

Choosing The Right Boat For Your Stream

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What We Will Cover

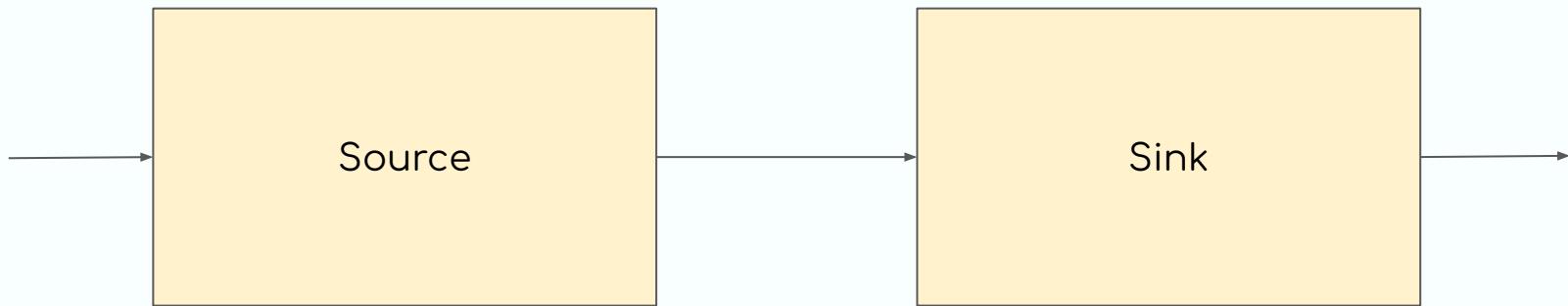
A Holistic View Of Streaming

How To Think About Decisions

Where Streaming Is Going



What Is Streaming Anyway?



There Are A Lot Of Ways To Do This

Dataflow, Flink, Spark, Kafka Connect, Data Transfer Service, Datastream,
Continuous Queries, Import Topics & Export Subscriptions, Single-Message
Transforms (SMTs), DIY Solutions...

Everyone loves to (re)build ways to move data!

Multiple Options Always Exist

There will never be "one solution to rule them all"

