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# Introduction to Data Clean Room

Joel Brunger  
Senior Sales Engineer

**DATA CLOUD WORLD TOUR**



# Speakers



Joel Brunger

**Senior Sales Engineer**

Joel is a Senior Sales Engineer focusing on Media, Entertainment and Telecommunications industries with extensive deep technical knowledge and hands-on experience of managing many different data platforms from transactional to analytical technologies over the last 28 years with many different roles in service delivery, consultancy and technical pre-sales.

**DATA CLOUD WORLD TOUR**



# AGENDA

## ➤ Data Collaboration with Protections

Benefits of Snowflake Collaboration

Basic Data Sharing

Data Protection

## ➤ Secure Multi-party Computation

Yao's Millionaire Practice

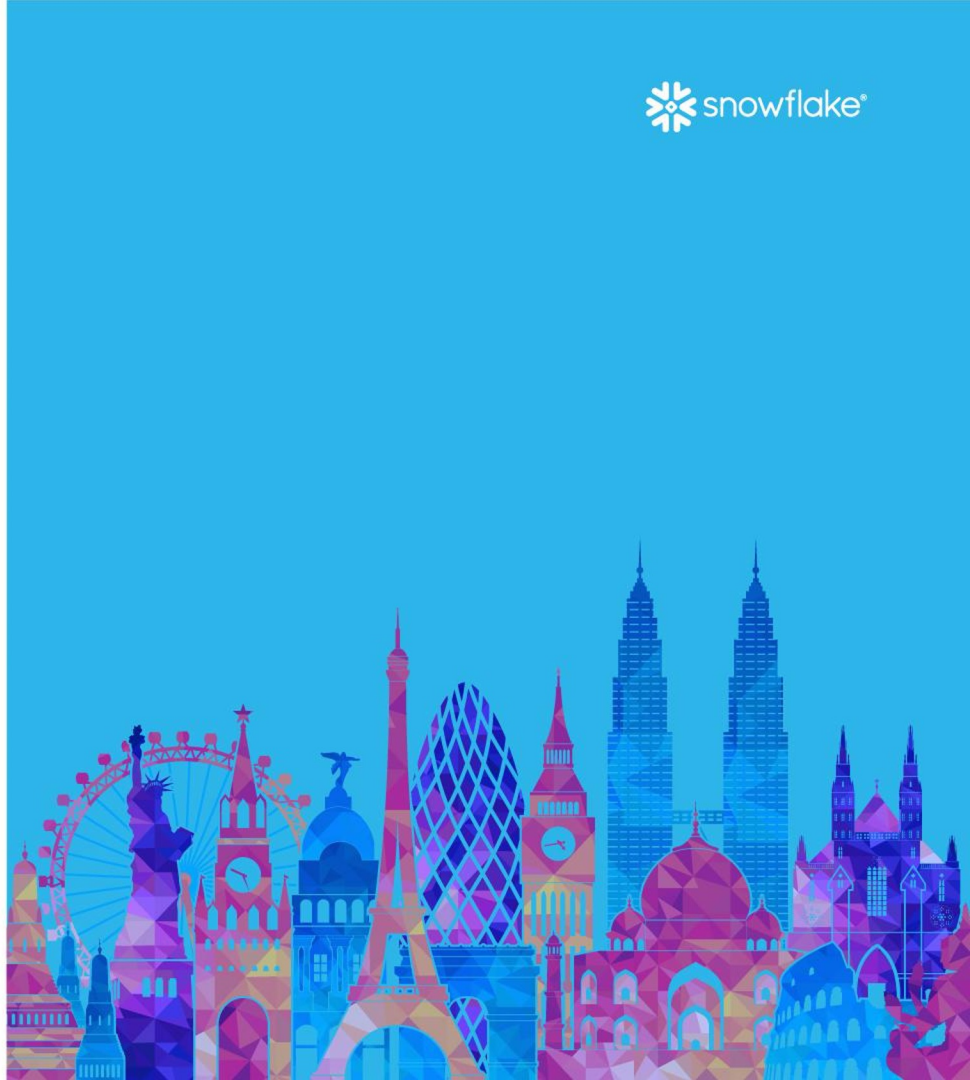
## ➤ Global Data Clean Room

Cross-Industry Use Cases

Example: Advertiser Direct Media Buy

Snowflake Enabling Features

## DATA CLOUD WORLD TOUR



# Data Collaboration with Protections

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# ELEMENTS OF THE DATA CLOUD



