

### 100 Snowflake Cost Optimization Techniques

ALL ABOUT

COST AND PERFORMANCE OPTIMIZATION
IN SNOWFLAKE

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COST AND PERFORMANCE OPTIMIZATION

IN SNOWFLAKE

#### Best Ways to Benefit from this Course

- \* Free Trial Snowflake Account
- \* VSCode Project Setup + GitHub
- \* 10 Sections w/ Introductions
- \* Eventual Hands-On + End-Review (slides)
- \* Quizzes to Test Your Knowledge
- \* Captions + Playback Speed
- \* Q&A + Money Back Guarantee
- \* Review

### Introduction to Virtual Warehouses

Tip #1: Larger Virtual Warehouses May Actually Cost You Less

Tip #2: Auto-Suspend Any Warehouse After One Minute

Tip #3: Any Resumed Warehouse Will Cost You at Least One Minute

Tip #4: Never Auto-Suspend Any Warehouse After Less Than One Minute

Tip #5: X-Small Warehouses Could Be Powerful Enough

Tip #6: Resized Warehouses are for More Complex Queries

Tip #7: Multi-Cluster Warehouses are for Multiple Users and Concurrency

Tip #8: Multi-Cluster Warehouses Should Always Have Min Clusters 1

Tip #9: Use Economy Scaling Policy To Save Money

Tip #10: When to Use Snowpark-Optimized Warehouses

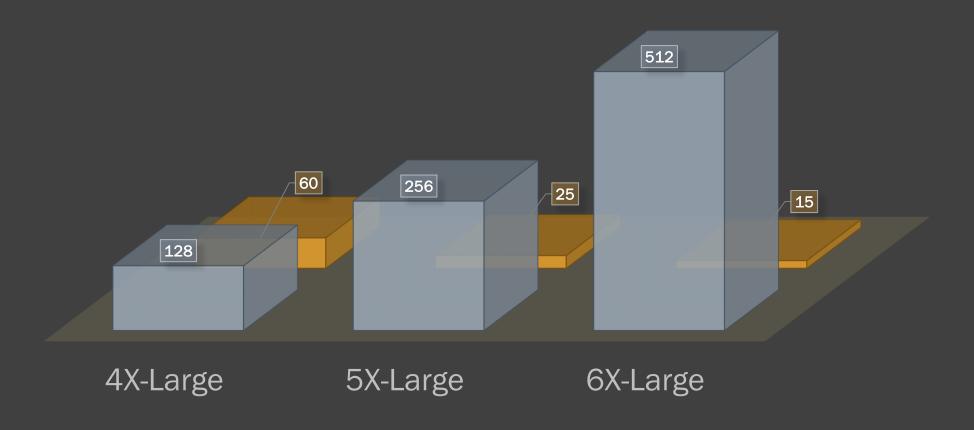
#### Larger Warehouses

May Actually

Cost You Less

#### WAREHOUSE SIZE VS QUERY EXECUTION TIME

■ Nodes ■ Seconds



#### Cost

**4X-Large:** 128 Nodes x 60 secs =  $128 \times 5c = $6.40$ 

**5X-Large**: 256 Nodes x 30 secs =  $256 \times 2.5c = $6.40$ 

**6X-Large:** 512 Nodes x 15 secs =  $512 \times 1.25c = $6.40$ 

at \$3/credit = \$3/hour/node = 5c/minute/node

- \* virtual warehouses bring 80-90% of all Snowflake costs!
- \* cost effective = ~same cost, but using more resources
- \* double in size WH + query twice faster → ~same cost!
- \* bigger warehouses can actually save you money!
- \* at some point, bigger warehouses will no longer execute so fast
- \* small warehouses could take forever in very complex queries

Auto-Suspend

Any Warehouse

After One Minute

#### Cost

query execution time: 4 min/hour = 96 min/day x 5c = \$4.80

1 min auto-suspend: 4 min/hour = 96 min/day x 5c = \$4.80

5 min auto-suspend: 20 min/hour = 480 min/day x 5c = \$24

for one query taking one min every 15 min w/X-Small warehouse  $\rightarrow$  \$3/credit = 5c/min (running!)

- \* idle warehouses cost money (the same!)
- \* reducing auto-suspend to the min will save you big!
- \* creating a warehouse will auto-resume it
- \* can set INITIALLY\_SUSPENDED to True only by code
- \* avoid auto-suspend by executing more queries together

#### Resumed Warehouses

Will Cost You

at Least One Minute

#### Cost

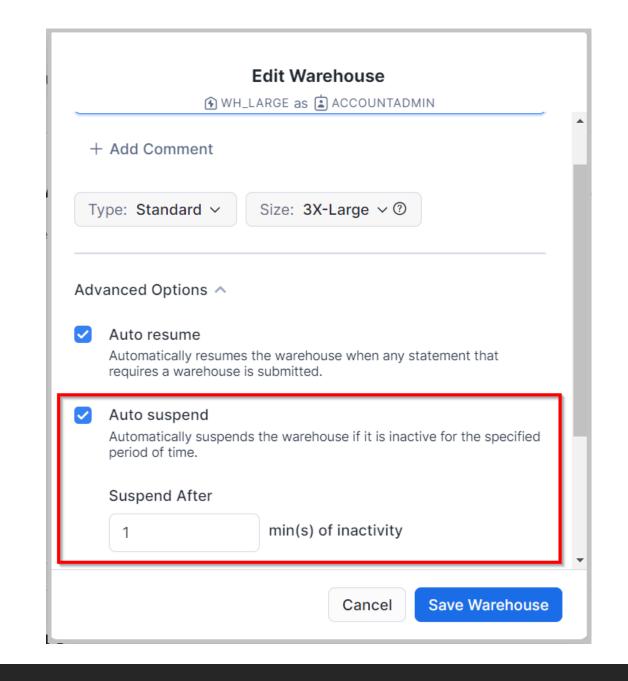
**suspend after 10 secs**: 192 nodes x 1 min x 5c = \$9.60

suspend-resume in 10 secs: 192 nodes x  $\frac{2 \text{ min}}{2 \text{ min}}$  x 5c =  $\frac{19.20}{2 \text{ min}}$ 

for 3 clusters w/ 3X-Large WH each = 3 x 64 nodes = 192 nodes

- \* you are charged at least one minute for any WH resume
- \* min auto-suspend (recommended) is one minute
- \* default auto-suspend is 5 minutes -> change it to 1 min
- \* a background task checks every minute for auto-suspend
- \* the one-minute period restarts when warehouse resumed
- \* suspend+resume within a minute may charge you twice

# Never Auto-Suspend Any Warehouse After Less Than a Minute



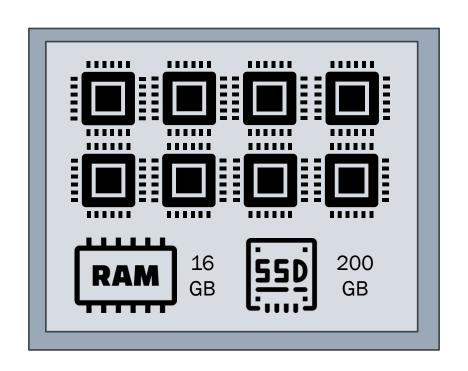
- \* in Snowsight -> min auto-suspend is one minute (recommended)
- \* in SQL  $\rightarrow$  min auto-suspend is 0 seconds (60 recommended)
- \* auto-suspend zero means you always keep it alive
- \* a background task checks every minute for auto-suspend
- \* the one-minute period restarts when warehouse resumed
- \* suspend+resume within a minute may charge you twice

### X-Small Warehouses

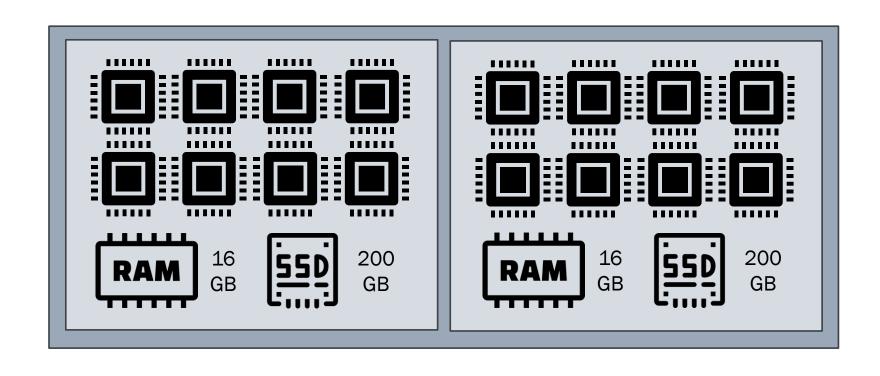
Could Be

Poweful Enough

#### X-Small Warehouse (1 node)



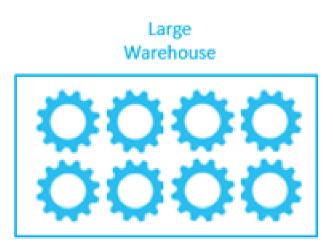
#### Small Warehouse (2 nodes)



- \* a "node" is way more than a one-CPU VM
- \* a single "node" is rather a powerful server w/ 8-vCPUs
- \* do not overspend, as X-Small could be enough
- \* assumed 16 GB RAM + 200 GB SSD
- \* for AWS: c5d.2xlarge EC2 instance (except for 5XL and 6XL)
- \* but only Snowflake knows what's in a node (CPU, RAM, SSD)

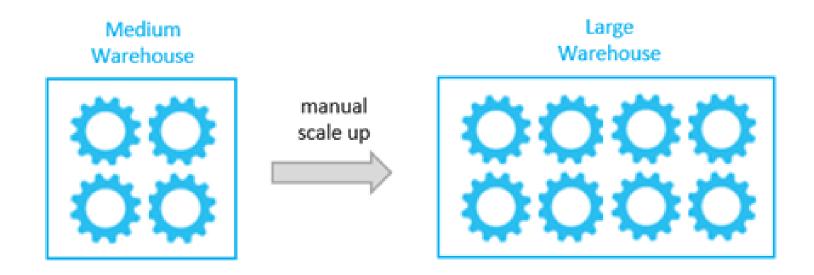
# Resized Warehouses are for More Complex Queries

#### Fix Warehouse Size





#### Manual Scale

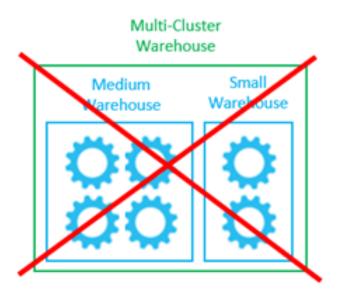


- \* bigger sizes could help more complex queries execute faster
- \* bigger warehouse size could cost you less (as seen before)
- \* no concurrency improvement by resizing
- \* resizing a warehouse is always a manual process
- \* one query can be executed by only one warehouse
- \* cannot have different sizes in a multi-cluster warehouse

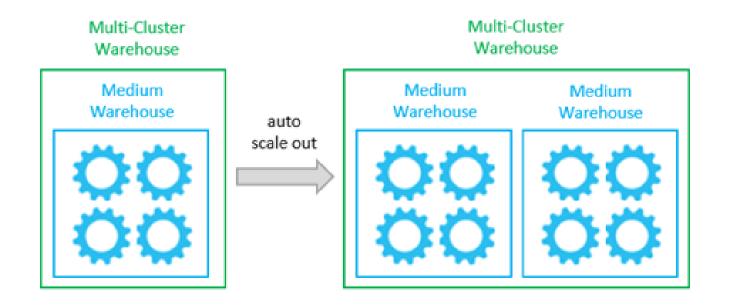
# Multi-Cluster Warehouses are for Multiple Users and Concurrency

#### Fix Cluster Size

## Multi-Cluster Warehouse Medium Warehouse Warehouse



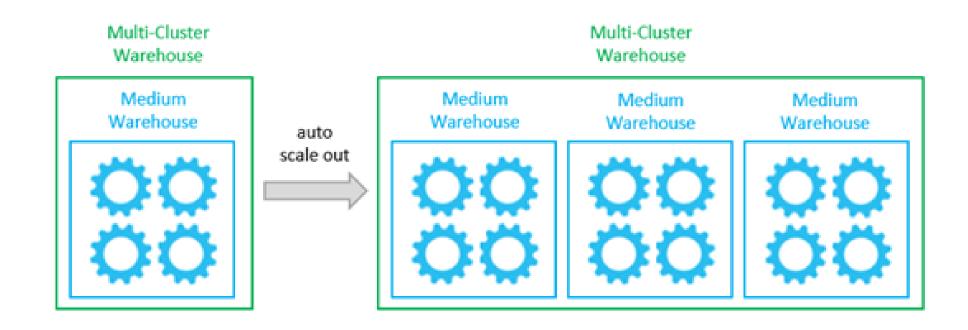
#### Auto Scale



- \* multi-cluster warehouses improve concurrent access
- \* multi-cluster warehouses do not help with complex queries
- \* multi-clustering = main reason you should have Enterprise Edition
- \* cannot have different sizes in a multi-cluster warehouse
- \* could be avoided by assigning diff users/queries to diff warehouses
- \* support auto-scaling (between 1..10 clusters)
- \* one query can be executed by only one warehouse

# Multi-Cluster Warehouses Should Always Have Min Clusters 1

#### Auto Scale



- \* do not over-provision w/ min cluster count > 1
- \* unnecessary costs
- \* you may have one user running queries w/ very low latency (no queuing)
- \* min cluster count = max cluster count > no auto-scale

Use Economy

Scaling Policy

To Save Money

#### Multi-Cluster Warehouses

- \* scale modes
  - maximized → min=max clusters
  - auto-scale → between min < max clusters</li>
- \* scaling policies
  - ∘ **standard** (def) → for end-user live queries (performance is top priority)
  - economy → for lower priority batch jobs (to optimize cost)

#### Standard Scaling Policy

- \* auto-resume: after 20 secs when new queued req + prior WH at its capacity
- \* auto-suspend: after 2-3 checks every min, if queries on least loaded WH can be distributed elsewhere

- \* avoid query queuing without saving credits
- \* for end-user live queries, when performance is a priority

#### Economy Scaling Policy

- \* auto-resume: when crt queue load could keep new WH busy for min 6 mins
- \* auto-suspend: after 5-6 checks every min, if queries on least loaded WH can be distributed elsewhere

- \* save credits, query queuing may happen
- \* for lower priority batch jobs, to maximize throughput + optimize cost

- \* standard scaling policy (def) = will avoid queuing, but save no credits
- \* economy scaling policy = will save credits, but have query queuing
- \* auto-scale in (WH shutdown) could take 5-6 or 2-3 minutes!
- \* avoid scale mode *maximized*  $\rightarrow$  prefer *auto-scale* between min..max
- \* avoid MAX\_CLUSTER\_COUNT 10 → keep 5 ok
- \* MAX\_CONCURRENCY\_LEVEL (def 8) = queries in parallel on a WH

When to Use

Snowpark-Optimized

Warehouses

#### Costs

Type of Virtual Warehouse	X- Small	Small	Medium	Large	X- Large	2X- Large	3X- Large	4X- Large	5X- Large	6X- Large
Standard	1	2	4	8	16	32	64	128	256	512
Snowpark- optimized	n/a	n/a	6	12	24	48	96	192	384	768

- \* they have 16x more memory than Standard WHs + cost 33% more
- \* they are more for Data Science and ML experiments
- \* for one stored proc deployed by Snowpark in a single-node WH
- \* well-suited for model training in ML (not model serving!)
- \* no GPUs -> see rather Snowpark Container Services w/ NVIDIA

## Introduction to Compute Workloads

Tip #11: Use Resource Monitors

Tip #12: Use Account-Level Budgets

Tip #13: Prevent Never-Ending Queries

Tip #14: Manually Kill Running Queries

Tip #15: Reduce Warehouse Sizes

Tip #16: Consolidate All Warehouses

Tip #17: Use Parallel Jobs for Batch Transformations

Tip #18: Avoid Checking Too Much on Metadata

Tip #19: Charts for Warehouse Monitoring

Tip #20: Revisit the Main Traps with Warehouses

#### Use

#### Resource Monitors

#### CREATE RESOURCE MONITOR

- \* *levels*: account / warehouse SET RESOURCE\_MONITOR = ...
- \* with credit\_quota 

  auto-reset monthly by default
- \* triggers (on N percent do) notify / suspend / suspend\_immediate
- \* frequency = monthly / weekly / daily / yearly / never
- \* start\_timestamp (= immediately) ... end\_timestamp
- \* notify\_users = ("CRISTISCU", ...) all ACCOUNTADMIN by def

- \* specify one monitor for the whole account
- \* specify one monitor for each virtual warehouse (1-N)
- \* enable notifications for each account admin
- \* watch all warehouses with no res mon assigned
- \* suspend immediate if long running queries expected
- \* schedule, for batch queries w/ periodic runs

#### Use

Account-Level

Budgets

#### \* account budget

- PuPr, only for paying accounts, must enable/activate first
- $\circ$  max monthly spending limit  $\rightarrow$  auto-send emails when exceeding
- SNOWFLAKE.LOCAL.ACCOUNT\_ROOT\_BUDGET class

#### \* custom budgets

- on group of resources, in db.schema, max 100
- dbs, schemas, tables, mat views, WHs, pipes, tasks, serverless
- SNOWFLAKE.CORE.BUDGET class

Prevent
Never-Ending
Queries

- \* a running query is canceled by the system after 2 days
- \* STATEMENT\_TIMEOUT\_IN\_SECONDS = sess/WH/acct
  - def 2 days (172,800 secs), 0 to 604800 (7 days)
  - max overall time = queue + locked + exec + compile + ...
  - also for queries w/o WH (DDL/DML: CLONE, CREATE...)
- \* STATEMENT\_QUEUED\_TIMEOUT\_IN\_SECONDS = def O

# Manually Kill Running Queries

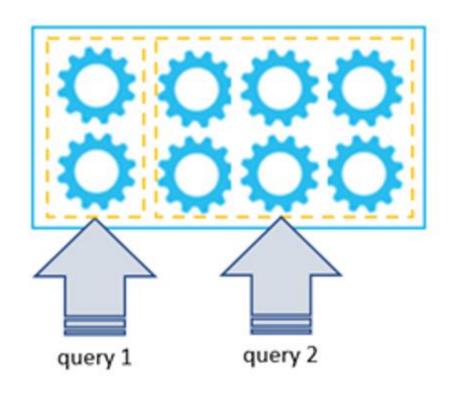
- \* Cancel button in Snowsight, X button in Query History
- \* SYSTEM\$CANCEL\_QUERY with last\_query\_id()
- \* CTRL+C from SnowSQL
- \* only own queries (not necessarily ACCOUNTADMIN)
- \* NOT with: close browser, abort session, suspend WH
- \* could also manually stop WH when query ends, to save money!