One solution for everything



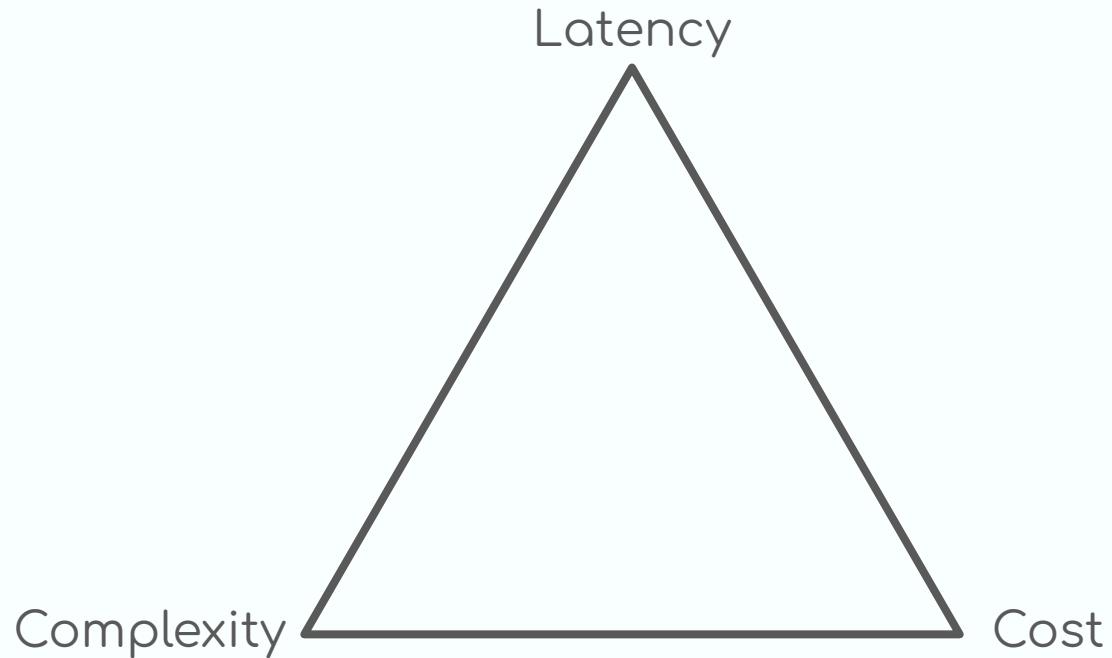
One solution per pipeline



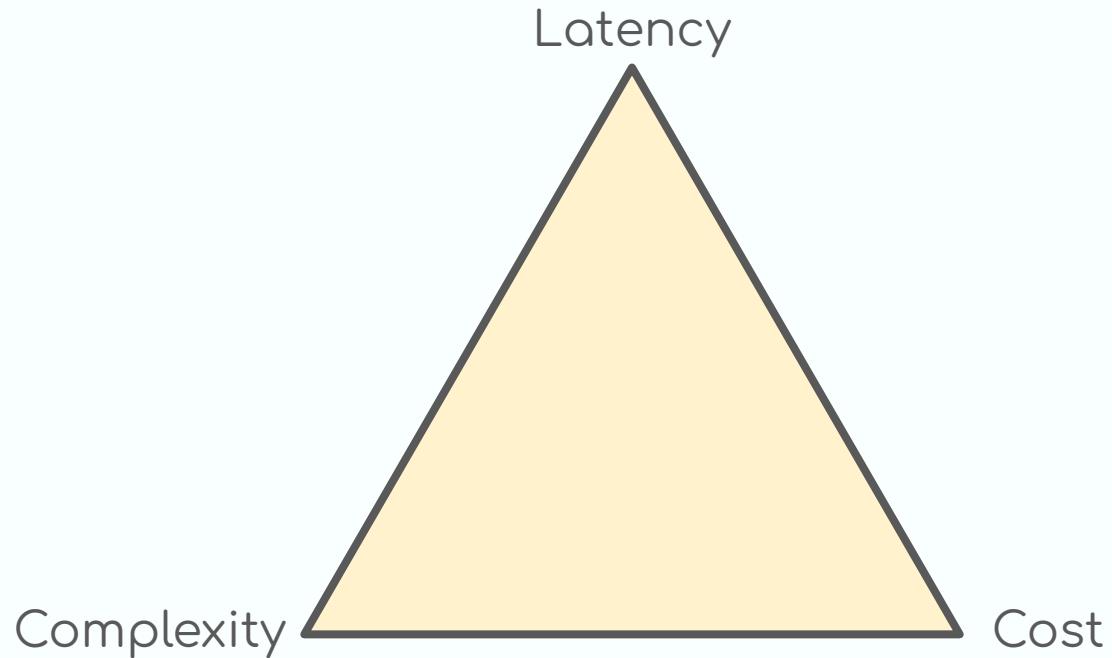
One solution per connection



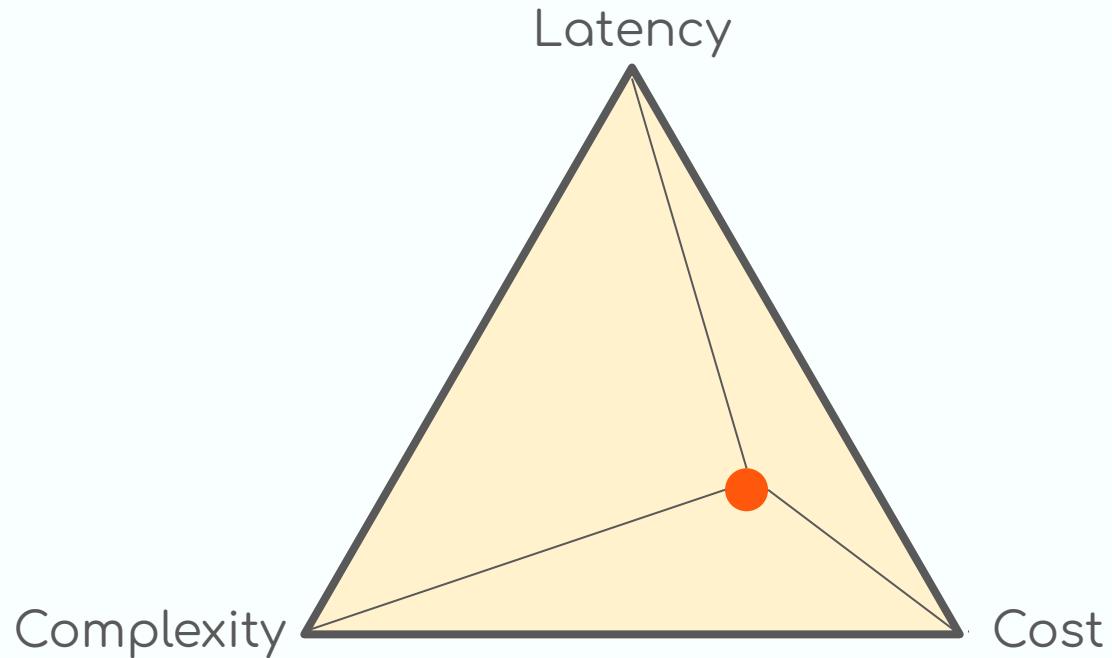
Life Is A Bunch Of Tradeoffs



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Life Is A Bunch Of Tradeoffs



Where is the data coming from and going?

How much data and **how** fast do I need it to move?

Why might I prefer one tool over another?

What do I need to do to the data?

When should I do it?

Who is the owner of the data?

Where is the data coming from and going?

How much data and **how** fast do I need it to move?

Why might I prefer one tool over another?

What do I need to do to the data?

When should I do it?

Who is the owner of the data?

Stateless Transformation



Validate

Filter

Alter (redact, re-encode, project)