PLATFORM



CONTENT



# BENEFITS OF SNOWFLAKE COLLABORATION

## Across Cloud & Region

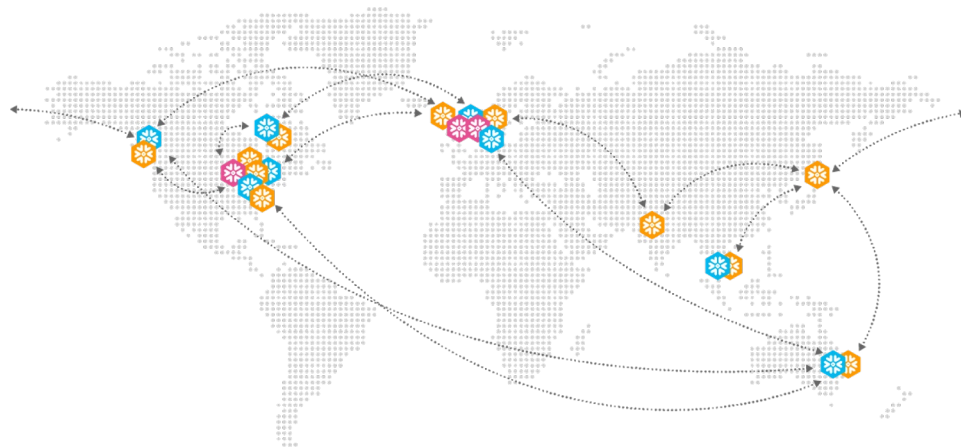
The only platform that delivers direct access to live, ready-to-query data across clouds and regions with on-demand fulfillment and no ETL

## More than Data

Snowflake enables customers to collaborate with data, data services and applications including built-in usage based monetization.

## Robust Data Governance

Achieve privacy-preserving collaboration with targeted discovery, revocable access and use case level auditing.



Snowflake Regions



AWS



Azure



GCP



# BENEFITS OF SNOWFLAKE COLLABORATION

## Across Cloud & Region

The only platform that delivers direct access to live, ready-to-query data across clouds and regions with on-demand fulfillment and no ETL

## More than Data

Snowflake enables customers to collaborate with data, data services and applications including built-in usage based monetization.

## Robust Data Governance

Achieve privacy-preserving collaboration with targeted discovery, revocable access and use case level auditing.

DATA



Enable direct access to live, ready-to query data without ETL

DATA SERVICES



Deliver insights without exposing underlying data

APPLICATIONS



Discover, build and distribute apps that run natively within your Snowflake account



# BENEFITS OF SNOWFLAKE COLLABORATION

## Across Cloud & Region

The only platform that delivers direct access to live, ready-to-query data across clouds and regions with on-demand fulfillment and no ETL

## More than Data

Snowflake enables customers to collaborate with data, data services and applications including built-in usage based monetization.

## Robust Data Governance

Achieve privacy-preserving collaboration with targeted discovery, revocable access and use case level auditing.

### Discovery



Single Account  
Account Group  
Cloud Region(s)  
Public Marketplace

### Access



Row Access Policies  
Dynamic Data Masking  
Conditional Masking  
Query Constraints

### Audit



Listing views & events  
Jobs run by consumer  
Object & columns accessed  
Custom event logging



# BASIC DATA SHARING

```
use role accountadmin;
create share sales_share;
grant usage on database sales_db to share sales_share;
grant usage on schema sales_schema to share sales_share;
create secure view merchant_view as select * from sales;
grant select on secure view merchant_view to share sales_share;
alter share sales_share add accounts=xy12345, yz23456;
```