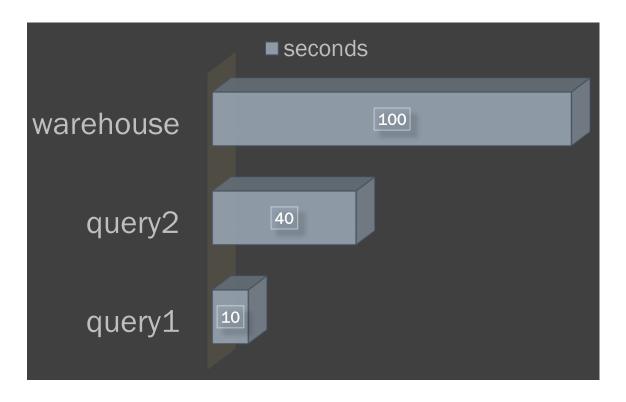
## Reduce Warehouse Sizes

- \* start with the smallest 1-node X-Small warehouse
- \* start with MIN\_CLUSTER\_COUNT 1 in multi-cluster WH
- \* as a user, connect with an X-Small default WH
- \* upsize only when need for larger WH is proven
- \* use Snowpark-optimized only for mem-intensive workloads
- \* drop expensive warehouses, not frequently used
- \* cancel queries taking too long w/ current warehouse

## Consolidate All Warehouses

#### Query Execution





#### Warehouse Load/Utilization

```
* query1 load: 10/100/2 = 5\% (could run 20 such queries in 100 secs)
```

```
* query2 load: 40/100/2 = 20\% (could run 5 such queries in 100 secs)
```

\* warehouse load/utilization: 0.05 + 0.2 = 25%

```
query1 (10 secs) + query2 (40 secs)
```

warehouse max\_concurrency\_level = 2

warehouse up: 40 secs (queries) + 60 secs (auto-suspend) = 100 secs

#### System Views

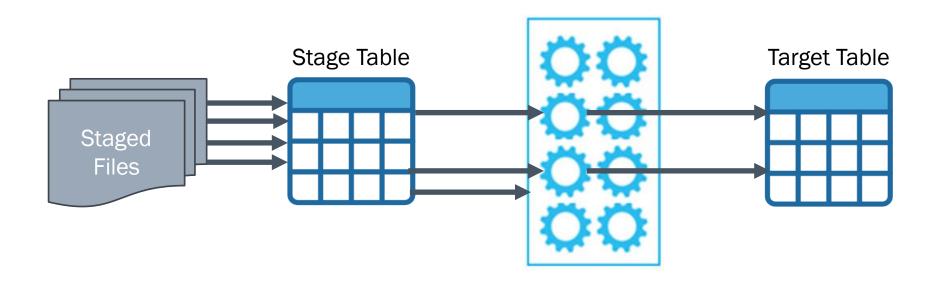
- \* WAREHOUSE\_METERING\_HISTORY
  - o start\_time .. end\_time + warehouse\_name
  - credits\_used
- \* QUERY\_HISTORY
  - o start\_time .. end\_time + warehouse\_name
  - execution\_time + query\_load\_percent

- \* consolidation = reduce # of underutilized warehouses (cost money!)
- \* overutilized warehouses (w/ queuing) have no cost impact
- \* query latency (queuing) vs warehouse utilization  $\leftarrow$  compromise!
- \* query load vs warehouse load (+ MAX\_CONCURRENCY\_LEVEL)
- \* redirect queries from some WHs to other WHs 

  see utilization heatmap
- \* group similar workloads in the same WH
- \* workload type (util. target): ETL (95%), interactive (80%), dashboards (60%)

## Use Parallel Jobs for Batch Transformations

#### Data Transformation Pipeline



- \* ~parallel ingestion into table from staged files
- \* split intensive MERGE statements w/ filters
- \* send multiple SQL jobs in parallel on diff connections
- \* max concurrency on 1-node X-Small WH is 10
- \* increase WH size for better distribution
- \* multi-cluster WH could also make sense for >> opers

# Avoid Checking Too Much on Metadata

#### Snowsight



#### \* Snowsight

- Snowflake's admin console will incur a cost!
- check Snowsight screens w/ a WH
- auto-refresh Query History every N seconds

#### \* querying metadata

- querying Information Schema does not require a WH
- querying Account Usage schema requires a WH
- many Account Usage queries are rather slow (ex: grants\_to\_roles)
- many Account Usage views could return a lot of data (ex: query\_history)
- many columns return JSON data, that needs flattening (ex: access\_history)

# Charts for Warehouse Monitoring

- \* overall compute: warehouses / cloud services / serverless
- \* WAREHOUSE\_METERING\_HISTORY view
- \* top warehouses by cost → credits used
- \* utilization heatmaps → warehouse loads
- \* queries -> running/provisioning/blocked/queued
- \* total spending per user / query type ...
- \* timeline charts

Revisit

the Main Traps

with Warehouses

- \* no predef. resource monitors + not through  $UI \rightarrow$  no proactive approach to overspending
- \* AUTO\_SUSPEND by def 600 (10 minutes) in code + 5 min in UI
- \* billed per second, but at least 1 min + AUTO\_SUSPEND 1 min at least (can be set lower!)
- \* manual 2+ resume+suspend pairs in the first minute  $\rightarrow$  billed for 2+ minutes!
- \* INITIALLY\_SUSPENDED by def FALSE and no UI access → bill 1 min no matter what
- \* MIN\_CLUSTER\_COUNT could be set to >1 → should be always 1
- \* STATEMENT\_TIMEOUT\_IN\_SECONDS 2 days by def + hidden Cancel btn in Query History
- \* STATEMENT\_QUEUED\_TIMEOUT\_IN\_SECONDS 0 by def (no timeout)

## Introduction to Snowflake Accounts

Tip #21: What to Choose for a Free Trial Account

Tip #22: When to Use a Free Trial Account

Tip #23: Understand Price Tables for Warehouse Compute Services

Tip #24: Understand Price Tables for Cloud and Serverless Services

Tip #25: Understand Price Tables for Storage and Data Transfer

Tip #26: Use the Account Overview Interface in Snowsight

Tip #27: Use Organization Accounts

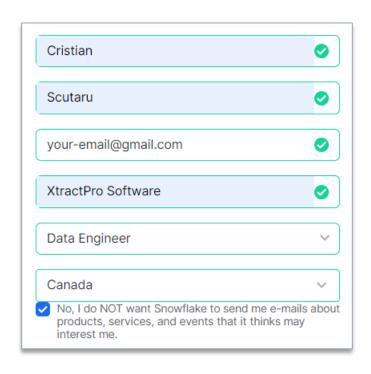
Tip #28: Limit Warehouse Changes with Access Control

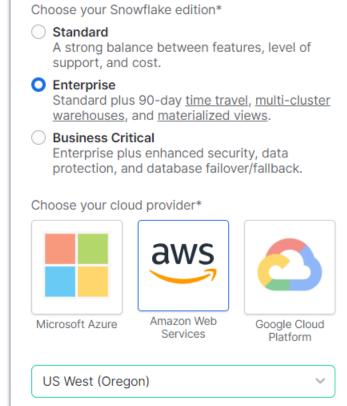
Tip #29: Adjust Default Values of Account-Level Parameters

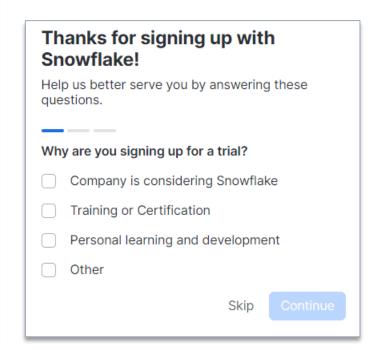
Tip #30: Careful with Reader Accounts

### What to Choose for a Free Trial Account

#### signup.snowflake.com







- \* no credit card required / no obligations whatsoever
- \* email address could be reused after a while
- \* no need for a corporate email address
- \* default Enterprise edition could be the most appealing
- \* AWS is frequently used first as provider for new PuPr features
- \* region closest to where you are / where your data is
- \* can skip the last survey questions

## When to Use a Free Trial Account

#### Limitations

- \* running out of email addresses
- \* some new features (Budgets) not on free trial accounts
- \* native apps sharing requires accounts within org
- \* no Snowflake customer service
- \* you'll need to upload/reinstall all after one month
- \* you lose all access after one month

- \* trial of native apps from Snowflake Marketplace
- \* experiments on large public datasets
- \* prototyping + trying new Snowflake features
- \* introducing a new potential client to Snowflake
- \* prepare for + write a new Udemy course

# Understand Price Tables

for Virtual Warehouse

Compute Services

# VW Compute Pricing

- \* Standard Edition = \$2/credit/node = \$2/h for X-Small WH
- \* Enterprise Edition = \$3/credit/node = \$3/h for X-Small WH
- \* Business Critical Edition = \$4/credit/node = \$4/h for X-Small WH

in AWS/US region, for active 1-Node WH

Small (2-Nodes) is 2x more expensive, Medium (4-Nodes) 4x etc.

# Snowflake Pricing

- \* Compute = w/ credits, for active VW/SPCS, per second, minimum 1 min
- \* Cloud Services = 4.4 credits/h, not billed if < 10% of daily VW credits
- \* Serverless Features = on managed compute (+cloud services), per second

- \* Data Sharing = pay for all Reader Accounts, not for other Snowflake accounts
- \* Storage = avg TB/mo (snapshots of data), compressed, diff for hybrid tables!
- \* Data Transfer = Ingress/Egress, separate for external functions

#### \* all compute

- VW Compute
- Cloud Services
- Serverless Features

#### \* for the same supported queries

- Enterprise is 1.5x more expensive than Standard
- Business Critical is 2x more expensive than Standard

# Understand Price Tables

for Cloud and

Serverless Services

#### Cloud Services

- \* distributed back-end systems
- \* SHOW commands
- \* query compilation
- \* result caches
- \* INFORMATION\_SCHEMA queries

#### Serverless Features

- \* Query Acceleration Service (QAS) Nx boost of a WH
- \* Search Optimization Service (SOS) (also in secondary db)
- \* Automatic Clustering for clustered tables (w/ clustered key), initial + recluster
- \* Materialized Views for maintenance (also in secondary db), auto-refresh data
- \* Snowpipe & Snowpipe Streaming w/ fixed credits/files or h
- \* Serverless Tasks 1.5x Managed Tasks (w/ WH)
- \* Hybrid Tables for maintenance+requests, indexes, R/W data
- \* Replication only in Business Critical for objects other than dbs

#### \* cloud services

- charged only when > 10% x daily VW consumption (rare!)
- could pile up for very frequently used metadata queries (~10k times)

#### \* serverless features

- Snowflake-managed vs user-managed resources
- charged w/ credits, ~WH, depending on the service
- billed per second, not when idle (like for the user-managed resources)
- Snowflake-managed compute + cloud service credits

# Understand Price Tables

for Storage and

Data Transfer

#### \* storage

- small fraction, in average TB/mo, for compressed data
- On-Demand / Capacity
- Hybrid Tables storage billed separately → GB/mo

#### \* data transfer

- very small fraction, in TB transferred, ~the cloud provider
- for data out only (data in free)
- free when within same region/continent/provider
- from COPY, replication, external functions

#### Use the

# Account Overview Interface in Snowsight

#### Cost Management interface

Account Overview PREVIEW

Consumption

Budgets

PREVIEW

Resource Monitors

Account spend for RAA41860 from Feb 24 - Mar 2 -

**\$1.11** 0.32

Spend in USD

Spend in credits

\$3

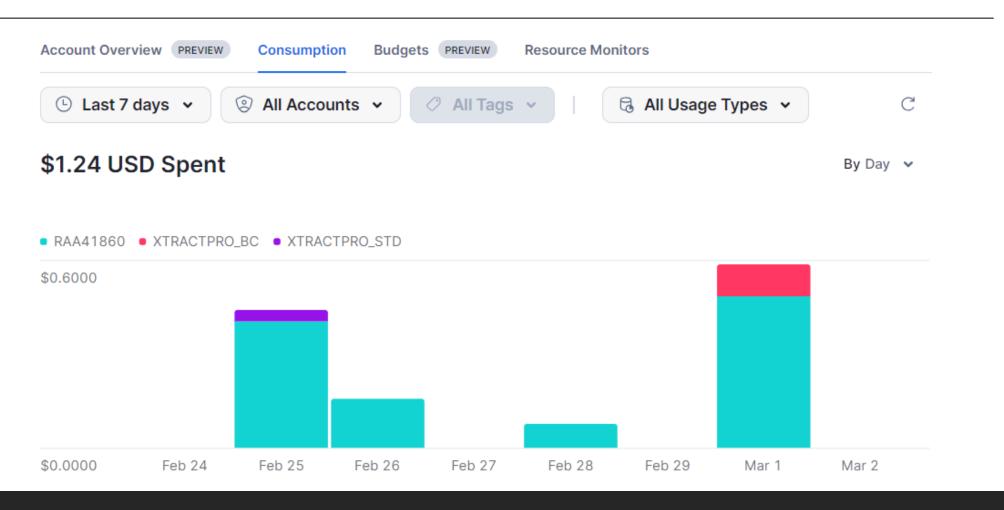
Compute price/credit **\$0.14** 

Average daily

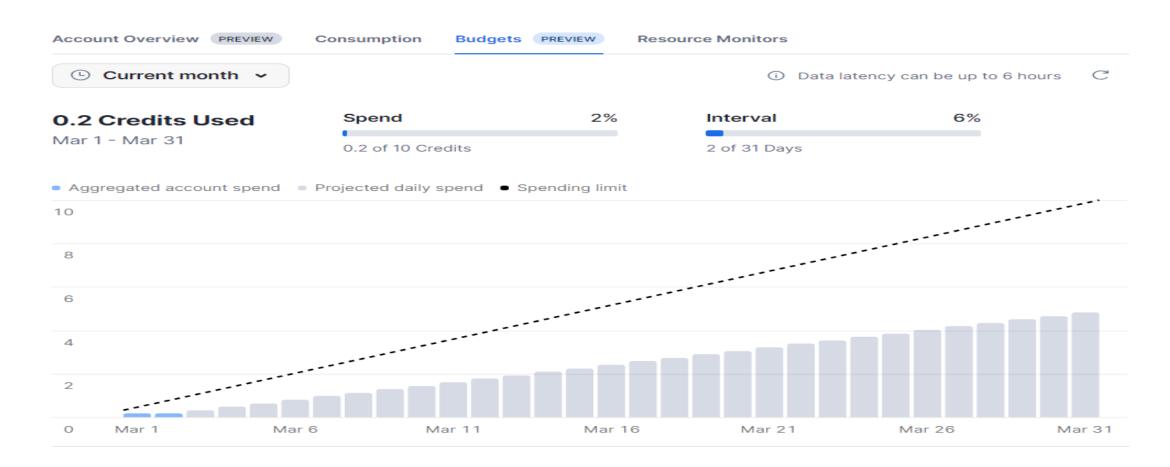
0.04

Average daily credits

# Consumption



# Budgets



- \* Cost Management Admin interface, w/ date range
  - Account Overview PuPr
  - Consumption per date range/acct, C/S/DT
  - Budgets PuPr, only paid accounts
  - Resource Monitors -