Enrich

Stateful Transformation

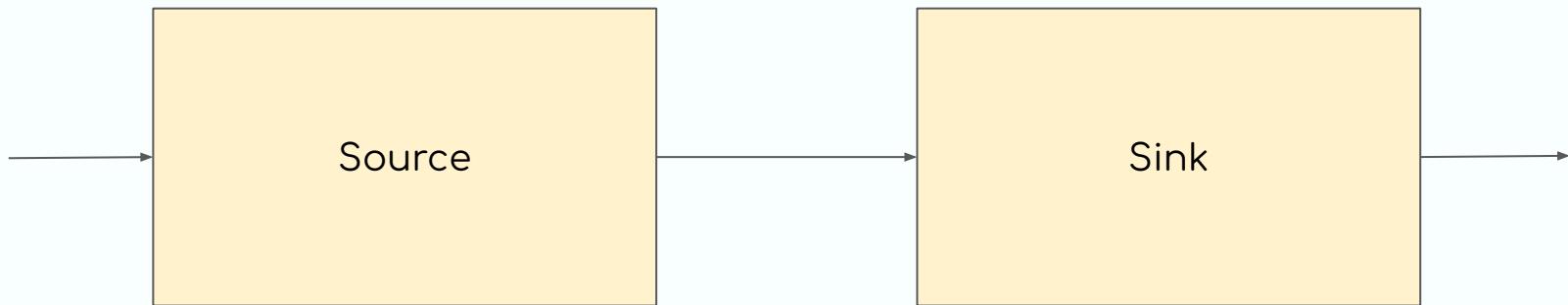


Dedupe

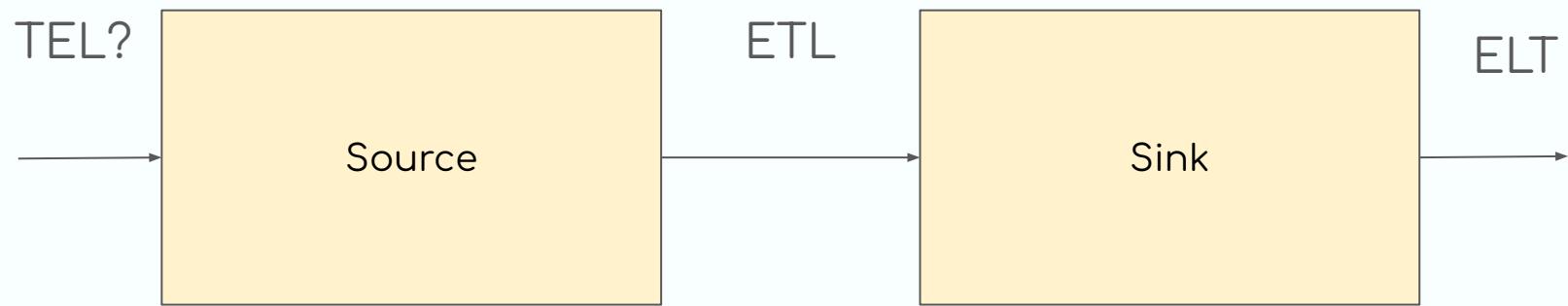
Order

Aggregate

When Should I Do It?