# DATA PROTECTION: COLUMN-LEVEL

Dynamic Data Masking for column-level Data

## Dynamically Mask Protected (PII, PHI)

### Column Data at Query Time

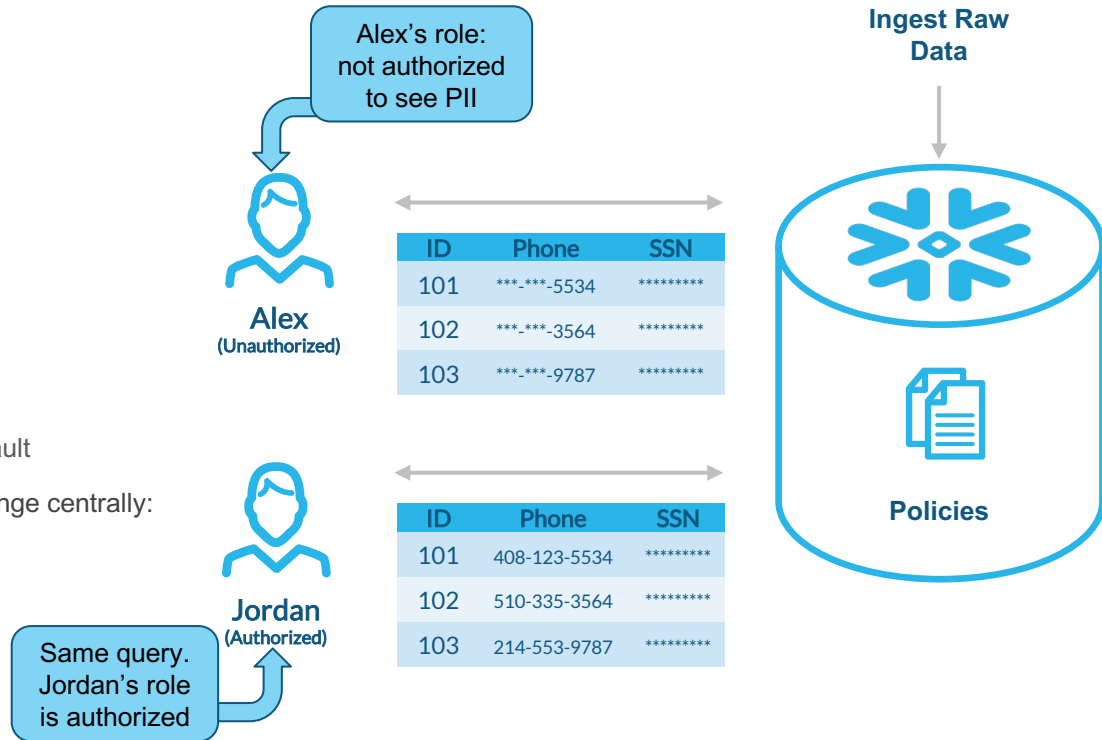
- No change to the stored data
- Mask or partial mask using constant value, hash, and custom functions
- Unmask for authorized users only

### Policy Based Control

- Table/View owners and privileged users (such as account admin) unauthorized by default
- **Centralised** policy management, Make a change centrally: applied across any number of columns

### Ease of Management

- Apply single policy to multiple columns
- Prevent secure view explosion



# DATA PROTECTION: ROW ACCESS POLICIES

Dynamically Filter Rows

## Centralise policies

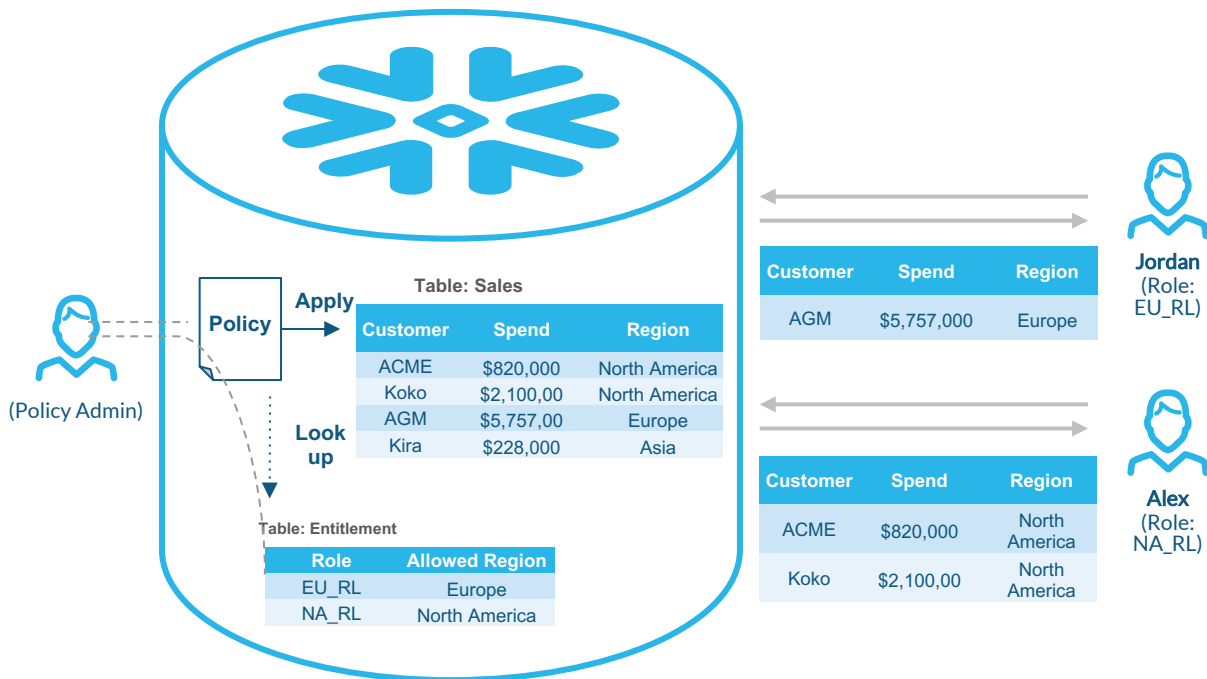
- Consistently enforced on tables, views, data shares, and external tables