#### \* Account Overview Insights

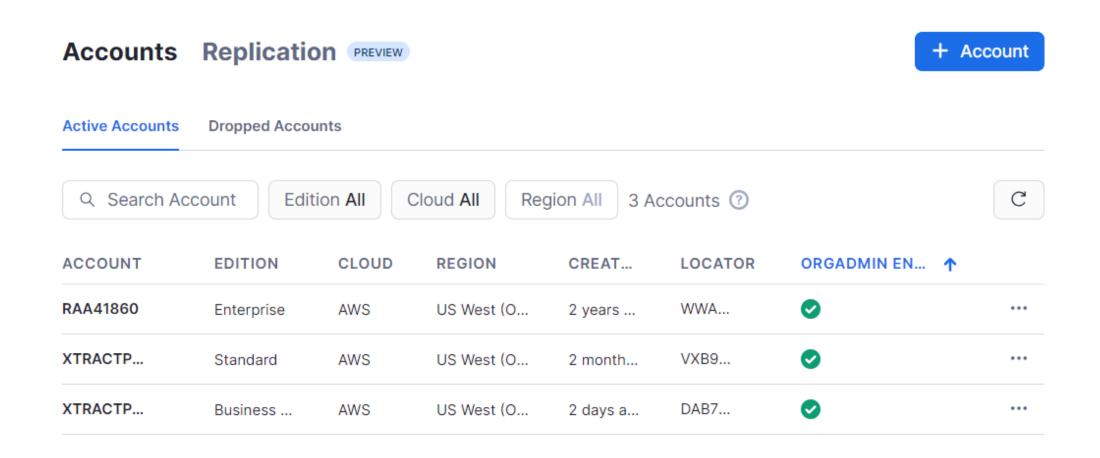
- Account budget for current month w/ budget(s)
- Top warehouses by cost w/ SQL
- Top databases by storage w/ SQL
- Most expensive queries total/avg exec time + #

#### Use

Organization

Accounts

#### Accounts interface



#### Accounts interface

- \* Create New Account
  - edition: Standard/Enterprise/Business Critical
  - cloud/region: AWS/Azure/GCP
- \* accounts: active/dropped 

  3..90 days grace period
  - manage URLs: locator/org-acct
  - enable/disable ORGADMIN

- \* create new related paid Snowflake accounts
- \* create Standard account for basic query experiments
- \* private share data & native apps within org accounts
- \* test new PuPr features available only in paid accounts
- \* requires higher level of security than free trial accounts
- \* SHOW ORGANIZATION ACCOUNTS ← w/ ORGADMIN

#### Limit

Warehouse Changes

with Access Control

- \* USAGE ← execute/abort queries (w/ eventual auto-resume)
- \* OPERATE ← execute/abort queries + view crt/past queries + suspend/resume
- \* MODIFY ← alter properties (including size) + assign to resource monitors
- \* MONITOR ← view current/past queries + usage statistics
- \* APPLYBUDGET ← add/remove from a budget
- \* OWNERSHIP ← full control (for a single role)
- \* ALL ← all privileges but OWNERSHIP

# Adjust Default Values of Account-Level Parameters

- \* time travel 

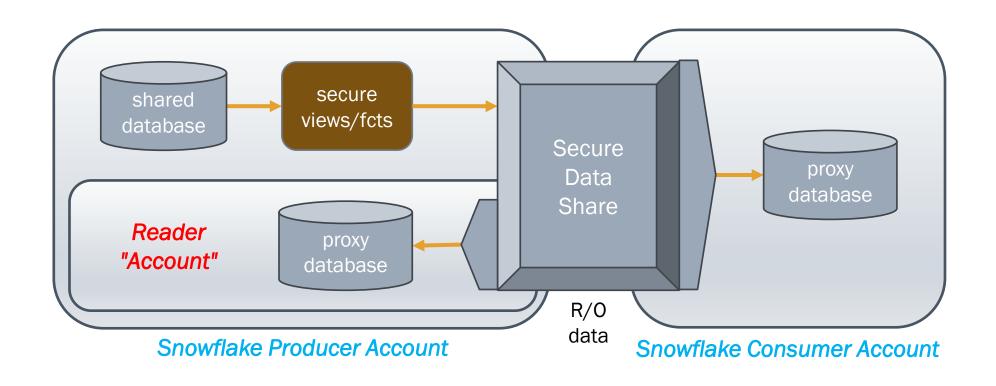
  cannot be disabled for an account!
  - MIN\_DATA\_RETENTION\_TIME\_IN\_DAYS (def 0), can force TT, does not alter current settings
  - DATA\_RETENTION\_TIME\_IN\_DAYS (def 1) 0..90 Ent / 0..1 Std, set def for database/schema/permanent tables, but cannot force disable w/ 0

#### \* replication

• INITIAL\_REPLICATION\_SIZE\_LIMIT\_IN\_TB – (def 10) max estimated size limit for initial replication of a primary db to a sec db, to prevent accounts w/ sec dbs from accidentally incurring large replication charges

# Careful with Reader Accounts

#### Data Share w/ Reader Account



- \* Reader accounts are not separate Snowflake accounts
- \* Reader accounts consume YOUR credits!
- \* monitor closely all your Reader accounts
- \* set resource monitors w/ budget alerts
- \* "local" admins could create/manage WHs there!

#### Introduction to Snowflake Editions

Tip #31: When to Choose Enterprise over Standard Edition

Tip #32: How to Avoid Multi-Cluster Warehouses

Tip #33: When to Use Incremental Materializations

Tip #34: How to Emulate Materialized Views

Tip #35: The Case for Extended Time Travel

Tip #36: Use Standard Edition Account for Analytics

Tip #37: Use Separate Standard Edition Account for Common Queries

Tip #38: How to Reduce Costs to Zero for an Inactive Paid Account

Tip #39: When to Choose the Business Critical Edition

Tip #40: When to Choose the Virtual Private Snowflake (VPS) Edition

When to Choose

Enterprise over

Standard Edition

#### Esential New Features

- \* Multi-Cluster Virtual Warehouses -> w/ auto-scaling out for concurrency
- \* Query Acceleration Service > boost WH size Nx, for eligible queries
- \* Search Optimization Service > for point lookup queries
- \* Materialized Views > w/ auto-maintenance of results
- \* Extended Time Travel -> max 90 days (from 1) for permanent tables

#### Other New Features

- \* Data Masking Policies -> column-level security in tables/views
- \* Row Access Policies -> row-level security for query rows
- \* Object Tagging >> to track sensitive data + resource usage
- \* Classification > to auto-tag potentially sensitive data
- \* User Access Auditing → in ACCESS\_HISTORY view
- \* Periodic Rekeying of Encrypted Data > increased protection
- \* Early Access to Weekly New Releases → 12-hour

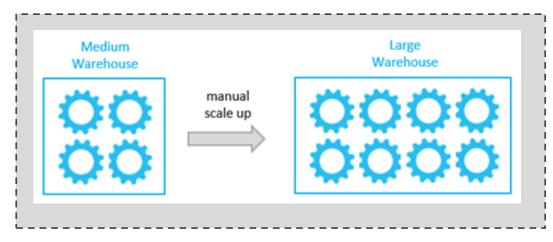
- \* SMB → large enterprise/org
- \* 1.5x credit cost
- \* higher number of users  $\rightarrow$  multi-cluster WHs (concurrency)
- \* QAS + SOS + MVs → improved query performance
- \* 90 days TT → better data protection
- \* column/row policies, obj tagging, classif >> better data gov
- \* rekey, user audit → better security

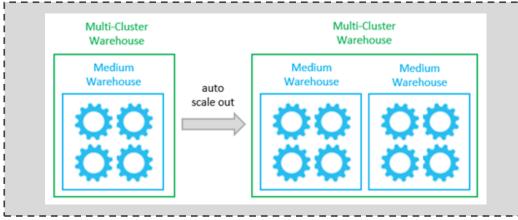
How to Avoid

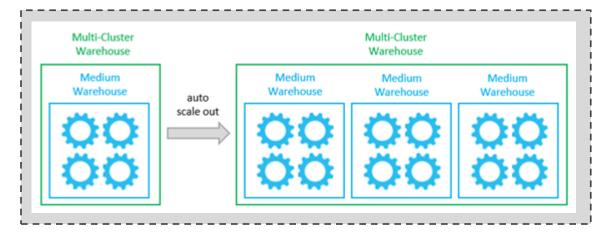
Multi-Cluster

Warehouses

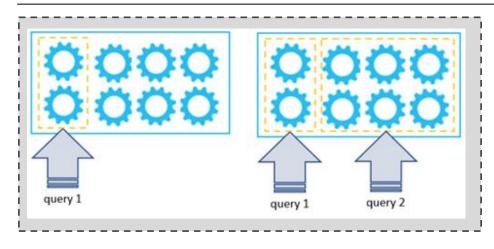
# Scalability

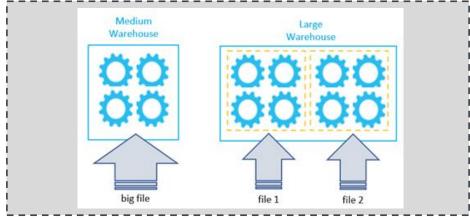


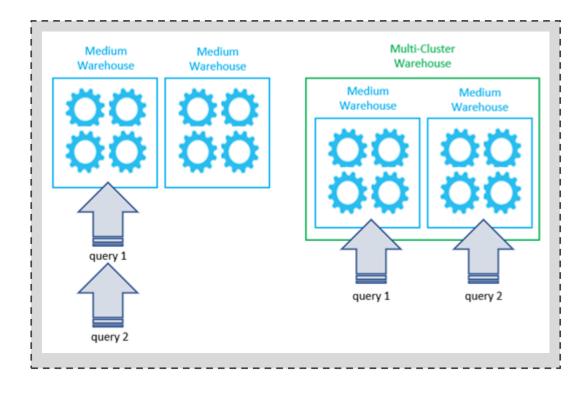




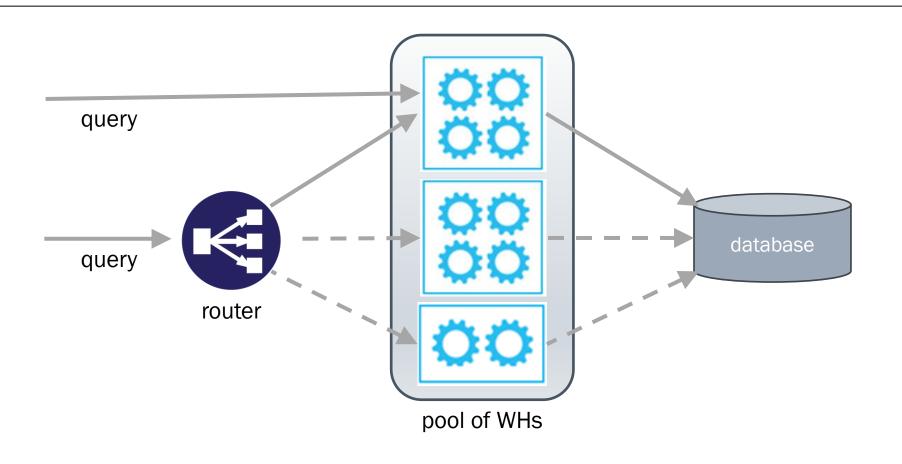
#### Concurrency







#### Custom Auto-Router



- \* multi-cluster WHs (Enterprise+ only) improve concurrent access (avoid queuing)
- \* **custom auto-router** =~ load balancer, on standard WHs
- \* auto-scale out/in to standard overflow WHs (manual scale up/down normally)
- \* could reroute if M+ queries on current WH (use MAX\_CONCURRENCY\_LEVEL)
- \* auto-route work on load spikes (to existing/dynamic WHs w/ same/different sizes)
- \* reroute to pool of WHs (10+!) after STATEMENT\_QUEUED\_TIMEOUT\_IN\_SECONDS expires
- \* could use default auto-suspend times (multi-cluster could use longer time!)

When to Use

Incremental

Materializations

#### Materialized Views

- \* Enterprise+, storage + compute costs (10 credits/h) > when refreshed
- \* act more like tables, as they store R/O data > result never outdated
- \* base table data changes > back incremental update
- \* based on one single table (self-joins not allowed)
- \* can be secured (not optimized) + can have a (different) cluster key
- \* has limited SQL syntax, no UDFs

- \* when query result doesn't change often (base table not freq updated)
- \* when results are asked often (less complex query executed here)
- \* when original query consumes lots of resources
- \* to improve performance on an external query
- \* when lots of aggregations returned
- \* when few rows constantly returned only from a very large table
- \* need a different cluster key than the base table

## How to Emulate Materialized Views

- \* use a table instead, instantly/periodically updated
- \* use a task to periodically update the table
- \* task + CHANGE\_TRACKING enabled on the source table
- \* task + STREAM ← legacy mechanism for CDC
- \* use a Snowflake *dynamic table* instead ← new!

## The Case for Extended Time Travel

#### Time Travel Use Cases

#### \* looking back in time

- SELECT ... FROM ... AT (TIMESTAMP => timestamp) ...
- SELECT ... FROM ... AT (OFFSET => rel\_time\_diff) ...
- SELECT ... FROM ... AT (STREAM => 'name') ...
- SELECT ... FROM ... AT/BEFORE (STATEMENT => query\_id) ...

#### \* in zero-copy cloning

CREATE DATABASE/SCHEMA/TABLE target CLONE source AT/BEFORE (...)

#### \* restoring dropped objects

- DROP DATABASE/SCHEMA/TABLE name
- SHOW DATABASES/SCHEMAS/TABLES HISTORY [...] ← dropped
- UNDROP DATABASE/SCHEMA/TABLE name ← restore dropped object

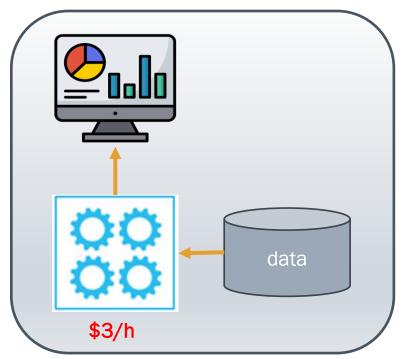
#### \* time travel

- max 90 days for permanent tables in Enterprise Edition
- max 1 day for permanent tables in Standard Edition
- max 1 day for transient/temporary tables (in any edition)
- \* for DATABASE → SCHEMA → TABLE
- \* DATA\_RETENTION\_TIME\_IN\_DAYS -> in CREATE ... / ALTER ... SET ...
  - ∘ set to 0 to disable → but cannot permanently disable in account!