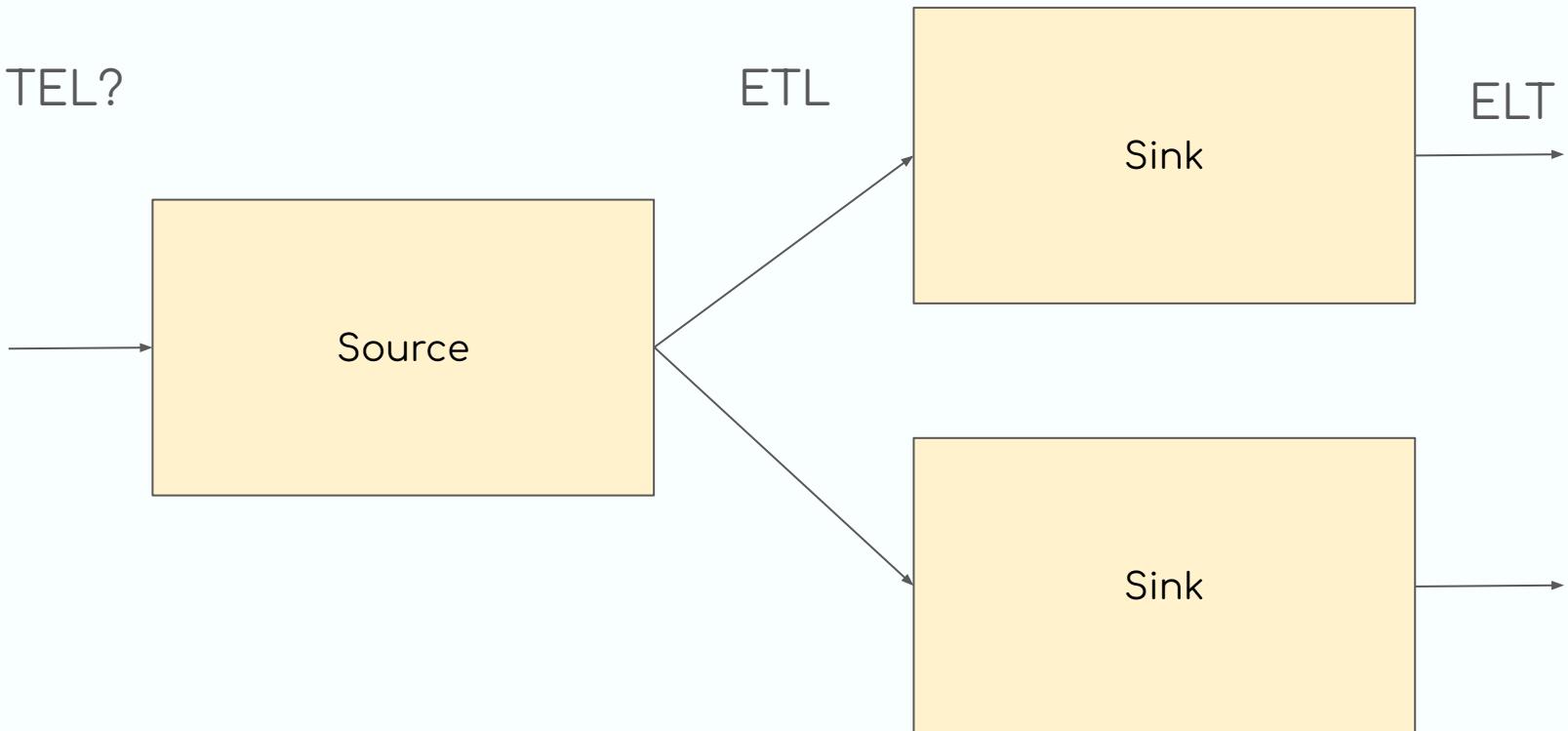


When Should I Do It?



When Should I Do It?

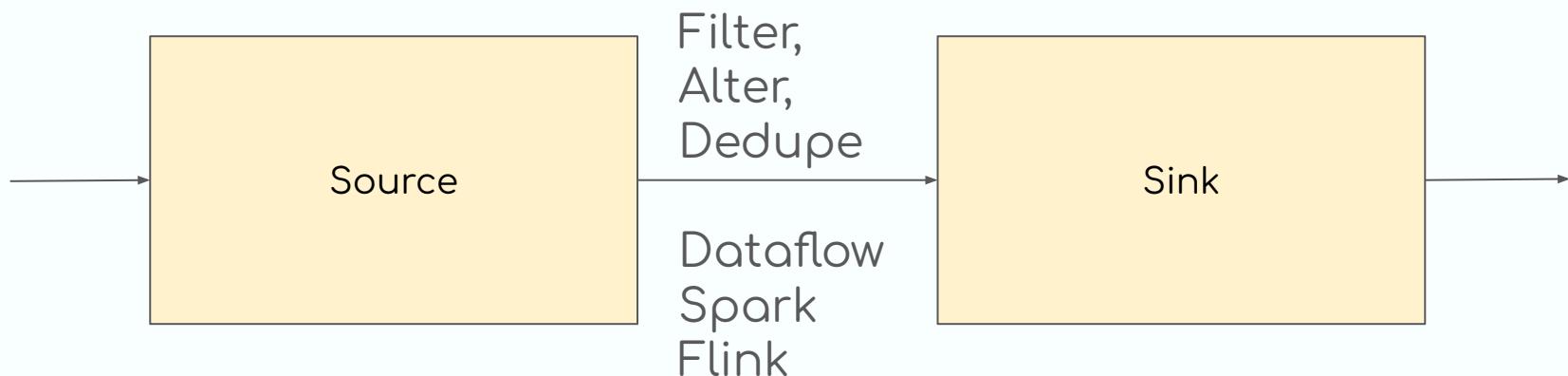
TEL?



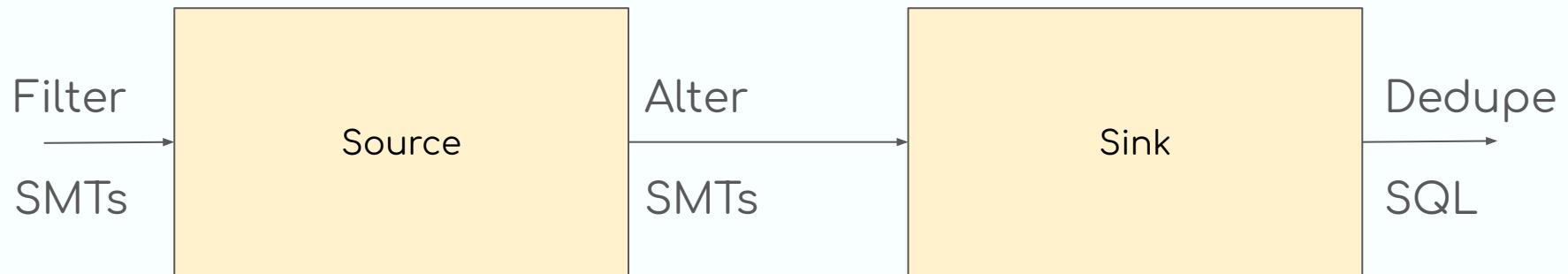
When Should I Do It?