## Easily manage access controls

- Prevent secure view explosion
- Support diverse workloads such as External Tables and Data Sharing

## Eliminate data silos

- Consolidate data and dynamically control access based on user authorization



# Secure Multi-party Computation

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# YAO'S MILLIONAIRE PRACTICE

## Yao's Millionaire:

### Yao's Millionaires' problem

From Wikipedia, the free encyclopedia



This article has multiple issues. Please help [improve it](#) or discuss these issues on the [talk page](#). *(Learn how and when to remove these template messages)*

[\[show\]](#)

**Yao's Millionaires' problem** is a [secure multi-party computation](#) problem introduced in 1982 by computer scientist and computational theorist [Andrew Yao](#). The problem discusses two millionaires, Alice and Bob, who are interested in knowing which of them is richer without revealing their actual wealth.

This problem is analogous to a more general problem where there are two numbers  $a$  and  $b$  and the goal is to determine whether the inequality  $a \geq b$  is true or false without revealing the actual values of  $a$  and  $b$ .

The Millionaires' problem is an important problem in [cryptography](#), the solution of which is used in [e-commerce](#) and [data mining](#). Commercial applications sometimes have to compare numbers that are confidential and whose security is important.

Many solutions have been introduced for the problem. The first solution, presented by Yao, is exponential in time and space.<sup>[1]</sup>

Load the [Yao's Millionaire Script from Github](#) to your account (Enterprise or higher)

- This sample shows how to use row access policies from within one account using different roles to protect underlying data.
- Here we use `Current_role()` vs `current_account()` so the sample can be executed simply in one account (The full HOL is cross account)



## ALICE

```
1 use role alicel;  
create or replace table alicel.data.my_wealth  
as select 1110000 as wealth;
```

```
3 select case  
when bob.wealth > alice.wealth then 'bob is  
richer'  
when bob.wealth = alice.wealth then 'neither  
is richer'  
else 'alice is richer' end  
from bob1.data.my_wealth bob,  
alicel.data.my_wealth alice  
where exists (select table_name from  
alicel.information_schema.tables where  
table_schema = 'DATA' and table_name =  
'MY_WEALTH' and table_type = 'BASE TABLE');
```

Row	CASE WHEN BOB.WEALTH > ALICE.WEALTH THEN 'BOB IS RICHER' ELSE 'ALICE IS RICHER'
1	bob is richer



## Yao's Millionaires' Problem in SQL Row Access Policy Solution

### BOB

```
2 use role bob1;  
create or replace table bob1.data.my_wealth as select 1250000 as  
wealth;
```

```
create or replace table bob1.data.allowed_statements (  
statement varchar(20000) );
```

```
CREATE OR REPLACE ROW ACCESS POLICY bob1.data.num_mask AS (wealth  
integer) returns boolean ->  
current_role() IN ('ACCOUNTADMIN','BOB1')  
or exists (select statement from  
bob1.data.allowed_statements where statement=current_statement()  
);
```

```
alter table bob1.data.my_wealth add row access policy  
bob1.data.num_mask on (wealth);
```

```
insert into bob1.data.allowed_statements (statement)  
values ('select case  
when bob.wealth > alice.wealth then \'bob is richer\<'  
when bob.wealth = alice.wealth then \'neither is richer\<'  
else \'alice is richer\' end  
from bob1.data.my_wealth bob,  
alicel.data.my_wealth alice  
where exists (select table_name from  
alicel.information_schema.tables where table_schema = \'DATA\<'  
and table_name = \'MY_WEALTH\' and table_type = \'BASE  
TABLE\');');
```

# ALICE CAN'T SEE BOB'S PII

Find database objects Start with... Run  All Queries | Saved 43 minutes ago ALICE1 MASKING\_WH (XS) BOB1 DATA

Starting with...

- ALICE1
- BOB1
- DATA
  - Tables
    - ALLOWED\_STATEMENTS
    - MY\_WEALTH
  - No Views in this Schema
  - INFORMATION\_SCHEMA

```
53
54 //Bob inserts an allowed statement into his allowed statements table
55
56 insert into bob1.data.allowed_statements (statement)
57 values ('select case
58 when bob.wealth > alice.wealth then \'bob is richer\'
59 when bob.wealth = alice.wealth then \'neither is richer\'
60 else \'alice is richer\' end
61 from bob1.data.my_wealth bob,
62 alice1.data.my_wealth alice
63 where exists (select table_name from alice1.information_schema.tables where table_schema = \'DATA\' and table_name = \'MY_WEALTH\' and table_type = \'BASE TABLE\');');
64
65
66
67 grant usage on database bob1 to role alice1;
68 grant usage on schema bob1.data to role alice1;
69 grant select on table bob1.data.my_wealth to role alice1;
70
71 // Shifting to Alice's side:
72
73 use role alice1;
74
75 select * from bob1.data.my_wealth;
76
77
78
79 select case
80 when bob.wealth > alice.wealth then \'bob is richer\'
81 when bob.wealth = alice.wealth then \'neither is richer\'
82 else \'alice is richer\' end
83 from bob1.data.my_wealth bob,
84 alice1.data.my_wealth alice
85 where exists (select table_name from alice1.information_schema.tables where table_schema = \'DATA\' and table_name = \'MY_WEALTH\' and table_type = \'BASE TABLE\');
86
```