## Use Standard Edition

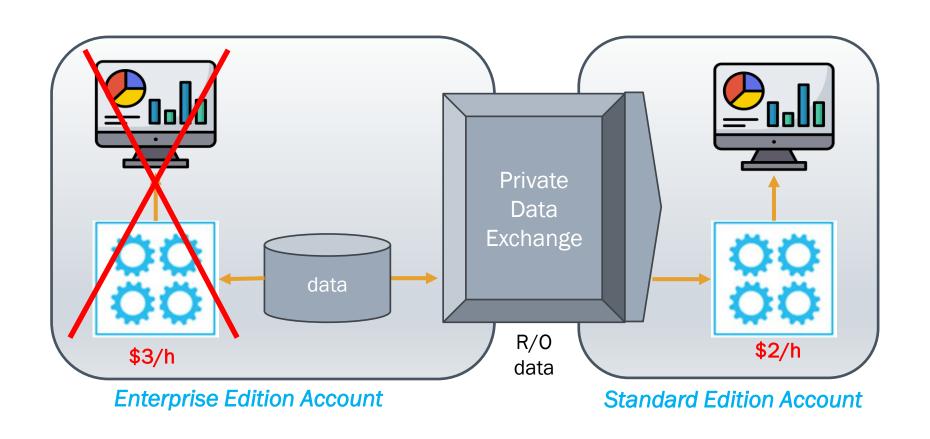
Account for Analytics

### Analytics in Enterprise Edition



**Enterprise Edition Account** 

#### Analytics in Standard Edition



- \* w/ private data share Enterprise >> Standard accounts
- \* analytics in Standard Edition consume just \$2/h credits
- \* save 30% on compute costs!
- \* limitations: multi-cluster WHs, mat views, QA, SO, clustering
- \* multi-cluster warehouses could be avoided
- \* keep data w/ mat views + clustering in Enterprise

### Use Separate Standard

Edition Account

for Common Queries

- \* any Organization must also have one Standard account
- \* for higher edition account -> create also one Standard
- \* if no special features needed  $\rightarrow$  run query on Standard
- \* credit cost: \$2 Standard, \$3 Enterprise, \$4 Business
- \* no need for a multi-cluster warehouse if you're alone

How to Reduce

Costs to Zero for

an Inactive Paid Account

- \* do not share it with other people
- \* keep one single 1-Node X-Small WH w/ auto-suspend 1 minute
- \* associate your user connection w/ this WH
- \* do not run long queries (Cancel them if they already take too long)
- \* do not have active/scheduled tasks running (better drop them all)
- \* do not leave any serverless features running

#### Checkpoints (2)

- \* drop any potential dangerous object after experiments, even if inactive (WHs, tasks)
- \* don't check too much on metadata (in screen or by SQL)
- \* remove any app installed from the Marketplace after testing
- \* create explicit transitory tables w/ no time travel
- \* change default days for time travel to 0 at the account level
- \* do not store/copy/keep/transfer large data

## When to Choose the Business Critical Edition

#### Enhanced Data Protection

- \* Failover/failback Snowflake accounts -> w/ redir conns
- \* Tri-Secret Secure w/ CMKs
- \* AWS PrivateLink support
- \* Ext Funcs through AWS API Gateway Private Endpoints

#### Support for Regulations

- \* PHI Data Support (for HIPAA and HITRUST CSF)
  - o for orgs w/ extremely sensitive data, as in healthcare
  - required signed business agreement w/ Snowflake
- \* PCI DSS Compliance (payment card industry)
- \* Support for public sector (FedRAMP and ITAR)
- \* Support for IRAP Protected (P) data (in Asia Pacific)

- \* former ESD (Enterprise for Sensitive Data)
- \* Enterprise+, 2x compute credit cost over Standard
- \* enhanced security and data protection
- \* failover/failback between Snowflake accounts
- \* for business continuity/disaster recovery
- \* support for regulations (PHI/HIPAA, PCI, US Federal)
- \* combine w/ Standard/Enterprise for reg queries → 50% cost savings!

# When to Choose the Virtual Private Snowflake (VPS) Edition

#### New Features

- \* completely separate Snowflake environment
- \* isolated from all other Snowflake accounts
- \* dedicated virtual servers (w/ in-memory encryption key)
- \* pool of compute resources (used in VWs)
- \* dedicated metadata store
- \* secure data share (w/ Marketplace/Data Exchange) disabled by def
- \* call support to enable data sharing with non-VPS customers

#### Credit Cost

\* Standard: \$2.00 - \$3.10

\* Enterprise: \$3.00 - \$4.65

\* Business Critical: \$4.00 - \$6.20

\* VPS: \$6.00 - \$9.30

- \* Business Critical+, 2x credit cost of Enterprise (\$6+ in AWS/US)
- \* completely isolated/separated account/env > highest level of security
- \* dedicated servers, metadata, pool of VW resources
- \* secure data share disabled by def, but can enable
- \* 24-hour early access to weekly new releases
- \* for orgs w/ strictest reqs: financial inst., large ent. w/ highly sensitive data

## Introduction to Query Monitoring

Tip #41: Monitor Longest Running Queries

Tip #42: Interpret Query History

Tip #43: More Charts for Query Monitoring

Tip #44: Use Query Tags

Tip #45: Reduce Frequency of Simple Queries

Tip #46: Reduce Frequency of Metadata Queries

Tip #47: Reduce Frequency of SHOW Commands

Tip #48: Clone Less Frequently

Tip #49: Change Query Schedules

Tip #50: Parallel over Sequential Transfer and Processing

# Monitor Longest Running Queries

- \* from snowflake.account\_usage.QUERY\_HISTORY view
- \* top N w/ longest individual execution\_time
- \* top N w/ longest AVG exec time, by type/WH size/user/...
- \* top N query types w/ most consumed credits
- \* top N w/ longest total execution time overall
- \* top N most frequently executed queries

# Interpret Query History

- \* Monitoring Query History ← in Snowsights (14 days)
- \* ACCOUNT\_USAGE.QUERY\_HISTORY view (1 year)
  - total\_elapsed\_time = compilation + execution + queued...
    - queued\_provisioning/repair/overload\_time
    - transaction\_blocked\_time
  - transferred bytes = ...
- \* INFORMATION\_SCHEMA.QUERY\_HISTORY[\_BY...] functions (7 days)
  - filter by session/user/warehouse
  - less info

# More Charts for Query Monitoring

- \* histogram of queries duration in seconds + log scale
- \* zoom into top-3 longest queries in detail
- \* time-histograms of aggregate queries duration in seconds
- \* day-hour histogram
- \* longest and most frequent queries with log scales

## Use Query Tags

- \* QUERY\_TAG = session-level param, 2k chars max, can use JSON

  ∘ ALTER SESSION SET QUERY\_TAG = '...' ← w/ SQL
  - session\_parameters={'QUERY\_TAG': '...'}) ← w/ Python Connector
  - session.query\_tag = '...' ← w/ Snowpark
- \* filter QUERY\_TAG column in QUERY\_HISTORY
- \* alternative: end query w/ '-- comment'
- \* not a session variable (no SET QUERY\_TAG = ...)
- \* no object tagging (no CREATE TAG ...)

## Reduce Frequency of Simple Queries

- \* ~10K calls/day → significant cloud service usage
- \* for SELECT 1 / seq1.NEXTVAL / CURRENT\_SESSION()
- \* session ID does not change while a connection is open
- \* could save CURRENT\_SESSION() value after first call
- \* JDBC SnowflakeConnection.getSessionId() uses cache!
- \* could use a dashboard chart, to monitor

### Reduce Frequency of Metadata Queries

- \* ~10K calls/day >> significant cloud service usage
- \* query INFORMATION\_SCHEMA → uses cloud services
- \* query ACCOUNT\_USAGE → uses a virtual warehouse
- \* ACCOUNT\_USAGE has more data > 1y, for account
- \* could use a dashboard chart, to monitor

### Reduce Frequency of SHOW Commands

#### SHOW for RBAC

SHOW ROLES → builtin+custom roles

SHOW GRANTS TO ROLE ... → assigned roles+privs

SHOW USERS → users

SHOW GRANTS TO USER ... → assigned roles

#### SHOW for ERDs

SHOW TABLES → tables

SHOW COLUMNS → table columns

SHOW PRIMARY KEYS -> PRIMARY KEY constraints

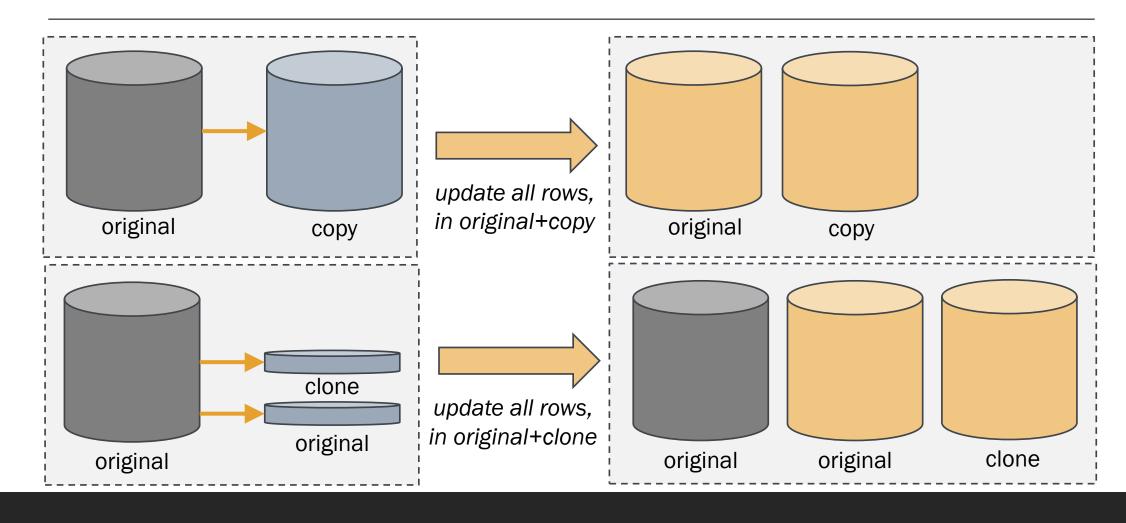
SHOW UNIQUE KEYS → UNIQUE constraints

SHOW IMPORTED KEYS -> FOREIGN KEY constraints

- \* SHOW cmds -> consume only cloud service resources
- \* avoid SHOW cmds at a high frequency
- \* check third-party tools, on top of Snowflake
- \* check partner tools
- \* could use a dashboard chart, to monitor

## Clone Less Frequently

### Changing Most Rows in Common



- \* extensive DDL (cloning) > significant cloud serv usage
- \* DDL opers (like cloning) use only cloud compute serv

- \* do not frequently create/drop large schemas/tables
- \* do not frequently clone databases for backup
- \* avoid cloning if you intend to change most rows in common
- \* updating most rows in common will increase total storage space

## Change Query Schedules

#### Cost

#### \* task

- scheduled every 2 mins, runs for max 2 secs each time
- (24h x 60 mins / 2 mins) x 2 secs = 1440 secs = 24min/day
- $\circ$  24min/day for a related WH  $\rightarrow$  0.5 credits/day = \$1.5/day

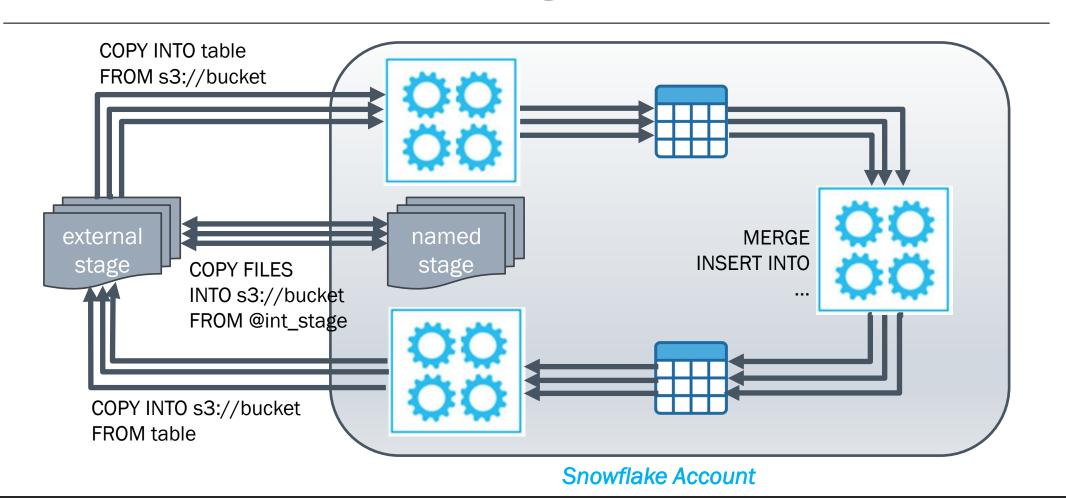
#### \* warehouse

- X-Small, 1 credit/h (\$3/credit), auto-suspended after 1 min inactivity
- resumed by the task every 2 mins = 30mins/h = 12h/day
- $\circ$  24h x 30 mins = 720min = 12h  $\rightarrow$  \$36/day

- \* frequently scheduled tasks not ok w/ managed WHs
- \* you may pay more for the WH idle, suspending (1 min)
- \* solution: try using a WH already up, w/ other queries
- \* adjust eventually the schedule, to find such a WH up
- \* avoid up-down pattern  $\rightarrow$  exec more queries together
- \* consider a serverless task (no WH, but 1.x the price)

## Parallel over Sequential Transfer and Processing

### Parallel Processing



- \* use parallel query processing -> max\_concurrency\_level at WH
- \* COPY INTO table from multiple split input files
- \* COPY INTO @stage w/ multiple split output files
- \* COPY FILES w/ multiple files, from stage to stage
- \* MERGE over individual INSERT/UPDATE/DELETE
- \* INSERT INTO multiple tables w/ parallel processing
- \* batch transformations w/ multiple SQL connections

### Introduction to Query Optimization

Tip #51: Use the Query Profile

Tip #52: Use the Explain Statement

Tip #53: Use Data Caching

Tip #54: Queries on Data Lakes

Tip #55: Use Vectorized Python UDFs

Tip #56: Use Batch Commands to Prevent Transaction Locks

Tip #57: Reduce Query Complexity and Compilation Time

Tip #58: Check for Cross Joins and Exploding Joins

Tip #59: Process Only New or Updated Data

Tip #60: Remote Spillage Optimization

## Use the Query Profile

- \* generates graph of the actual execution plan
- \* can use for running queries as well
- \* based on the generated query ID
- \* carefull w/ queries executed from cache
- \* great for TableScan and Join steps ← most costly
- \* evaluate partitions scanned/total + bytes scanned
- \* check number of rows returned by a Join  $\rightarrow$  exploding joins?

Use the

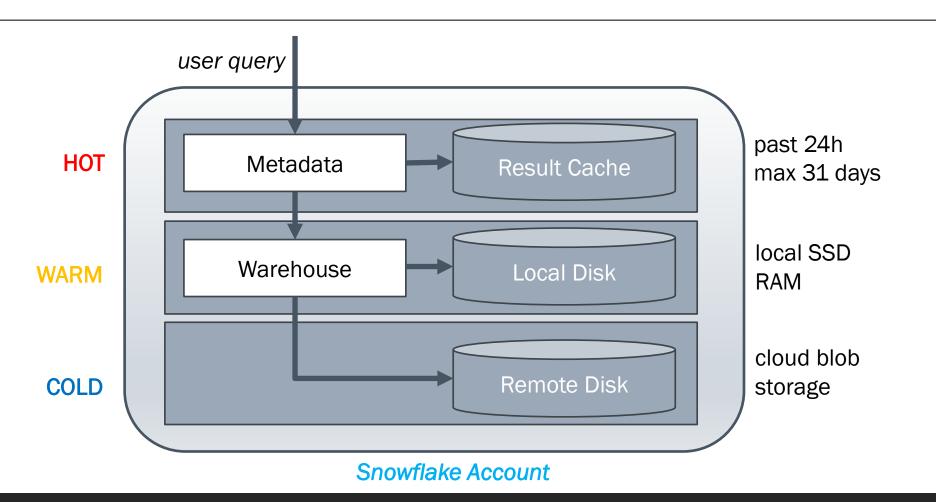
Explain

Statement

- \* get the logical execution plan without running the query
- \* estimates micro-partitions to scan and total bytes
- \* USING TEXT/JSON → hierarchy of logical steps
- \* TableScan steps could use lots of data
- \* consider columns used for Automatic Clustering
- \* see when mat views could be scanned in the back
- \* could use as query syntax check

## Use Data Caching

### Query Result Caching



#### HOT

- result cache on
- cache hit → SELECT \* FROM TABLE(RESULT\_SCAN(LAST\_QUERY\_ID()))

#### **WARM**

- result cache off or no cache hit
- warehouse up and result still in the warehouse (in RAM or local disks)
- get query result from warehouse cache (BYTES\_SCANNED > 0)

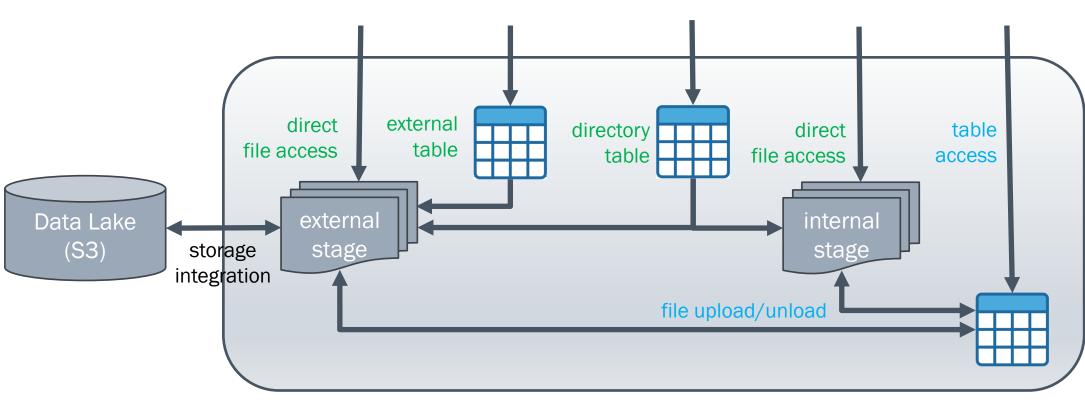
#### **COLD**

- no warehouse cache (warehouse suspended, not up)
- result cache off (ALTER SESSION SET USE\_CACHED\_RESULT = false) or no cache hit
- must run query (could also be a new query)

Queries on

Data Lakes

#### Data Warehouse vs Data Lake



**Snowflake Account** 

- \* could be better to leave files in stage and query from there
- \* data warehouse
  - file upload/unload -> between stage files and tables (partitions!)
  - table access → typical SQL on stored Snowflake data
- \* data lake
  - o direct file access → on internal/external stage files (\$1, \$2...)
    - JSON in VARIANT is more optimized!
    - Parquet vs CSV: 50x+ times faster!
  - external tables → on external stage (w/ column defs!)
  - o directory tables → for unstructured data (refs only in the database!)

