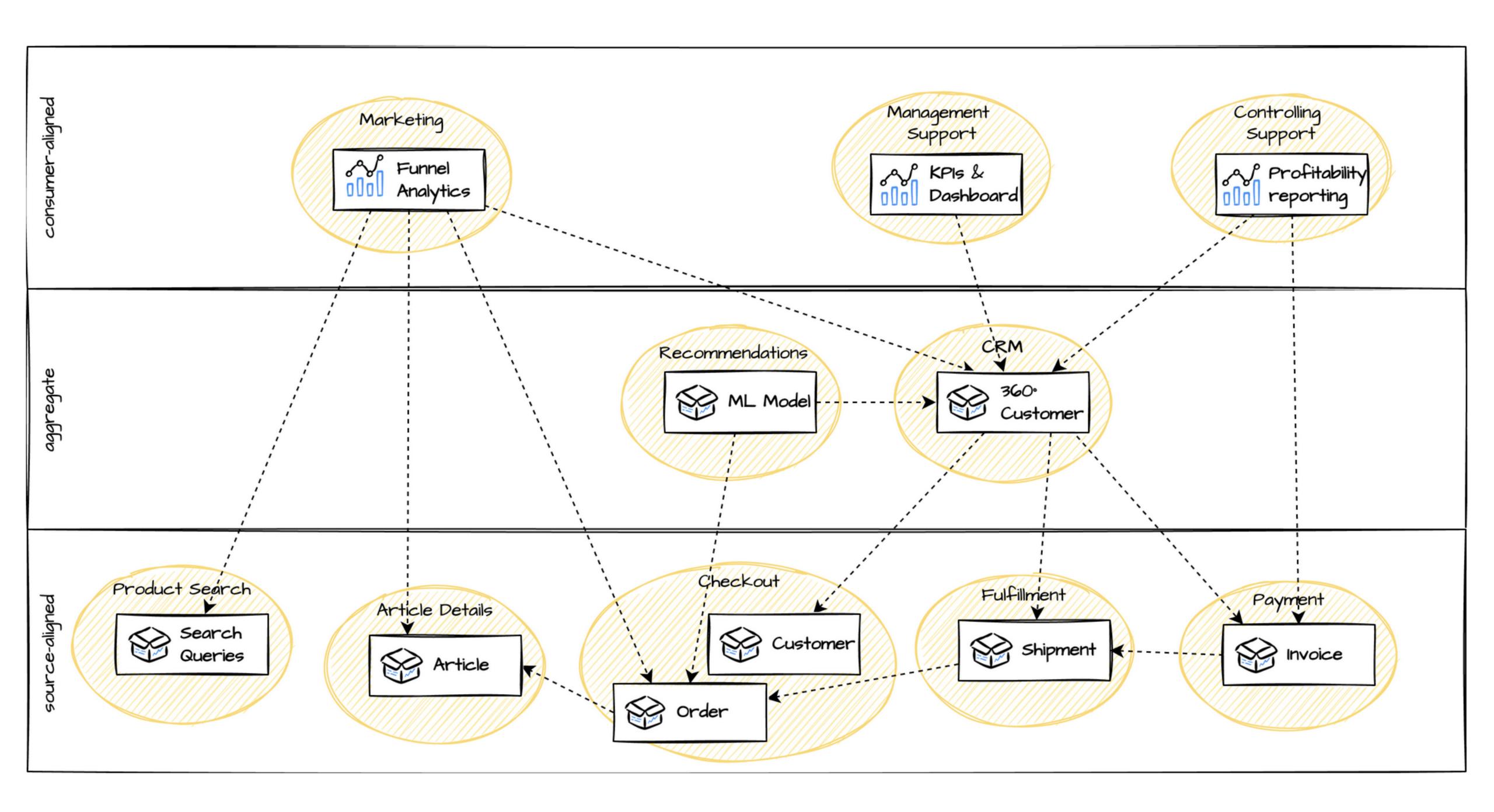
Name	Description	Category	Costs
Snowflake Compute	Average costs for Snowflake compute engine credits. Costs may vary depending on the autoscaling.	Data Platform	\$1,950.00
Maintenance	The cost of domain team's data developers.	Data Product Development	\$4,000.00
Snowflake Storage	Costs for Snowflake upfront storage capacity.	Data Platform	\$230.00
S3	S3 storage costs for storing search data	Data Platform	\$380.00
		Total	\$6,560.00

We have implemented our first Data Product



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Customer value through innovation