**Results** Data Preview History 47 Column

✓ Query ID SQL 681ms 0 rows

Filter result Copy Columns

Row	Data Type	WEALTH
	NUMBER(7,0)	

1 rows 1.0 KB

Cluster by -

Columns WFAITH

Data Type NUMBER(7,0)

Status Duration

- ✓ 681ms
- ✓ 1.9s
- ✓ 379ms
- ✓ 68ms
- ✓ 212e



# ALICE CAN RUN AN APPROVED QUERY

Find database objects 🔍 ⏪

Starting with...

- ALICE1
- BOB1
  - DATA
    - Tables
      - ALLOWED\_STATEMENTS
      - MY\_WEALTH
- No Views in this Schema
- INFORMATION\_SCHEMA

**Run**  All Queries | Saved 44 minutes ago ALICE1 MASKING\_WH (XS)

```
54 //Bob inserts an allowed statement into his allowed statements table
55
56 insert into bob1.data.allowed_statements (statement)
57 values ('select case
58 when bob.wealth > alice.wealth then \'bob is richer\'
59 when bob.wealth = alice.wealth then \'neither is richer\'
60 else \'alice is richer\' end
61 from bob1.data.my_wealth bob,
62 alice1.data.my_wealth alice
63 where exists (select table_name from alice1.information_schema.tables where table_schema = \'DATA\' and table_name = \'MY_WEALTH\' and table_type = \'BASE TABLE\');');
64
65
66
67 grant usage on database bob1 to role alice1;
68 grant usage on schema bob1.data to role alice1;
69 grant select on table bob1.data.my_wealth to role alice1;
70
71 // Shifting to Alice's side:
72
73 use role alice1;
74
75 select * from bob1.data.my_wealth;
76
```

```
77
78
79 select case
80 when bob.wealth > alice.wealth then 'bob is richer'
81 when bob.wealth = alice.wealth then 'neither is richer'
82 else 'alice is richer' end
83 from bob1.data.my_wealth bob,
84 alice1.data.my_wealth alice
85 where exists (select table_name from alice1.information_schema.tables where table_schema = 'DATA' and table_name = 'MY_WEALTH' and table_type = 'BASE TABLE');
86
```

**Results** Data Preview

✓ Query ID SQL 1.66s 1 rows

Filter result... 📄 Copy

Row	CASE WHEN BOB.WEALTH > ALICE.WEALTH THEN 'BOB IS RICHER' WHEN BOB.WEALTH = ALICE.WEALTH THEN 'NEITHER IS RICHER' ELSE 'ALICE IS RICHER' END
1	bob is richer

Columns ▼ 🔍

MY\_WEALTH Preview Data ×

1 rows 1.0 KB

Cluster by -

Columns Data Type

WEALTH NUMBER(7,0)

Histor Status

- ✓
- ✓
- ✓
- ✓



## ALICE

```
1 use role alice1;
create or replace table alice1.data.my_wealth
as select 1110000 as wealth;
```

```
use role alice1;
```

```
3 select case
when bob.wealth > alice.wealth then 'bob
is richer'
when bob.wealth = alice.wealth then
'neither is richer'
else 'alice is richer' end
from bob1.data.my_wealth_v bob,
alice1.data.my_wealth
at(timestamp => '2022-10-01 09:03:00 HST')
alice
where exists (select table_name from
alice1.information_schema.tables where
table_schema = 'DATA' and table_name =
'MY_WEALTH' and table_type = 'BASE TABLE')
// bob is richer

update my_wealth set wealth = 3000000;

// re-run above select case...
// bob is richer (still!)
```

## Yao's Millionaires' Problem in SQL Masking Policy Solution

### with Defenses

[full example here](#)

## 2 BOB

```
use role bob1;
create or replace table bob1.data.my_wealth as select 1250000 as
wealth;
create or replace secure view bob1.data.my_wealth_v as select *
from bob1.data.my_wealth;
```