## Use Vectorized Python UDFs

- \* row-by-row processing  $\rightarrow$  batches of rows (better performance!)
- \* non-vectorized UDF = scalars → UDF → scalar return
- \* vectorized UDF = scalars → pandas DataFrames → UDF → pandas arrays/Series → scalar returns

@vectorized(input=pandas.DataFrame)
optional max\_batch\_size

#### Use Batch Commands

to Prevent

Transaction Locks

- \* UPDATE/MERGE >> transaction lock on a table
  - other cmds cannot exec on table until lock released
  - queries consume cloud serv credits waiting for lock
- \* solution: use a batch cmd instead of single updates
  - use multi-row batch INSERT in temporary stage table
  - use task to periodically UPDATE/MERGE into target table

## Reduce Query Complexity and Compilation Time

#### Cost

- \* object dependencies query
  - ∘ compilation: 19 secs
  - execution: 5.6 secs
  - rows returned: 0
- \* data lineage query
  - compilation: 1.2 secs
  - execution: 4.2 secs
  - rows returned:1.4K

#### \* complex queries

- can consume significant cloud services compute resources
- will have high compilation times
- see compilation\_time vs execution\_time in QUERY\_HISTORY

#### \* examples

- queries with lots of joins
- queries with cartesian products
- queries with IN operator and large lists
- very large queries

# Check for Cross Joins and Exploding Joins

# Cross Joins vs Exploding Joins

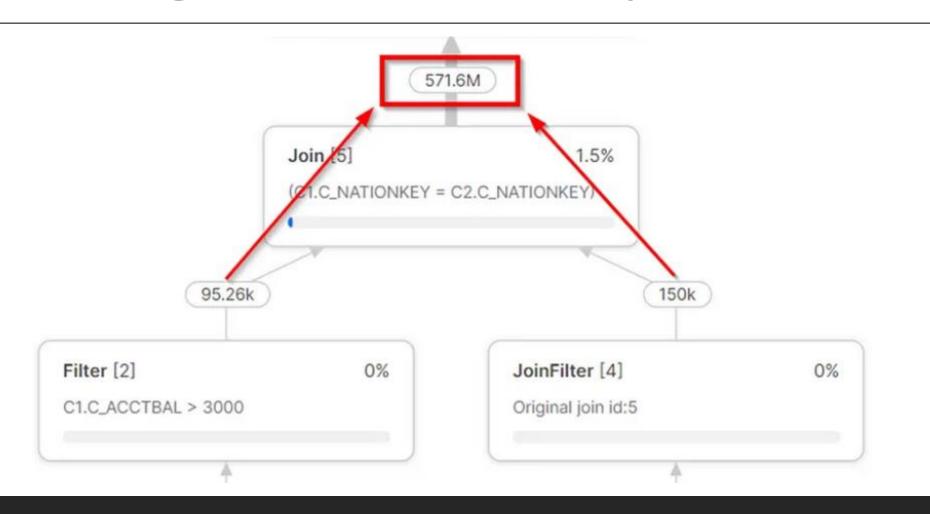
C_CUSTKEY	C_NAME	C_NATIONKEY	C_ACCTBAL
30001	Customer#000030001	4	8848.47
30002	Customer#000030002	11	5221.81
30003	Customer#000030003	21	3014.89
30004	Customer#000030004	23	3308.55
30007	Customer#000030007	5	3912.67
30010	Customer#000030010	21	8599.71
30011	Customer#000030011	1	4442.02
30012	Customer#000030012	3	9027.69
30013	Customer#000030013	4	3438.09

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30012	Customer#000030012	3	9027.69
30013	Customer#000030013	4	3438.09

# Exploding Joins in Query Profile



#### Joins

- \* one-to-one joins: 95.26K rows
- \* cross joins: 95.26K \* 150K = 9B+ rows (cancelled)
- \* exploding joins: < 95.26K \* 150K = **571.6M** rows

customer → 150K rows

customer w/ c\_acctbal > 3000 → 95.26K rows

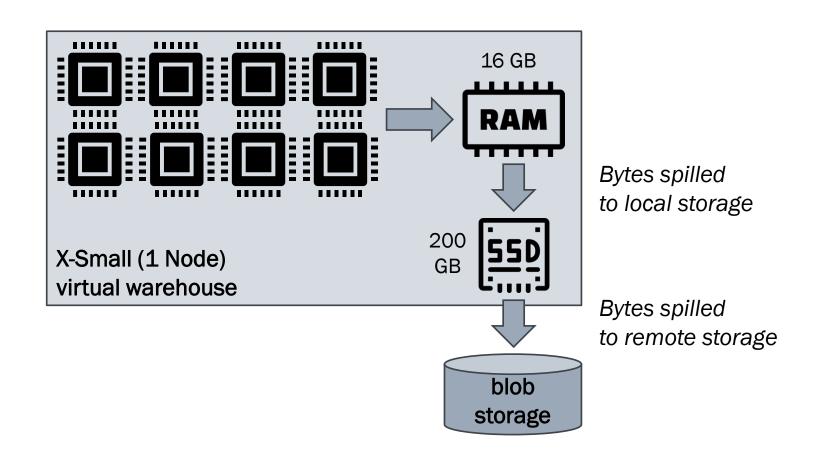
- \* exploding joins = inner join w/ huge number of matches
- \* ~cross joins/cartesian product → large number of rets
- \* returns close to  $N \times M$  rows (N, M = rows of tables)
- \* more related to many-to-many relationships
- \* detect by looking at the Query Profile

# Process Only New or Updated Data

- \* only the changed data gets processed -> reduce compute costs
- \* avoid transferring the whole batch of data, daily  $\rightarrow$  when most data did not change
- \* CDC (Change Data Capture) -> "play" transaction log for new changes only
- \* incremental processing: do not rerun entire batches of data for minor updates
- \* restart interrupted pipelines from point of interruption → no redundancies
- \* on failed data uploading -> keep successful loaded data, continue w/ failed
- \* on failed batch data transformations -> partition and replay for failed ranges only

# Remote Spillage Optimization

# Spilling to Local/Remote Storage



#### Cost

- \* Large (8 Nodes): 2 mins, 60 GB spilled to local
- \* Snowpark-optimized Large (16x memory): 1:30m, ~3 GB spilled to local

on 48.6 GB table

- \* Bytes spilled to local storage = RAM → SSD (all in WH!)
- \* Bytes spilled to remote storage = SSD → blob storage (slowest!)
- \* on SSD = intermediate results for ORDER BY, GROUP BY, PIVOT...
- \* RAM (fastest + most expensive) >> SSD (disk) >> blob storage (network)
- \* solution
  - use a bigger WH (= 2x RAM+SSD!) Snowpark-optimized (16x RAM) or QAS as alternative
  - use less data
- \* check bytes\_spilled\_to\_local/remote\_storage in QUERY\_HISTORY

# Introduction to Serverless Features

Tip #61: Monitor the Cost of Automated Jobs

Tip #62: Estimate Cost of Scheduled Tasks

Tip #63: When to Use Serverless Tasks

Tip #64: Replace Snowpipe with Snowpipe Streaming

Tip #65: Estimate Cost of Automatic Clustering on Tables

Tip #66: Estimate Cost of the Query Acceleration Service (QAS)

Tip #67: Estimate Cost of the Search Optimization Service (SOS)

Tip #68: Reduce Materialized Views Maintenance Cost

Tip #69: Reduce Database Replication Cost

Tip #70: Estimate Cost of Hybrid Tables

# Monitor the Cost of Automated Jobs

# Cost

Feature	Snowflake Credits per Compute-Hour		
reature	Snowflake-managed compute	Cloud Services	
Clustered tables	2	1	
Copy Files <sup>10</sup>	2	N/A	
Hybrid Tables requests <sup>10</sup>	1	1 In addition: 1 Credit per 30GB read 1 Credit per 7.5GB write	
Logging	1.25	1	
Materialized views maintenance	10	5	
Materialized views maintenance in secondary databases	2	1	
Query acceleration	1	1	
Replication	2	1	
Search optimization service	10	5	
Search optimization service in secondary databases	2	1	
Serverless tasks	1.2	1	
Snowpipe	1.25	N/A but charged 0.06 Snowflake Credits/1000 Files	
Snowpipe Streaming	1	N/A but charged at an hourly rate of 0.01 Snowflake Credits per client instance	

#### METERING\_HISTORY View

- \* start\_time .. end\_time = hourly credit usage, for 1y
- \* service\_type + name
- \* credits\_used\_compute = WH + serverless
- \* credits\_used\_cloud\_services = ~1 credit/h (10 for MVs/S0)
- \* credits\_used = credits\_used\_compute + credits\_used\_cloud\_services
- \* bytes + rows + files for auto-clustering / pipe / snowpipe\_streaming

# Service Types

- \* WAREHOUSE\_METERING[\_READER] any edition, w/ WH name [+for Reader accounts]
- \* SERVERLESS\_TASK not user-managed, ~1.5x more expensive (1.2x now)
- \* AUTO\_CLUSTERING any edition, auto-background maintenance of clustered table/MV (+initial clustering+reclustering), ~2 credits/h
- \* MATERIALIZED\_VIEW 10 credits/h [2 in sec dbs] + 5 for cloud  $\rightarrow$  storage+compute (per second). when base table changes  $\rightarrow$  MVs updated by serverless back service
- \* QUERY\_ACCELERATION scale factor to limit cost → N nodes x boost
- \* SEARCH\_OPTIMIZATION 10 credits/h [2 in sec dbs] + 5 for cloud → storage+compute maintenance (higher cost when large table data changes + deletes + auto-clustering)

# Service Types (cont.)

- \* PIPE + SNOWPIPE\_STREAMING Snowpipe ~1.25 credits/h + 0.06 credits/1000 files. Streaming w/ 2 table+service entries, 1 credit/h + 0.01 credits/h/client.
- \* HYBRID\_TABLE\_REQUESTS 1 credit/h per req + 1 cloud credit per 30GB R/7.5GB W
- \* COPY\_FILES for COPY INTO between stages, 2 credits/h (no cloud)
- \* REPLICATION for dbs/shares (any edition) / failover across accounts (BC) 2 credits/h
- \* SNOWPARK\_CONTAINERS SPCS, all editions  $\rightarrow$  costs for storage (image repository+logs+mounting volumes) + compute pool (1+ VM nodes) + data transfer (outbound + cross-AZ)
- \* Al\_SERVICES compute cost for Cortex LLM functions → per number of tokens (~4 chars) processed by the calls

- \* automated jobs > ~70% of all compute cost
- \* credits per compute-hour
- \* credits used = Snowflake-managed compute + cloud services
- \* cloud services: for AuthN / infra/metadata management / query parsing+optimization / access control...
- \* METERING\_HISTORY view

Estimate Cost of
Scheduled Tasks

#### Cost

- \* managed task: 1 sec (exec time) x 60 x 24 = <30 min  $\rightarrow$  <\$1.50/day (estimated)
- \* warehouse: 1 min (up every time) x 60 x 24 = 24 h  $\rightarrow$  \$3 x 24h = \$72/day

user-managed task w/ 1 sec total exec time + executed every minute

X-Small dedicated WH w/ 1 min auto-suspend, at \$3/h/node credit (in AWS/US)

- \* user-managed (w/ WH) vs serverless tasks (no WH)
  - USER\_TASK\_MANAGED\_INITIAL\_WAREHOUSE\_SIZE → def MEDIUM!
- \* WHEN sql\_condition → just cloud service credits!
  - task not triggered at all if WHEN not satisfied
- \* SCHEDULE -> not for child tasks, w/ manual EXECUTE TASK if none
- \* USER\_TASK\_TIMEOUT\_MS → def 1h (max 1 day)
  - STATEMENT\_TIMEOUT\_IN\_SECONDS → sometimes w/ higher priority, in WH
- \* information\_schema.**TASK\_HISTORY**()
- \* check orphan tasks running but not being used

# When to Use Serverless Tasks

#### Cost

- \* serverless task: 1 sec (exec time) x 60 x 24 = <30 min  $\rightarrow$  <\$1.80/day
- \* managed task: 1 sec (exec time) x 60 x 24 = <30 min  $\rightarrow$  <\$1.50/day (estimated)
- \* warehouse: 1 min (up every time) x 60 x 24 = 24 h  $\rightarrow$  \$3 x 24h = \$72/day

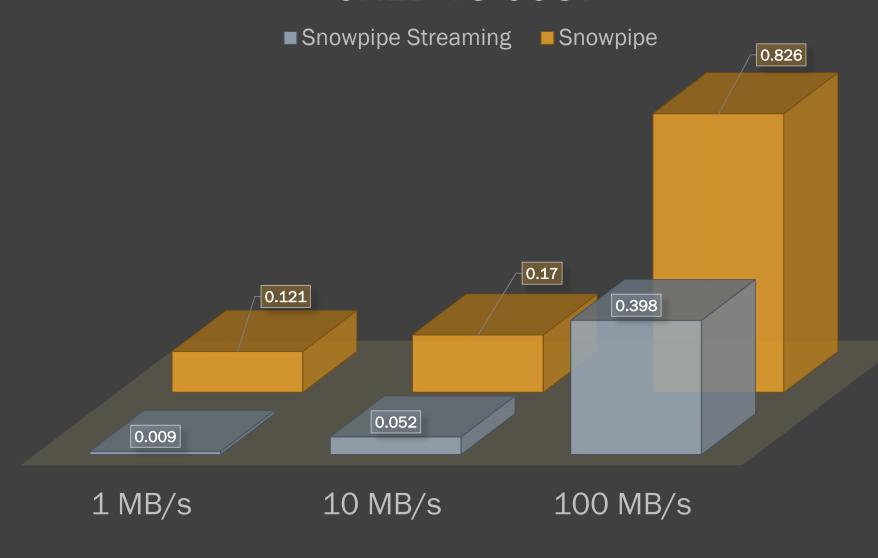
serverless task w/ 1 sec total exec time + executed every minute → \$3.6/h/node user-managed task w/ 1 sec total exec time + executed every minute

X-Small dedicated WH w/ 1 min auto-suspend, at \$3/h/node credit (in AWS/US)

- \* favor serverless tasks for frequently executed + short-running operations
- \* try grouping more user-managed tasks on the same WH -> WH consolidation
- \* user-managed (w/ WH) vs serverless tasks (no WH, 1.2x more expensive)
  - USER\_TASK\_MANAGED\_INITIAL\_WAREHOUSE\_SIZE → def MEDIUM!
- \* information\_schema table functions
  - SERVERLESS\_TASK\_HISTORY() → for serverless tasks
  - TASK\_HISTORY() → for user-managed tasks
  - WAREHOUSE\_METERING\_HISTORY() → for warehouses