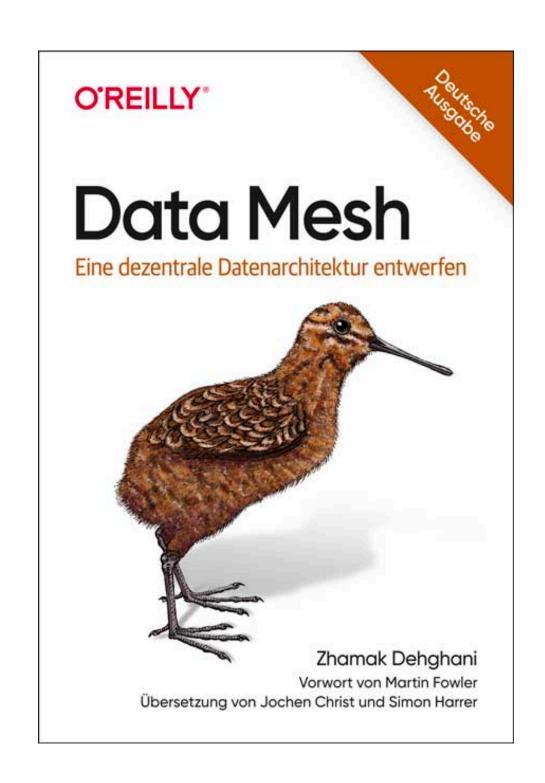


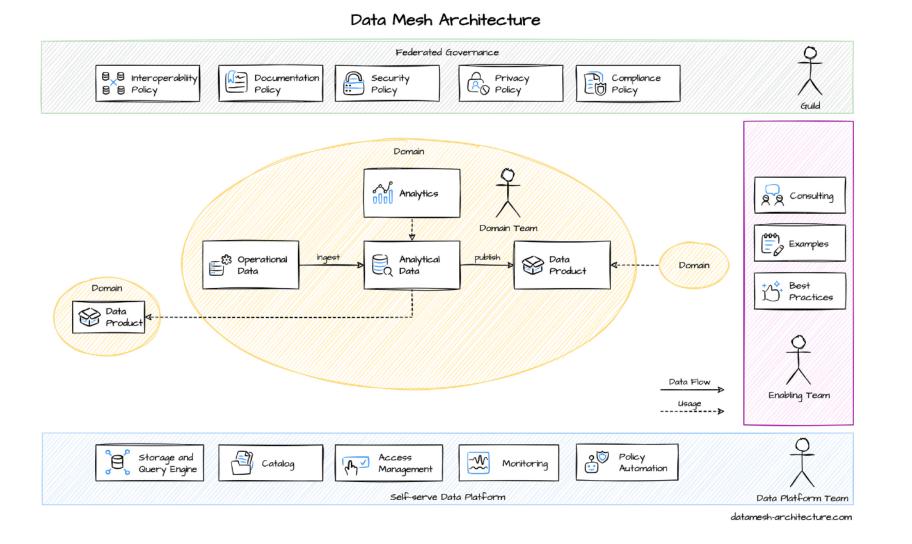
Provide data as business value for other domains

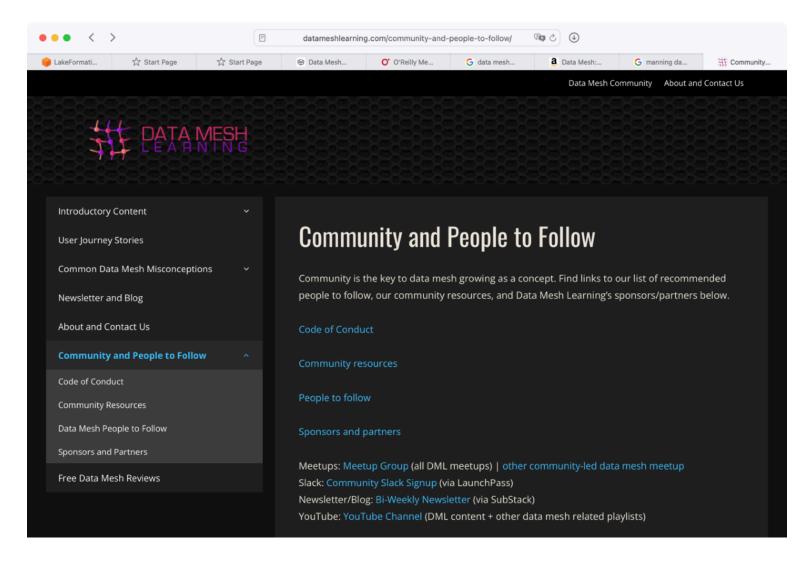
Domain data is valuable for other business units as reference data and to aggregate. Needs managed, explained, high-quality and easy accessible data as products.