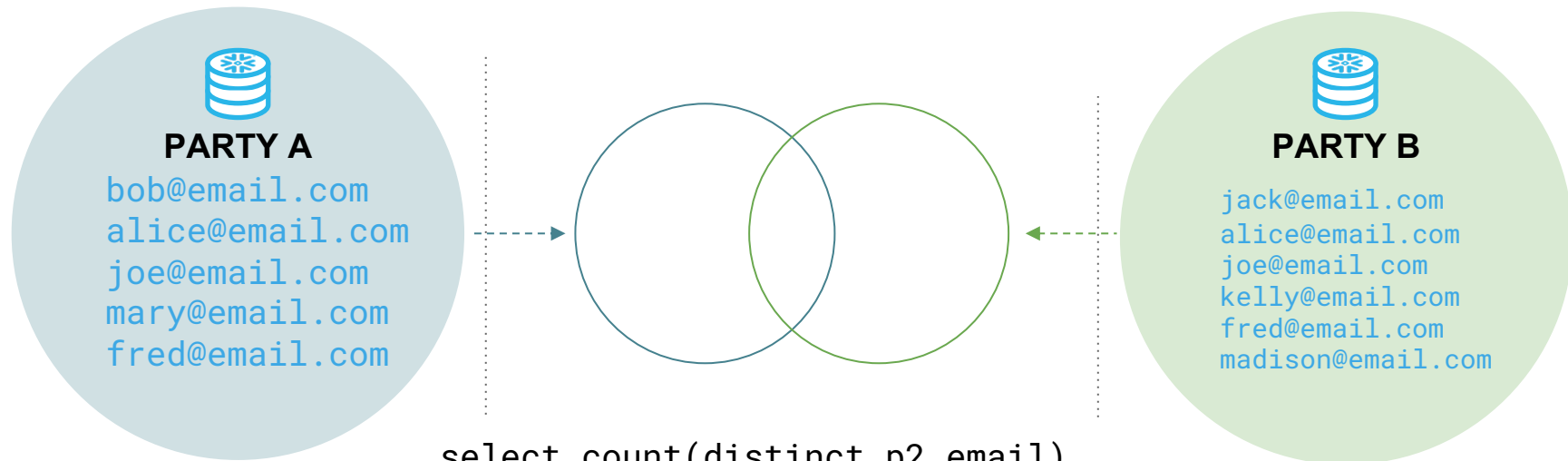
```
create or replace masking policy bob1.data.millionaires_mask as
(val integer) returns integer ->
case
when current_statement() =
'select case
when bob.wealth > alice.wealth then \'bob is richer\'
when bob.wealth = alice.wealth then \'neither is richer\'
else \'alice is richer\' end
from bob1.data.my_wealth_v bob, alice1.data.my_wealth
at(timestamp => '2022-10-01 09:03:00 HST') alice
where exists (select table_name from
alice1.information_schema.tables where table_schema = \'DATA\' and
table_name = \'MY_WEALTH\' and table_type = \'BASE TABLE\');'
then val else 1/0 end;
```

```
alter view bob1.data.my_wealth_v modify column wealth set masking
policy bob1.data.millionaires_mask;
```

```
grant select on view bob1.data.my_wealth_v to role alice1;
```



# WHAT IF I WANT TO KNOW HOW MANY CUSTOMERS WE HAVE IN COMMON?



```
select count(distinct p2.email)
  from party1.data.customers p1
 join party2.data.customers p2 on
   (p1.email = p2.email)
 having count(distinct p2.email) >= 2;
// result: 3
```