# Replace Snowpipe with Snowpipe Streaming

#### **CREDITS COST**



#### \* Snowpipe + Snowpipe REST API

old legacy service + API for streaming in small batches

#### \* Snowpipe Streaming API

- more cost-effective data ingestion + save on storage costs
- high-throughput + low-latency streaming + low cost
- automated service (no VW)
- uses managed-compute resources + fixed credit charge per file

# Estimate Cost of Automatic Clustering on Tables

- \* Automatic Clustering = serverless, in any edition
- \* no clustering keys -> no Automatic Clustering costs
- \* Clustered Tables serverless price = 2 credits/hour
- \* AUTOMATIC\_CLUSTERING\_HISTORY view/function
- \* AUTOMATIC\_CLUSTERING Snowflake WH
- \* avoid table fragmentation -> check load+query patterns

# Estimate Cost of the Query Acceleration Service (QAS)

#### Cost

w/o QAS: 8min x 5c/min = 40c

w/QAS: 40sec x 5c/min x 14 nodes =< 47c

X-Small WH (1 node) = \$3/h = 5c/min

QAS 14x scale factor =~ \$3/h/node = 5c/min/node

# Programming QAS

- \* ENABLE\_QUERY\_ACCELERATION in WH, to enable
- \* QUERY\_ACCELERATION\_MAX\_SCALE\_FACTOR ctrls boost
- \* SYSTEM\$ESTIMATE\_QUERY\_ACCELERATION w/ qID
- \* QUERY\_ACCELERATION\_ELIGIBLE system view
- \* QUERY\_HISTORY system view, w/ data
- \* QUERY\_ACCELERATION\_HISTORY in info schema, for cost

- \* Query Acceleration Service (QAS) = serverless, on WH
- \* can accelerate parts of a WH query workload
- \* parts of query processing -> shared compute resources
- \* billed per second, no minimum
- \* no cost if enabled + no eligible queries
- \* in some cases could cost less than scalling up the WH

# Estimate Cost of the Search Optimization Service (SOS)

### Search Optimization Service

- \* for some lookup/analytical queries/views
- \* for queries w/ filters/joins, running for seconds+
- \* not on the primary cluster key
- \* at least one column must have 100K+ distinct values
- \* for numbers, date, string, variant, geography, binary etc (not float, geometry)
- \* filtering predicates: EQUALITY, SUBSTRING, GEO → keep a search access path
- \* for IN, reg exp, substrings, JSON searches, geospatial queries, and/or
- \* not for external/dynamic tables, MVs, casts...

- \* Enterprise+, 10 credits/h + 5 credits/h cloud (2+1 in sec. dbs)
- \* avoid in high churn tables
- \* avoid when data changes a lot in the table
- \* enable only on specific columns, w/ the right predicate
- \* disable once you no longer have benefiting queries
- \* check actual query improvements
- \* pair the service with smaller warehouses to lower the cost

### Reduce

Materialized Views

Maintenance Cost

- \* MV cost = 10 credits/h + 5 credits/h cloud (2+1 in sec. dbs)
- \* there are no tools to estimate costs of maintaining MVs (serverless)
- \* what may trigger MV maintenance
  - any change of micro-partitions in the base table
  - any changes w/ DML statements on the base table
  - reclustering of the base table
- \* cost proportional to: number of MVs + clustered MVs
- \* suspend/resume MVs  $\rightarrow$  only defers costs, not reducing them
- \* best practice: start by creating only a few MVs + monitor the costs over time

# Reduce Database Replication Cost

#### Replication in Snowflake

- \* Database Replication = ~db backup, for all editions
  - w/ replication groups, across multiple accounts
- \* Share Replication = for all editions
- \* Account Replication = Business Critical only, same org
  - ∘ w/ failover/failback ← w/ failover groups
- \* Cross-Cloud Auto-Fulfillment = shared listing > other regions

- \* db replication compute costs = 2 credits/h managed + 1 credit/h cloud
- \* standard costs in both source+target accounts!
- \* initial+refresh replication → lower refresh frequency
- \* avoid transfer between regions → data transfer costs
- \* avoid very large databases, or w/ lots of data changes
- \* refresh granular objects -> use a replication group
- \* DATABASE\_REPLICATION\_USAGE\_HISTORY view → CREDITS\_USED

### Estimate Cost of Hybrid Tables

#### Hybrid Tables

- \* Snowflake Unistore = OLTP (transactional) + OLAP (analytical)
- \* fast writes as well >> stores data also by row
- \* required primary keys
- \* optional foreign keys -> referential integrity enforced
- \* allows indexes
- \* row locking

- \* Standard+, PuPr in some AWS paid accounts (currently)
- \* consumption modes
  - **compute** = for WHs, same credits as for standard tables
  - storage = fix monthly rate per GB, more expensive
  - requests = for serverless resources on the row storage clusters
- \* cost per request
  - 1 credit/h managed + 1 credit/h cloud
  - 1 credit per 30 GB read + 1 credit per 7.5 GB write

### Introduction to Data Storage

Tip #71: Use On-Demand When You Don't Know Your Spending Pattern

Tip #72: Copy and Keep Less Data

Tip #73: Lower Data Retention with No Time Travel

Tip #74: Estimate Storage Cost of the Fail-Safe

Tip #75: Use Transient or Temporary Tables

Tip #76: Use Zero-Copy Cloning

Tip #77: Clone Less Data

Tip #78: Ensure Tables Are Clustered Correctly

Tip #79: Drop Unused Tables and Other Objects

Tip #80: Remove Old Files from Stage Areas

Use On-Demand Storage

When You Don't Know

Your Spending Pattern

#### Data Storage Costs

### OPTIMIZED STORAGE

Snowflake charges a monthly fee for data stored in the platform.

Calculated using the average amount of storage used per month, after compression, for data ingested into Snowflake.

Download Snowflake Pricing Guide



#### On-Demand Storage

Pay for usage month-tomonth.

\$23/per TB / per month (\$USD)

AWS, US West (Oregon)



#### **Capacity Storage**

Discounted storage paid upfront.

\$23/per TB / per month (\$USD)

AWS, US West (Oregon)

#### Capacity Storage Pricing

	Table 3	(a):	Standard	Storage	Pricing
--	---------	------	----------	---------	---------

		On Demand Storage Pricing (TB/mo)	Capacity Storage Pricing by ACV Range (TB/mo)						
	Region		Tier 1	Tier 2	Tier 3	Tier 4	Tier 5	Tier 6	Tier 7
Cloud Provider			USD \$0 - \$1,199,999	USD \$1,200,000 - \$2,999,999	USD \$3,000,000 - \$4,999,999	USD \$5,000,000 - \$9,999,999	USD \$10,000,000 - \$19,999,999	USD \$20,000,000 - \$39,999,999	USD \$40,000,000+
AWS	US East (Northern Virginia)	\$23.00	\$23.00	\$21.47	\$19.94	\$18.40	\$16.86	\$15.34	\$13.80
AWS	US West (Oregon)	\$23.00	\$23.00	\$21.47	\$19.94	\$18.40	\$16.86	\$15.34	\$13.80

- \* On-Demand (PAYG) vs Capacity (prepaid) Storage Pricing
  - US \$23/TB/mo → lowest for AWS/Azure US (\$20 for GCP Central US)
  - ∘ storage billing → average stored per day
- \* Capacity Storage > less only for \$2M+ accounts
  - storage price → per TB/mo (from highest for On-Demand)
  - o long-term contract for small discounts → could overspend
  - auto-switched to On-Demand if underspent
  - use eventually once you know your spending patterns

### Copy and Keep Less Data

#### Cost

- \* table data storage: 2B rows (65GB)
- \* Time Travel: 1 day (def)
- \* Fail-safe: 7 days (fixed)
- \* one clone: 2B rows (shared)

copied from tpcds\_sf100tcl.store\_sales (288B rows, 10TB) in 11 mins

#### TABLE\_STORAGE\_METRICS

\* in INFORMATION\_SCHEMA → w/ 1-2h latency

- \* Active bytes = live data that can be queried
- \* Bytes in Time Travel = deleted, but still kept for the retention period
- \* Bytes in Fail-safe = deleted, past the Time Travel, but still kept for 7 days
- \* Bytes retained for clones = deleted, but still kept as clone refs

#### Retention Policies

- \* do not use Snowflake as an archiving system
  - backup/store raw data cheap in Amazon S3 Glacier
- \* ex: retention policy:  $5 \rightarrow 3$  years
  - less bytes scanned in queries
  - 36% storage cost saving

- \* copy less, clone more  $\rightarrow$  for dev/test/prod envs
- \* use transient/temporary tables for no Fail-safe
- \* disable Time Travel
- \* cloned tables will transparently keep shared table data
- \* create huge table + delete right away → still expensive!
- \* limit period of retention policy

### Lower Data Retention with No Time Travel

- \* permanent table
  - 0..1 days (def 1) Time Travel for Standard Edition
  - 0..90 days (def 1) Time Travel for Enterprise Edition
- \* temporary/transient table
  - 0..1 days (def 1) Time Travel

Time Travel may remain there after you drop a table set <a href="DATA\_RETENTION\_TIME\_IN\_DAYS">DATA\_RETENTION\_TIME\_IN\_DAYS</a> = 0 to disable

# Estimate Storage Cost of the Fail-Safe

#### Fail-Safe for Large Dropped Table



#### Cost

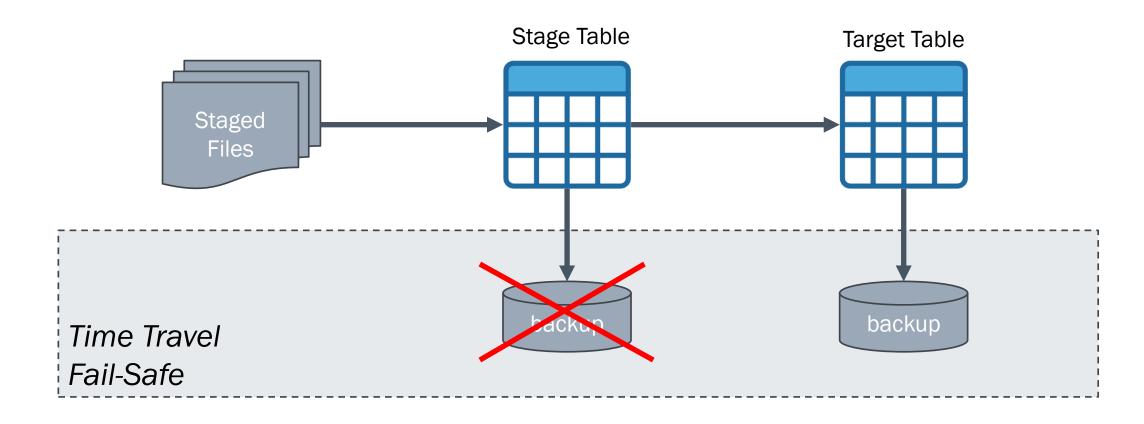
- \* 1TB table dropped after 1 day  $\rightarrow$  \$23 / 30 days ~= 77c
- \* Fail safe for dropped table  $\rightarrow$  \$23 x 7/30 days = \$5.37

cost On-Demand storage: US \$23/TB/mo

- \* permanent table : 7 days Fail-safe
- \* temporary/transient table: no Fail safe
- \* drop a large table -> all its data moves into Fail safe!

# Use Transient or Temporary Tables

#### ELT Data Pipeline



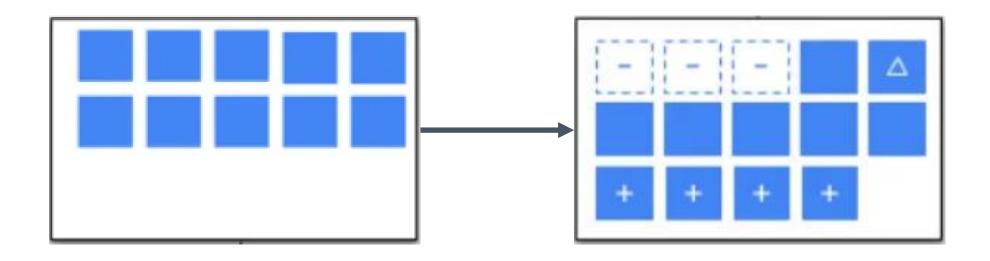
- \* temporary table = auto-deleted at the end of session
- \* transient table = shared, req explicit drop
- \* max time travel 1 day (def 1) -> save on storage
- \* no fail safe (else 7 days) -> save on storage
- \* for transitory data (no need for backup)

Use

Zero-Copy

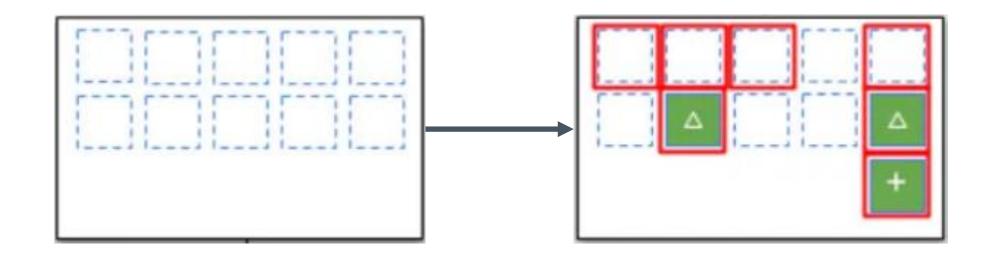
Cloning

#### Table Copy



Storage Cost for Copied Table = Original Data + New Data - Deleted Data

#### Table Clone



Storage Cost for Cloned Table = Changed Data + New Data

- \* copied table cost = orig data + INSERTs DELETEs
- \* cloned table cost = UPDATEs + INSERTs

- \* clones will save on storage (keep data references)
- \* clones will save on compute (to duplicate data)
- \* clones will avoid redundancies → less error prone

### Clone Less Data

- \* extensive DDL (cloning) -> significant cloud serv usage
- \* DDL opers (like cloning) use only cloud compute serv

- \* clone more granular objects
- \* clone only individual tables rather than entire schemas

### Ensure Tables Are Clustered Correctly

#### CLUSTERING\_INFORMATION

- \* cluster\_by\_keys, total\_partition\_count just info
- \* total\_constant\_partition\_count higher is better (reclustered)
- \* average\_overlaps lower is better (<1), higher not well-clustered
- \* average\_depth lower is better (CLUSTERING\_DEPTH)
- \* partition\_depth\_histogram
  - · 0, 1, 2, 3, ..., 16, 32, 64, 128, ...
  - most w/ depth 1 or on top is best
  - worst if most at the bottom
- \* clustering\_errors max 10 recent reclustering errors [...]