Company success

Learn more







oreilly.de/produkt/data-mesh

datamesh-architecture.com

<u>datameshlearning.com</u>
Podcast, newsletter, slack channel

Wir helfen, Data Mesh erfolgreich einzuführen

TRAINING



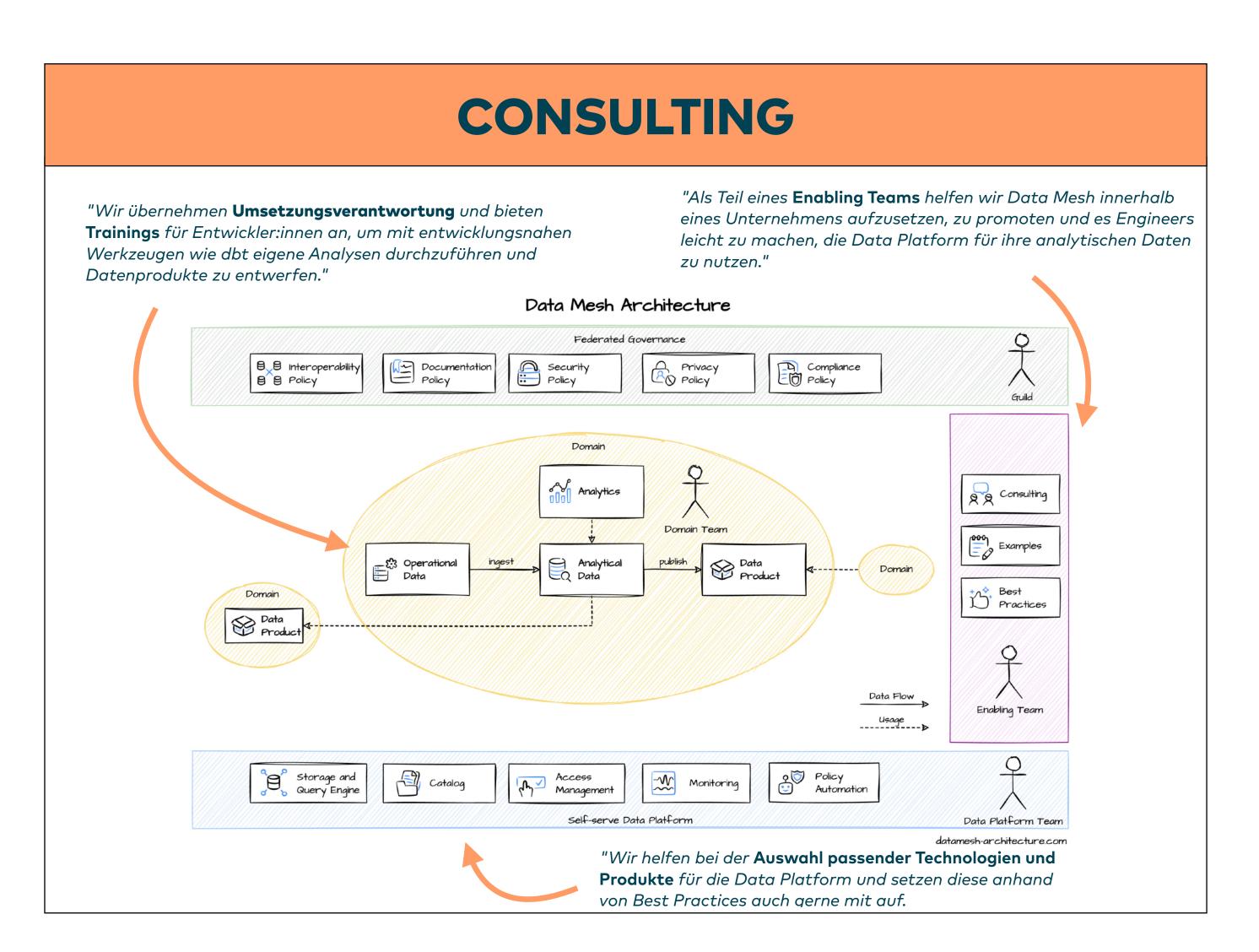
socreatory.com/de/trainings/datamesh

TOOLING

Data Mesh Manager

Data Contract Specification

Terraform Modules



Data Mesh

Was ist ein Datenprodukt?