# Global Data Clean Room

**DATA CLOUD WORLD TOUR**



# SNOWFLAKE FOR DATA CLEAN ROOMS



## SECURE

Answer questions of data while preventing drill down to PII



## EASY

Overlap & join without copying, moving, or sharing the underlying data

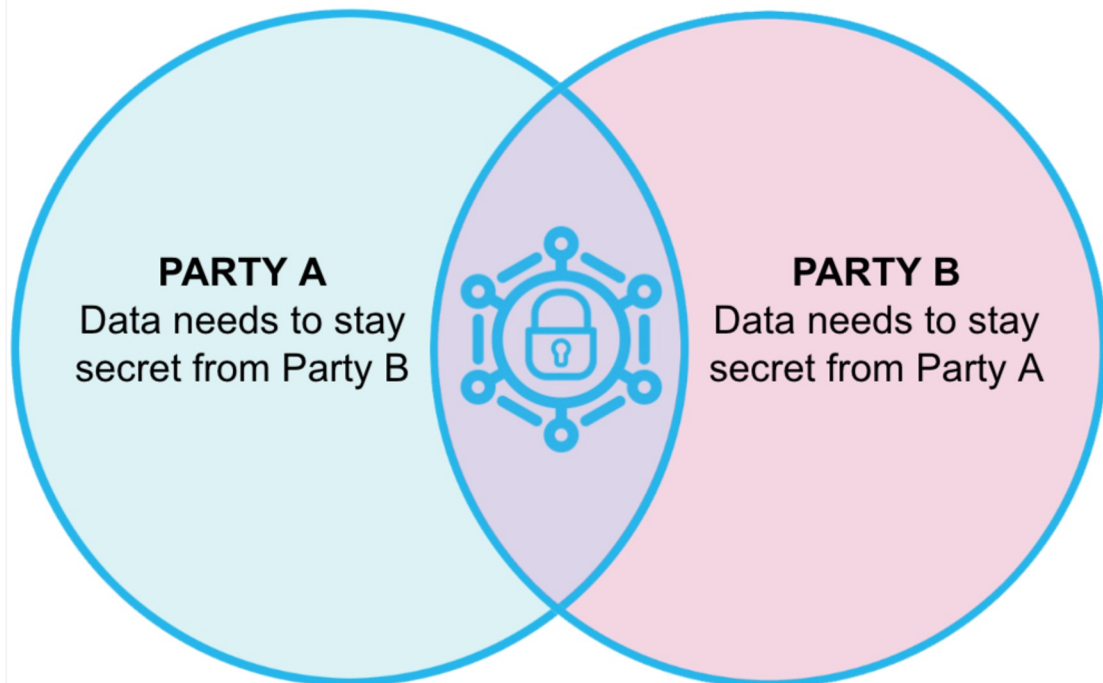


## POWERFUL

Enable large amounts of compute against other company's data

## GLOBAL DATA CLEAN ROOM

Row Access Policies | Stored Procs | Data Sharing



# CROSS-INDUSTRY USE CASES



## Advertising

- Audience insights
- Segmentation
- Measurement (reach & frequency analysis)
- Multi-touch attribution
- Activation



## Retail & CPG

- Optimize their marketing and promotional activities
- Product decisions (new product categories to enter)
- Supply chain decisions (how much to distribute to which distribution center).



## Life Sciences & Healthcare

- Clinical trials analysis
- Population selection
- Efficacy measurement
- Safety analysis
- Drug discovery



## Financial Services

- Fraud detection modeling
- Anti-Money Laundering (AML) compliance.
- Securely share sensitive position and portfolio data for risk analysis, exposure analysis, regulatory, and settling activities



## Government

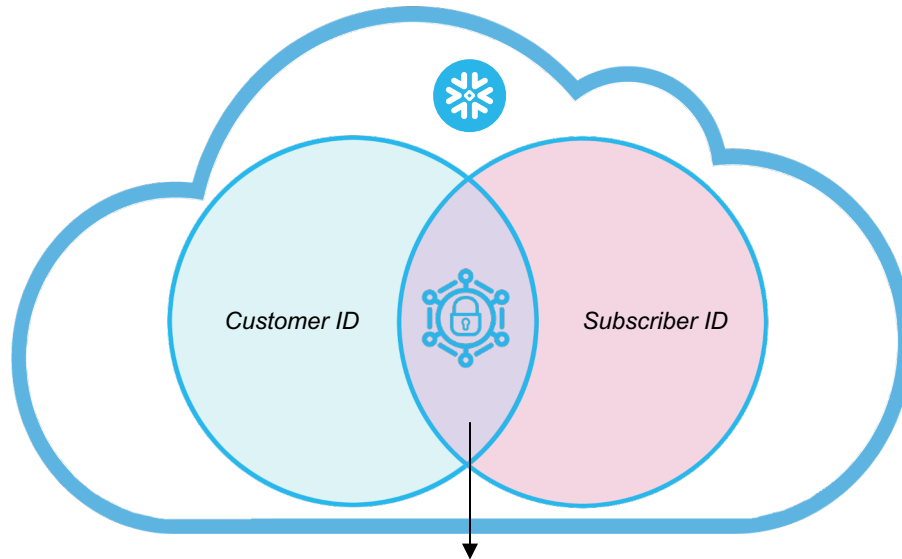
Allow different agencies to share data with each other, e.g. surveillance, communications, watch-lists, monitoring, aerial images, video, audio, language translation.