- \* load data > natural auto-clustering
- \* evaluate for natural auto-clustering (no key -> no cost!)
- \* evaluate for a clustering key (auto-clustering cost!)
- \* identify + evaluate for candidate columns
- \* load data according to current/new clustering key
- \* use queries that benefit from current table clustering

## Drop Unused Tables and Other Objects

### Storage Usage History

- \* DATABASE\_STORAGE\_USAGE\_HISTORY
  - average\_database\_bytes
  - average\_failsafe\_bytes
  - average\_hybrid\_table\_storage\_bytes
- \* STAGE\_STORAGE\_USAGE\_HISTORY
  - average\_stage\_bytes

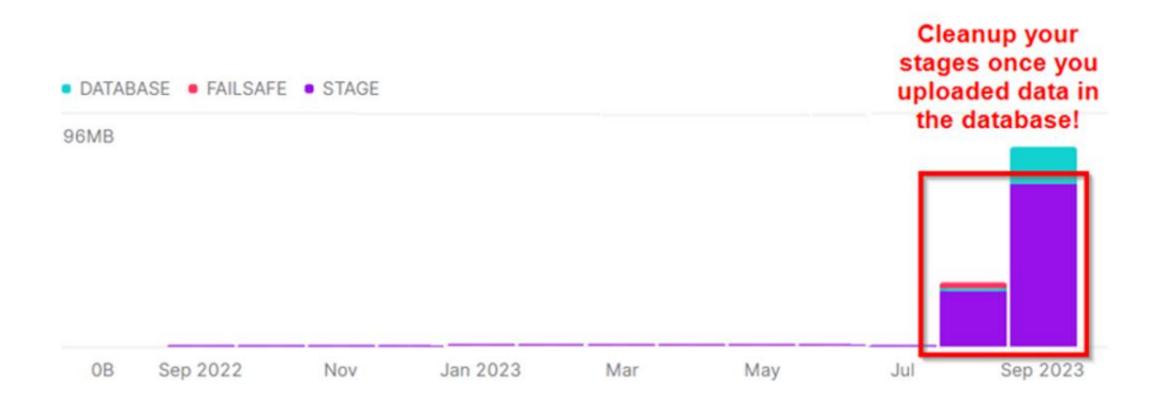
### Table Storage Metrics

- \* active\_bytes
- \* time\_travel\_bytes
- \* failsafe\_bytes
- \* retained\_for\_clone\_bytes

- \* storage
  - db active + time travel + fail-safe + retained for clones + hybrid tables + stages
- \* drop any unused objects > recreate them from scripts!
- \* unused tables = not modified/changed/accessed lately
- \* TABLES view
  - last\_altered → by DDL/DML operation
- \* ACCOUNT\_HISTORY view
  - base\_objects\_accessed → JSON array, must flatten!
  - query\_start\_time → last accessed time

# Remove Old Files from Stage Areas

## Storage Wasted by Old Stage Files



- \* delete files no longer required from stages
- \* external+internal stages (named/table/user)
- \* ACCOUNT\_USAGE.STORAGE\_USAGE.stage\_bytes

SHOW STAGES IN ACCOUNT → all stage names

LIST @mystage → all files

REMOVE @mystage / @%mytable / @~

# Introduction to Data Transfer

Tip #81: Data In is Free, Data Out is Expensive

Tip #82: Choose the Same Provider and Region Where Your Data Is

Tip #83: External Access Integrations vs External Functions

Tip #84: Use Data Compression

Tip #85: Use Batch Transfer with Path Partitioning

Tip #86: Use Bulk Loads instead of Single-Row Inserts

Tip #87: Use Parallel Data Uploading

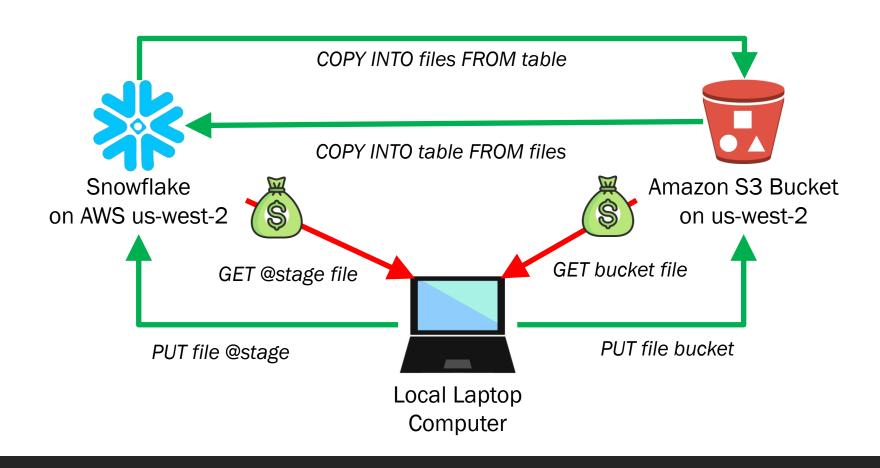
Tip #88: Design Cost-Effective Data Pipelines

Tip #89: Use External Tables in a Data Lake

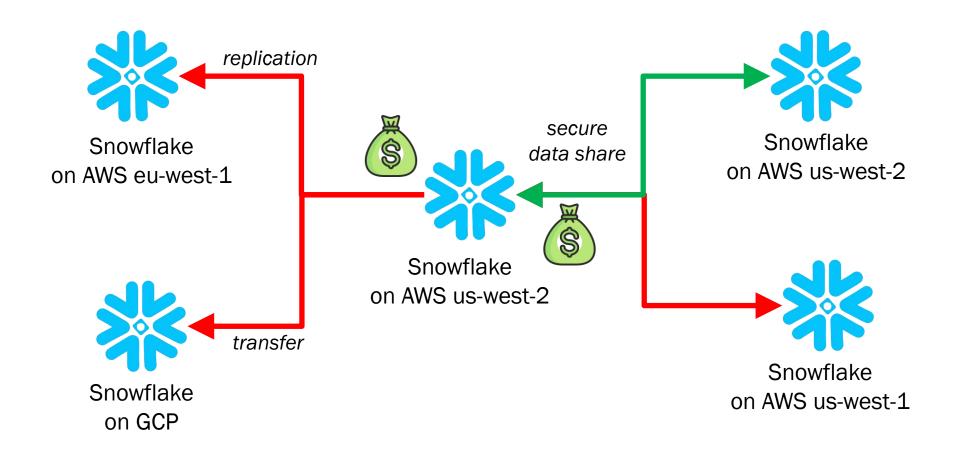
Tip #90: Query Parquet Files instead of CSV

# Data In is Free, Data Out is Expensive

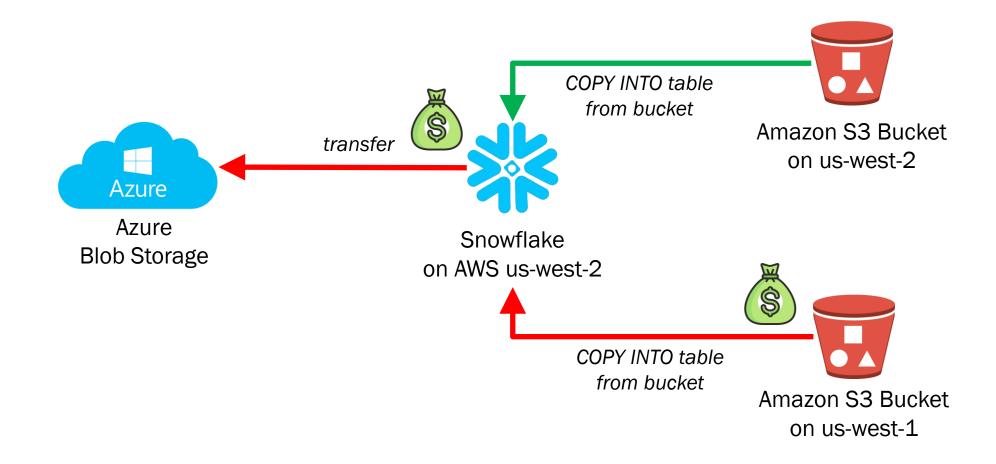
#### Local Data Transfer Costs



#### Snowflake-to-Snowflake Costs



#### Internet Data Transfer Costs



#### DATA\_TRANSFER\_HISTORY

	TFX	··· TRANSFER_TYPE	BYTES_TRANSFERRED
1	aws (us-west-2) → (aws) us-west-2	EXTERNAL_FUNCTION	2808091
2	aws (us-west-2) → (aws) us-east-2	EXTERNAL_FUNCTION	27797
3	aws (us-west-2) → (internet) internet	EXTERNAL_ACCESS	98058
4	aws (us-west-2) → (aws) us-west-2	COPY	101584

- \* Snowflake (us-west-1) -> S3 bucket (us-west-2) \$ to Snowflake
- \* Snowflake (us-west-1) ← S3 bucket (us-west-2) \$ to AWS
- \* Snowflake → local \$ to Snowflake
- \* AWS → local \$ to AWS

Choose the Same

Provider and Region

Where Your Data Is

#### Data Transfer Pricing

- \* AWS: diff region \$20+ / diff prov \$90+
- \* Azure: same cont \$20+ / diff cont \$50+ / diff prov \$87.50+
- \* GCP: same cont \$10+ / diff cont \$80+ / diff prov \$120+

pricing is per TB of data transferred within the same region+provider is FREE

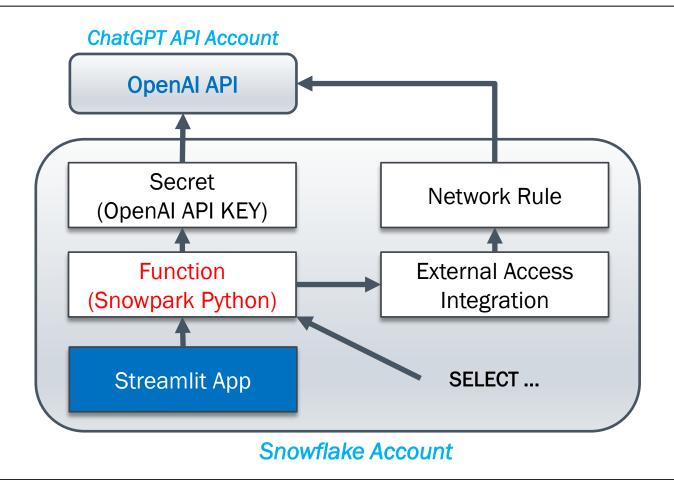
- \* no cost to tfx data in (upload)
- \* no cost to tfx data out within the same region+provider
- \* moderate cost to tfx to another region, same provider
- \* moderate cost to tfx within the same continent+provider
- \* higher cost to tfx to another continent, same provider
- \* highest cost to tfx to another provider

External Access

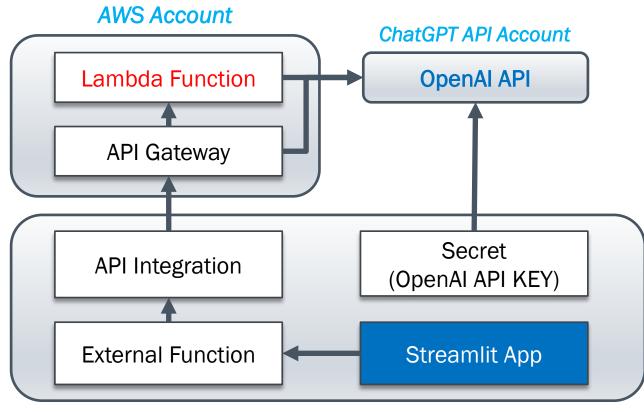
Integrations

vs External Functions

### External Access Integration



#### **External Function**



**Snowflake Account** 

#### \* External Access Integration

- business logic mostly within Snowflake, in the WH
- use when you do not transfer a lot of data w/ the remote API
- easier to implement and deploy

#### \* External Function

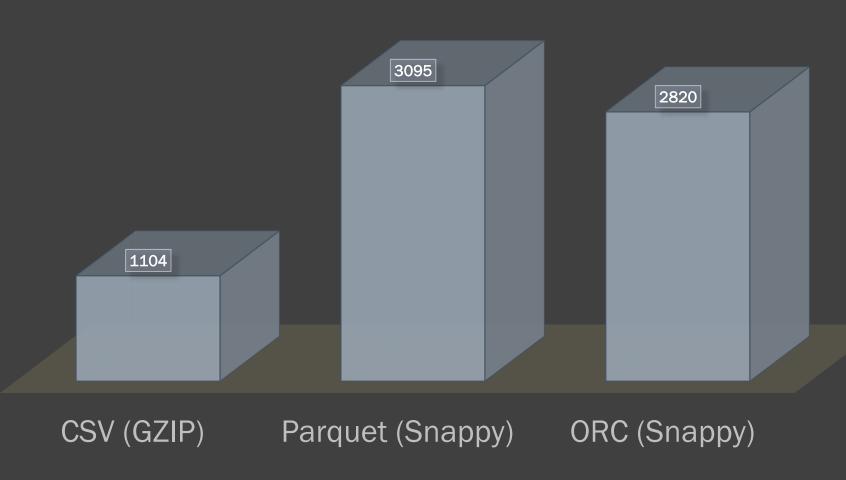
- business logic mostly remote, in another cloud service
- use when you may transfer a lot of data w/ the remote API
- more complex to implement and deploy

#### Use

# Data Compression

#### LOADING STRUCTURED DATA

■ load time (seconds)



#### \* Snowflake storage

- ∘ min 3:1 compression ratio → billed only compressed storage!
- ∘ 4.7 TB uncompressed (28.8B rows) → stored as 1.3 TB

#### \* loading compressed data

- less data transfer cost + less time (cheaper COPY INTO)
- from CSV (GZIP) >> faster than Parquet/ORC (Snappy)
- keep data files 100-250 MB in size compressed
- COMPRESSION = GZIP/BZ2/BROTLI/ZSTD/DEFLATE/RAW\_DEFLATE

# Use Batch Transfer with Path Partitioning

- \* partition staged data files w/ logical granular paths
- \* COPY INTO must list S3 folder files → improve performance!
- \* ex: s3://bucket/app2/loc1/2016/07/01/14/
- \* copy any fraction of data w/ a single command
- \* could copy data by hour/day/month etc
- \* create subfolders of 10-15 mins increments per hour

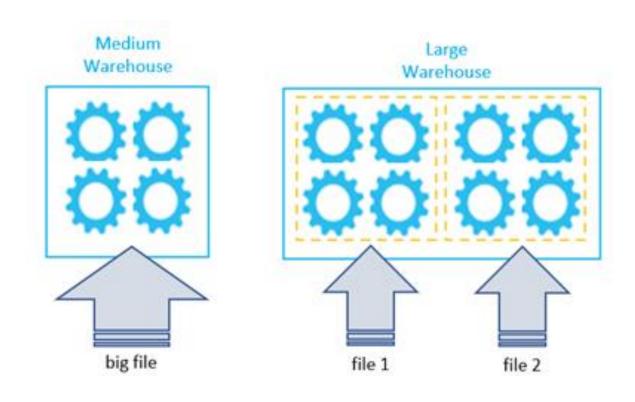
Use Bulk Loads instead of

Single-Row Inserts

- \* COPY INTO (batch/bulk) vs INSERT (single row)
- \* OLTP vs OLAP
- \* batch/bulk copy consumes less cloud res + faster
- \* batch/bulk loads can be done in parallel
- \* not for hybrid tables (Snowflake Unistore)

# Use Parallel Data Uploading

## Parallel Data Uploading



- \* small WH + one file  $\rightarrow$  ok in most cases
- \* big WH + one file -> may take longer if large file
- \* big WH + single file -> could waste idle nodes
- \* big WH + parallel loading → faster for ~100 files

COPY INTO mytable FROM @stage/folder/ FILES=('file1.csv', ...)