Operation	TEL	ETL	ELT
Filter	Cheaper		Change retroactively
Validate	Report failure to producer	What to do with invalid data?	What to do with invalid data?
Alter/Enrich	Edit once for all consumers	Process at rate of enrichments	Need to perform repeatedly
Dedupe /Order	Can't control what is done downstream		Operate on a subset
Aggregate	Slows down producer	Process at rate of enrichments	Need to perform repeatedly

When Should I Do It?



When Should I Do It?



What If I Don't Own The Producer?

Operation	TEL	ETL	ELT
Filter	Cheaper		Change retroactively
Validate	Report failure to producer	What to do with invalid data?	What to do with invalid data?
Alter/Enrich	Edit data before consumer	Process at rate of enrichments	Need to perform repeatedly
Exactly once /Order	Can't guarantee this is done sequentially		Operate on a subset
Aggregate	Slows down producer	Process at rate of enrichments	Need to perform repeatedly

What If I Don't Own The Consumer?

Operation	TEL	ETL	ELT
Filter	Cheaper		Change retroactively
Validate	Report failure to producer	What to do with invalid data?	What to do with invalid data?
Alter/Enrich	Edit data before consumer	Process at rate of enrichments	Need to repeat
Exactly once /Order	Can't guarantee this is done sequentially		Operate sequentially
Aggregate	Slows down producer	Process at rate of enrichments	Need to perform repeatedly

Is this **operational** data being consumed by an **analyst** or
analytical data being provided by an operational workload?

How many copies of the data should exist?

Is it okay for there to be transient copies of the data?

Do Pub/Sub systems count as storage?

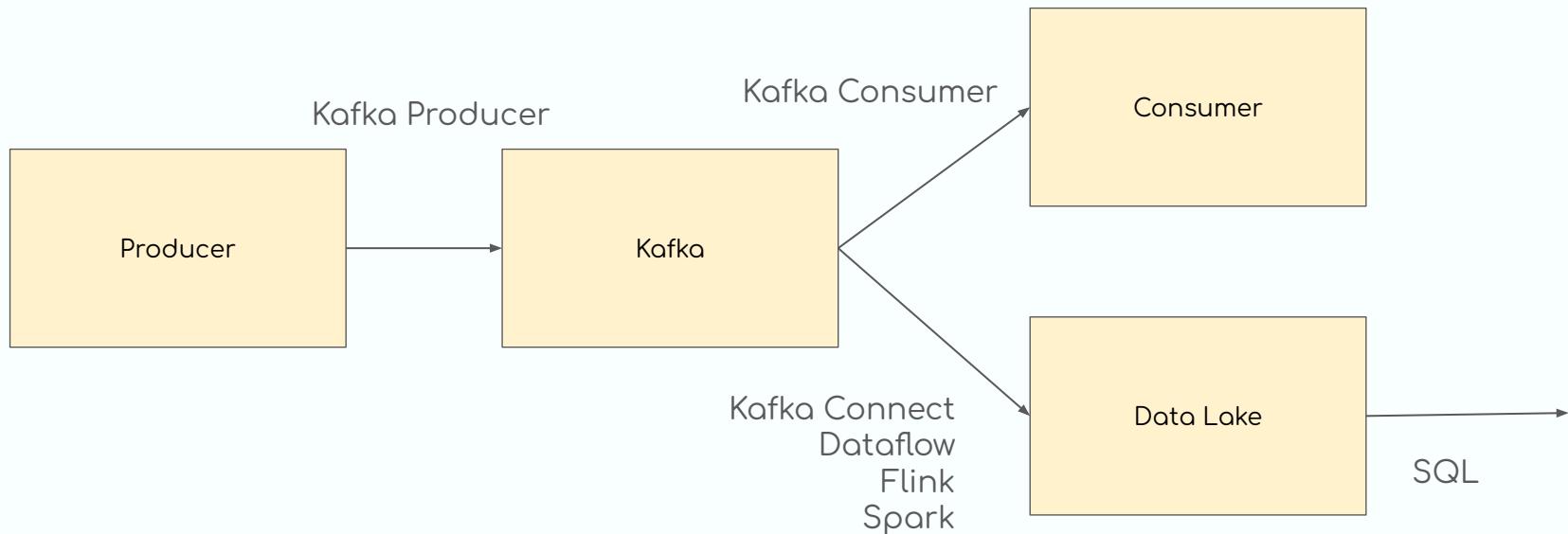
Should all stored data always be valid?