# EXAMPLE: ADVERTISER DIRECT MEDIA BUY

## Brand / Advertiser

- **Objective:** Better predict return on advertising spend and attain timely, granular attribution analytics
- **Data:** Sales, web traffic, customer segments



## Media Publisher

- **Objective:** Sell targeted inventory w/privacy compliant, real time, scalable solution
- **Data:** Subscribers and viewing patterns

Program	High Mileage Runner	College Basketball	U18 Soccer Players	65+ Tennis	High School Football
Whale Week	2500	2000	500	3000	5500
Friendliest Catch	5500	3000	404	220	2000
Cyber Rush	2200	500	100	8000	500
Rulebusters	3300	7000	850	7100	150
Cakemakers	<del>25</del>	<del>60</del>	<del>8</del>	<del>14</del>	<del>32</del>

**Redacted to reduce risk of re-identification**



# DCR ENABLING FEATURES

## Row Access Policies And SQL Query Templates

Match customer data  
without exposing PII

**PREVIEW**

Est GA: Q3 2023

## Native Applications

Simplified deployment of  
application capabilities and  
protected insights

## Stored Procedures

Generate and validate query requests  
**Languages:** SQL, Javascript, Python

**PREVIEW**

Est GA: Q2 2023

## Python UDF enables JINJA Templates

Substitutable Query  
Templates

## Secure Data Sharing

Automatically and securely  
share tables between  
multiple snowflake  
accounts

**ROADMAP**

Est PrPr: Q4 2023

## Project & Aggregation Constraints

Join on fields without being  
able to view them.  
Allow queries about groups,  
not individuals



# QUERY TEMPLATE EXAMPLES

- **Audience Overlap and Segment Creation** for analyzing aggregate groupings of overlapping customers and building segments for audience planning
- **Customer Enrichment** to receive enriched data on overlapping customers
- **Measuring Campaign Success** and return on advertising spend
- **PREVIEW** **Finding Lookalike Segments** to grow your target audience



# EXAMPLE – JINJA CUSTOMER OVERLAP TEMPLATE

```
select
  identifier({{ dimensions[0] }})
  {% for dim in dimensions[1:] %}
  , identifier({{ dim }})
  {% endfor %}
  , count(distinct p.email) as overlap
from
  {{ app_data | sqlsafe }}.cleansroom_provider_data.p
  {{ consumer_db | sqlsafe }}.{{ consumer_schema | sqlsafe }}.{{ consumer_table | sqlsafe }} at(timestamp)
where
  c.{{ consumer_join_field | sqlsafe }} = p.email
  and exists (select table_name from {{ consumer_db | sqlsafe }}.information_schema.tables where table_s
table_name = upper('{{ consumer_table | sqlsafe }}') and table_type = 'BASE TABLE')
  {% if where_clause %}
  and ( {{ where_clause | sqlsafe }} )
  {% endif %}
group by
  identifier({{ dimensions[0] }})
  {% for dim in dimensions[1:] %}
  , identifier({{ dim }})
  {% endfor %}
having count(distinct p.email) > 25
order by count(distinct p.email) desc;
```



# EXAMPLE – SQL CUSTOMER OVERLAP TEMPLATE

```
select
  @dimensions
  count(distinct p.email) as overlap
from
  @app_data.cleanroom.provider_data p,
  @consumer_db.@consumer_schema.@consumer_table at(timestamp => '@at_timestamp'::timestamp_tz)
where
  c.@consumer_join_field = p.email
  and exists (select table_name from @consumer_db.information_schema.tables where table_schema
  and table_name = upper('@consumer_table') and table_type = 'BASE TABLE') @where_clause
@group_by
having count(distinct p.email) > 25
order by count(distinct p.email) desc;
```



# EXAMPLE – EXECUTE REQUEST

```
call dcr_JINJANDP_consumer.JNA54922_schema.request('customer_overlap',  
  object_construct(  
    'dimensions', array_construct('c.pets', 'p.status'),  
    'where_clause', ' c.PETS <> $$BIRD$$ '  
  )::varchar, NULL, NULL);
```



# EXAMPLE - CONFIGURED TEMPLATE

```
select
    identifier('c.pets')
    , identifier('p.status')
    , count(distinct p.email) as overlap
from
    dcr_JINJANDP_app.cleanroom.provider_data p,
    dcr_JINJANDP_consumer.mydata.customers at(timestamp => '2022-09-01 13:46:44.005 -070
where
    c.email = p.email
    and exists (select table_name from dcr_JINJANDP_consumer.information_schema.tables w
and table type = 'BASE TABLE')
    and ( c.PETS <> $$BIRD$$ )
group by
    identifier('c.pets')
    , identifier('p.status')
having count(distinct p.email) > 25
order by count(distinct p.email) desc;
```



# GLOBAL DATA CLEAN ROOM DEMO

## SNOWFLAKE SNOWSIGHT UI

DCR Snowsight

	campaign_1	campaign_2	campaign_3
product_1	228	282	207
product_2	204	245	249
product_3	223	204	213
product_4	202	197	207
product_5	236	205	218

## STREAMLIT UI





**THANK YOU**

**DATA CLOUD WORLD TOUR**

# APPENDIX

**DATA CLOUD WORLD TOUR**