# Design Cost-Effective Data Pipelines

- \* check that data-loading processes don't run more often than consuming data pipelines
- \* reduce sync frequency of your data ingestion tool + evaluate how often to update data
- \* upload data to S3 + use as external stage for data loading to Snowflake
- \* check related costs when running all type of workloads in Snowflake
- \* it could be more cost-effective to transform S3 data w/ AWS Glue, then load it in Snowflake
- \* incremental processing: do not rerun entire batches of data for minor updates
- \* restart interrupted pipelines from the point of interruption, w/ no redundant computation

#### Use

External Tables

in a Data Lake

- \* to query in-place data lake files, from ext stages, R/O
- \* slower than Snowflake tables -> use mat view
- \* metadata\$filename + metadata\$file\_row\_number
- \* value -> single VARIANT column, use for column defs (or INFER\_SCHEMA)
- \* partitioning always recommended > PARTITION BY col1, ...
- \* manual/auto-refresh metadata  $\rightarrow$  w/ event notifs, may incur cost
- \* PIPE\_USAGE\_HISTORY → estimate charge

# Query Parquet Files instead of CSV

#### Parquet vs CSV

- \* 80%+ less data stored
- \* 30%+ faster queries
- \* 99% less data scanned
- \* 99%+ cost savings

Dataset	Size on Amazon S3	Query Run Time	Data Scanned	Cost
Data stored as CSV files	1TB	236 seconds	1.15 TB	\$5.75
Data stored in Apache Parquet Format	130 GB	6.78 seconds	2.51 GB	\$0.01
Savings	87% less when using Parquet	34x faster	99% less data scanned	99.7% savings

- \* transform CSV to Parquet when left in the data lake
- \* less storage because of binary format + compression
- \* less data scanned because of less storage + columnar
- \* faster queries because of the columnar format
- \* huge compute + storage cost savings

### Introduction to Snowflake Apps

Tip #91: Estimate Cost Impact of Data Sharing in Snowflake

Tip #92: Estimate Cost Impact of Client and Server (Snowpark) Apps

Tip #93: Estimate Cost Impact of Streamlit in Snowflake and Native Apps

Tip #94: Estimate Cost Impact of Data Science Applications

Tip #95: Check All Connected Applications

Tip #96: Third-Party Apps Saving Money Will Spend Money

Tip #97: Free Marketplace Native Apps Will Cost Money

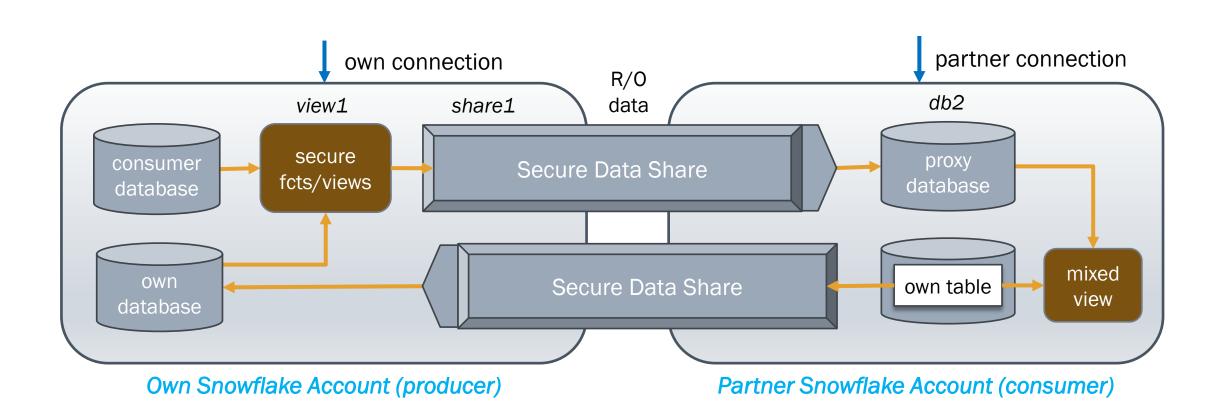
Tip #98: Keep App Versions Updated

Tip #99: Cache Data in Third-Party Tools

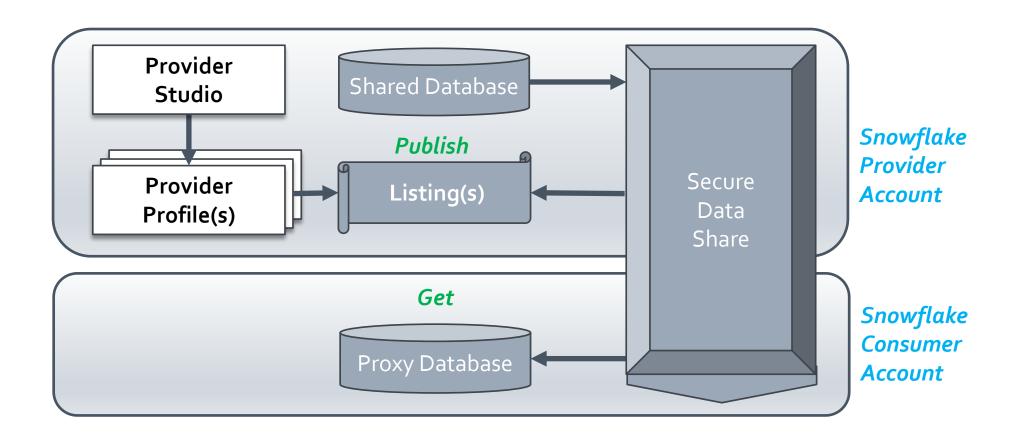
Tip #100: Auto-Abort Running Queries from Disconnected Apps

# Estimate Cost Impact of Data Sharing in Snowflake

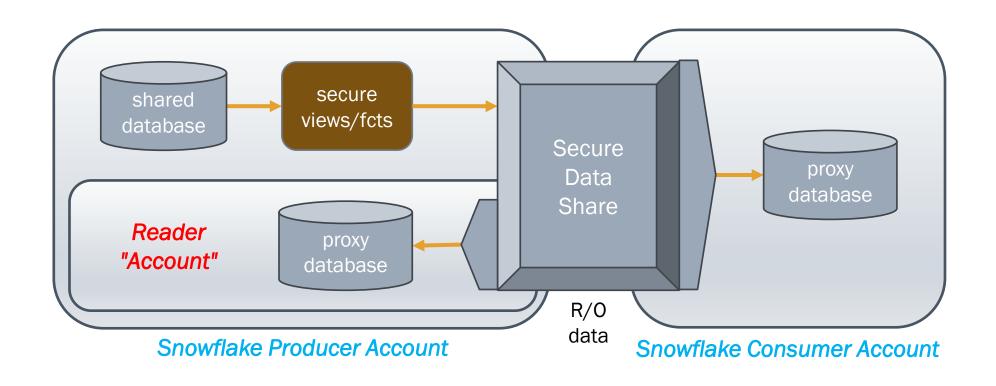
#### Inbound/Outbound Data Shares



#### Private Data Exchange



#### Data Share w/ Reader Account



#### \* data shares

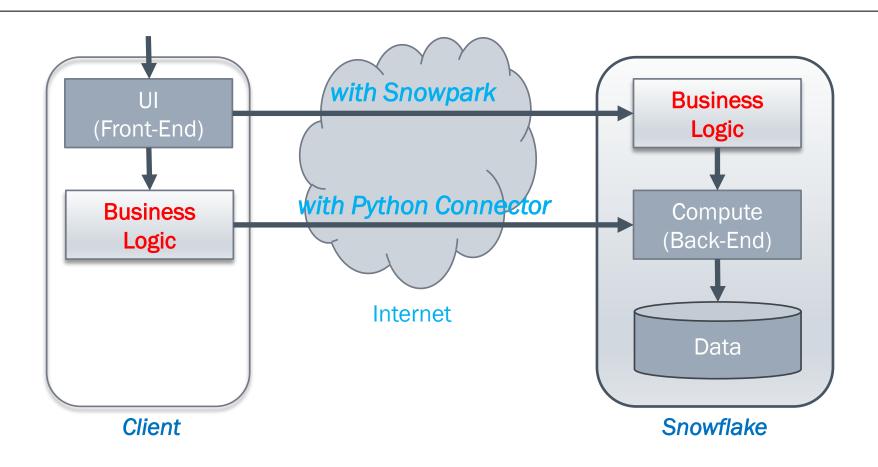
- if provider  $\rightarrow$  consume some other account compute credits
- ∘ if provider for Reader account → consume OWN credits!
- ∘ if consumer → consume OWN credits
- \* Marketplace (public) / Data Exchange (private)
  - ∘ consumer of shared datasets → consume OWN compute credits
  - ∘ ex: SNOWFLAKE\_SAMPLE\_DATA datasets → some are huge!

Estimate Cost Impact

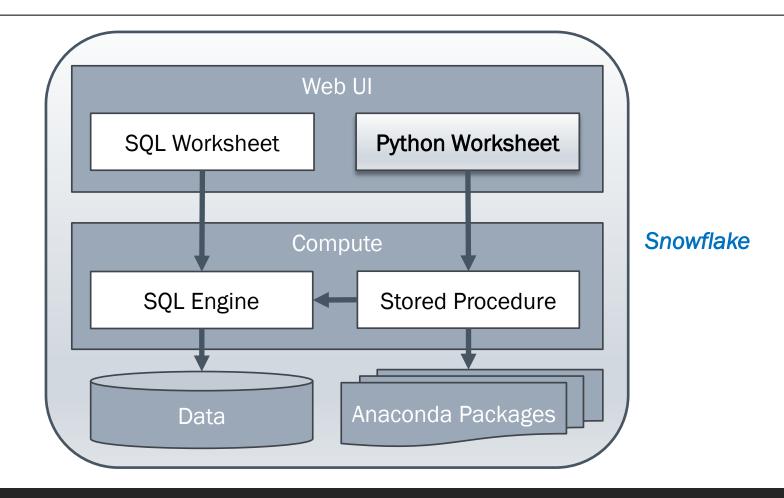
of Client and Server

(Snowpark) Applications

#### Snowpark vs Python Connector



#### Python Worksheet



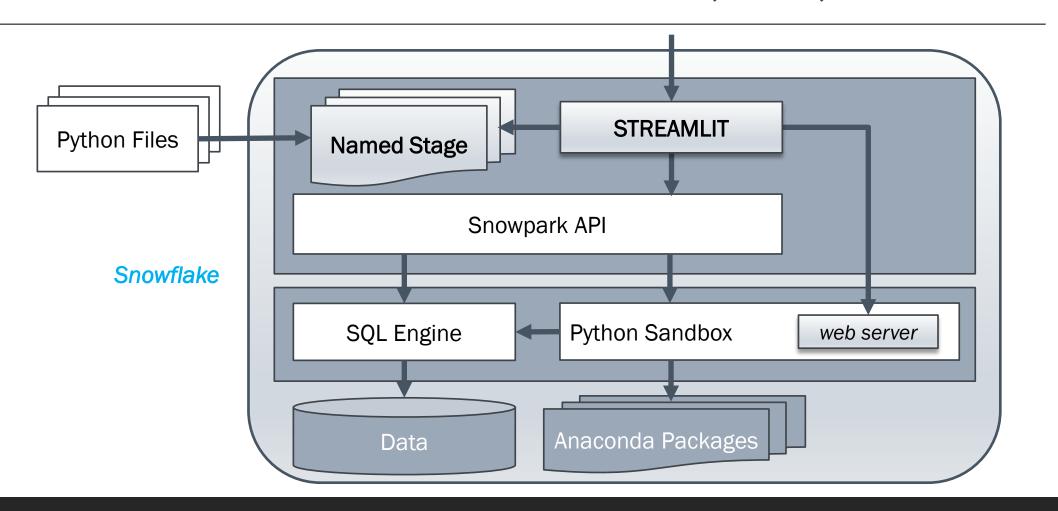
#### Client and Server Applications

- \* client apps (w/ client drivers)
  - consume YOUR compute + storage credits
  - plus lots of data transfer, eventually
- \* server apps (w/ Snowpark, SiS, Container Services)
  - consume A LOT OF YOUR compute + storage credits
  - but less data transfer (as they are closer to data)

- \* Snowpark apps = mostly server-side apps
- \* unlike client apps, business logic is deployed in WHs
- \* Snowflake WHs = db servers (SQL) → app servers (Python)
- \* better rich alternative to Snowflake Scripting
- \* stored proc wrappers around Python code → in WHs
- \* efficient if executing code closer to data is justified

Estimate Cost Impact
of Streamlit in Snowflake
and Native Applications

#### Streamlit in Snowflake (SiS)



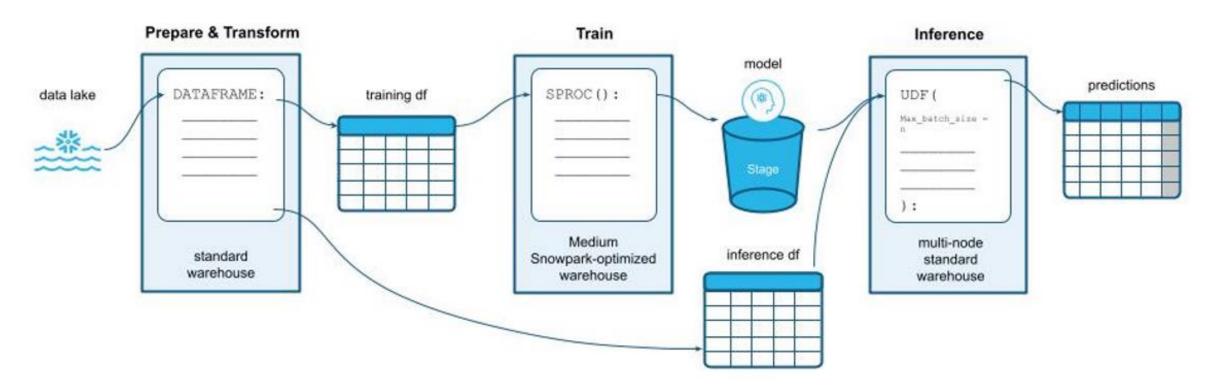
#### Snowflake Native Apps

- \* if provider  $\rightarrow$  consume some other account credits
- \* if consumer  $\rightarrow$  consume OWN compute credits
- \* warning: any FREE native app will cost you money!
- \* ex: SNOWFLAKE app, w/ ACCOUNT\_USAGE schema
- \* it is your metadata, but expensive to browse!

- \* Streamlit in Snowflake (SiS) = wrapper around Python code
- \* STREAMLIT object, deployed+executed as stored proc in WH
- \* it keeps WH up as long as app used -> expensive!
- \* app goes to sleep when WH auto-suspended
- \* most Streamlit web apps can be easily deployed as SiS
- \* alternatives: native apps, Container Services

# Estimate Cost Impact of Data Science Applications

#### Model Training & Serving



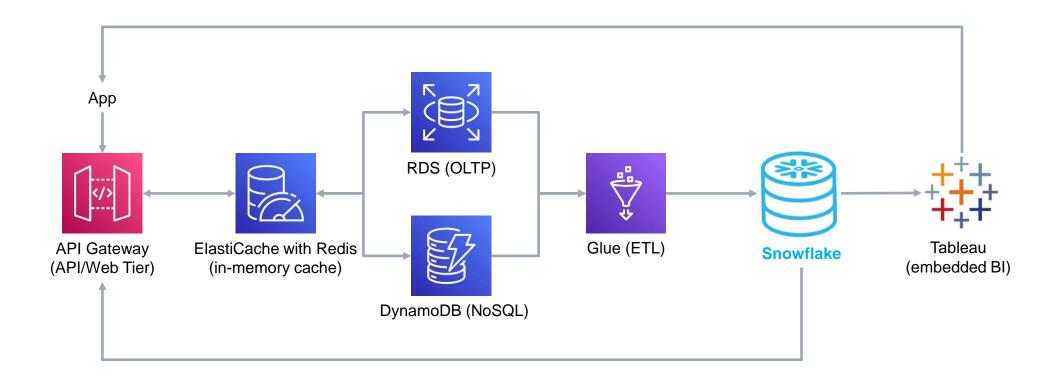
https://www.snowflake.com/blog/snowpark-python-feature-engineering-machine-learning/

- \* Snowflake made Data Science/ML a top priority
- \* model training may require optimized WHs (expensive)
- \* no GPUs  $\rightarrow$  not for NN (but see Container Services w/ NVIDIA)
- \* model serving w/ multi-node standard WHs (also expensive)
- \* is Snowflake ready for Data Science? -> still experimental
- \* Snowflake Notebooks, Snowflake Cortex etc coming up

#### Check All

#### Connected Applications

#### Embedded Analytics



- \* keep an architecture diagram w/ all your integrations
- \* understand how they all consume data, use caches...
- \* check all in-house developed applications
- \* check analytic apps: Tableau, Power BI, Looker...
- \* check ETL tools: Fivetran, dbt...

Third-Party Apps
Saving Money
Will Spend Money

- \* they all install in your account -> consume YOUR credits!
- \* principle: "spend even more money to save money"
- \* claim: "we save you more than you spend on us"
- \* they all rely on best practices and tips from this course
- \* this proves that Snowflake is not at all a zero-admin DW

# Free Marketplace Native Apps Will Cost Money

- \* no free Marketplace native app is truly free
- \* they all install in your account  $\rightarrow$  use YOUR compute credits
- \* plenty of them are actually unreliable  $\rightarrow$  use w/ much care!
- \* are better suited for expensive prod account, not test accounts
- \* will start an expensive STREAMLIT object
- \* may query metadata w/ intensive queries
- \* may transparently schedule expensive tasks!

# Keep App Versions Updated

- \* hard to use latest performance and security updates
- \* WHs usually have installed older versions → check!
- \* check and use the latest deployed framework versions
- \* check and use latest deployed packages & libs
- \* update your Snowflake client drivers & libraries

### Cache Data in Third-Party Tools

#### Power BI Connection Types



**Import Data** 





**Direct Query** 







**Live Connection** 



- \* mostly for analytic tools (Tableau, Power BI, Looker)
- \* avoid querying Snowflake data at every visit
- \* should combine access to live+cached data
- \* use data extracts w/ aggregations for dataviz
- \* avoid refreshing dashboards too frequently
- \* use query tags to identify intensive operations

# Auto-Abort Running Queries from Disconnected Apps

- \* conn closed on sync queries -> all aborted right away
- \* conn closed/lost (net outage) on async queries
  - all may continue, for max 2 days!
  - STATEMENT\_TIMEOUT\_IN\_SECONDS (account/session/WH level)
  - ◆ ABORT\_DETACHED\_QUERY (session level) → abort after 5 mins max



### 100 Snowflake Cost Optimization Techniques

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