Who defines validity?

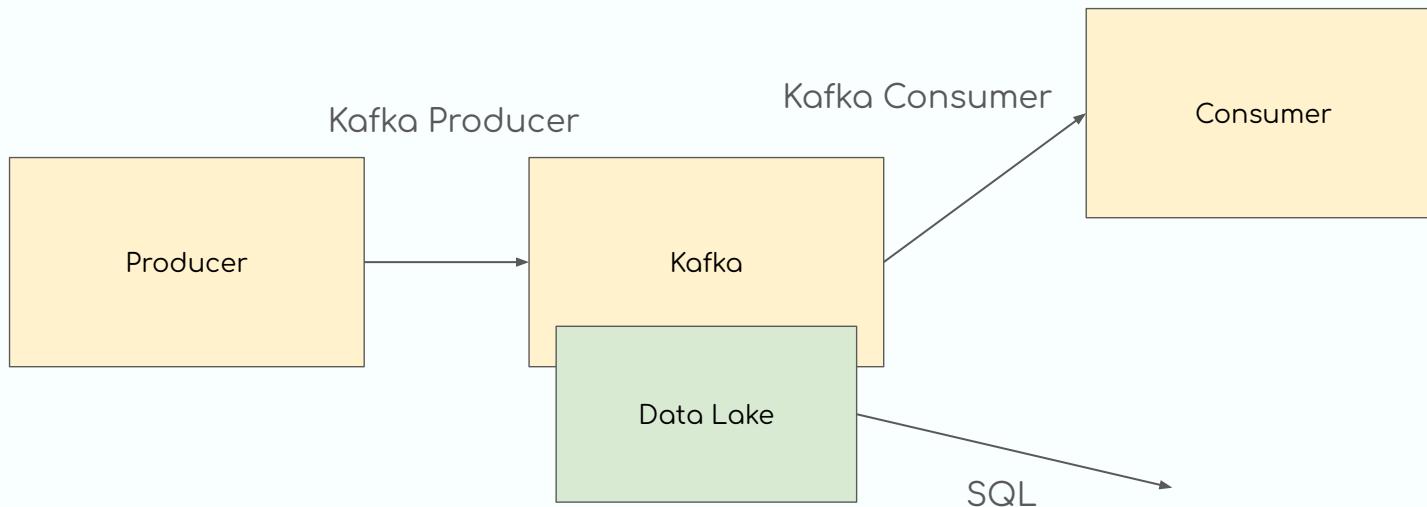
Where This Is All Going



Copy/Move Data To Sink



Data Lake As Storage



Data Lake As A Sink

Independent copies of data

Pull-based model

Accept first, clean later

Allows for ETL

Data Lake As Storage

Single copy of data (if it doesn't need to be transformed)

Push-based model

Make producers aware of issues

Relies on ELT (or internal ETL)

More Questions Than Answers

Transforming data is inescapable

Fine-grained decisions are better
than coarse-grained decisions

Consider the data owner



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QUESTIONS?

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[Cloud Pub/Sub](#)

[Managed Service For Apache Kafka](#)