# re:Invent DECEMBER 2 - 6, 2024 | LAS VEGAS, NV

S V S 3 2 1

# AWS Lambda and Apache Kafka for real-time data processing applications

**Julian Wood** 

(he/him)
Principal Developer Advocate
AWS



# What are we talking about today?

- **01** Understanding data streaming
- **02** Streaming data on AWS
- **03** Streaming architecture
- **04** Processing streaming data
- **05** AWS Lambda and Kafka
- **Managing performance**





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# **About me**

### **Julian Wood**

Principal Developer Advocate – AWS Serverless
Recovering server"more" infrastructure engineer
Enterprises and startups
You can't scare me, I have twin girls!
From Cape Town via London



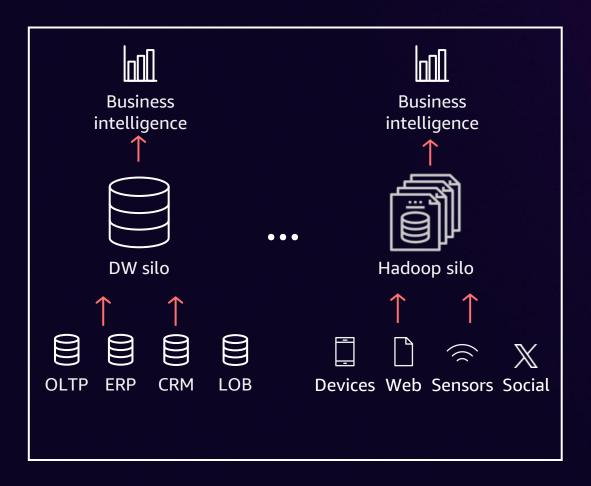


# Understanding data streaming



# Data processing is evolving . . .

### Siloed data

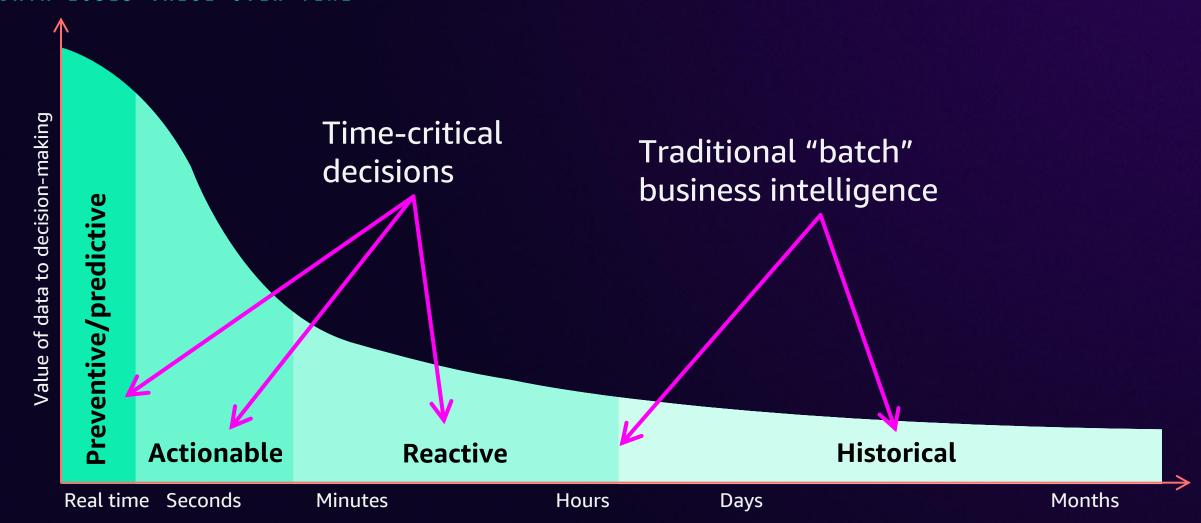


### **Modern data architectures**



# Streaming enables real-time processing

DATA LOSES VALUE OVER TIME





# Streaming enables real-time processing

# **Batch processing**

Hourly server logs

Weekly or monthly bills

Daily website clickstream

Daily fraud reports

## Stream processing

Real-time metrics

Real-time spending alerts and caps

Real-time clickstream analysis

Real-time detection



# Common uses of streaming data



Industrial automation



Clickstream data



Online gaming interactions



Data lakes



IoT device monitoring



Log analytics



# Streaming data pipeline

### **Stream sources** Stream ingestion

### Stream storage

### Stream analytics & integration

### Outcome







[Wed Oct 11 14:32:52 2023] [error] [client /live/ap/htdocs/test

Logs





**AWS SDK** 



AWS Database Migration Service (AWS DMS)



**MSK Connect** 





**Amazon Managed** Streaming for Apache Kafka (Amazon MSK)

### Stream analytics









Amazon AWS Glue Amazon Managed Service Lambda **EMR** for Apache Flink

### Stream integration



Amazon Data Firehose



Amazon S3



Amazon Redshift



Amazon OpenSearch Service



Automatic decision



Interactive dashboard



Alerting



Real-time ML inference



# Streaming data characteristics

### High volume

Organizations that collect clickstream data about user behavior can often reach up to 2–3 TB every day

### **Nearly continuous rather than discrete**

IoT devices like sensors collect data continuously and at regular intervals

### **Ordered**

A chat application makes little sense with messages out of order

### Time-sensitive

Fraud detection must be done as quickly as possible to prevent loss



# Streaming data on AWS



# go kafka

Apache Kafka



# What is Apache Kafka?



Apache Kafka



Is it like a service bus?



Is it like REST but async?



Is it like a database?



# What is Apache Kafka?



Apache Kafka

**Streaming platform** 



Is it like a service bus?



Is it like REST but async?



Is it like a database?



# **Running Apache Kafka**

- Self-managed (on premises/cloud)
- Amazon MSK

- Confluent Cloud (SaaS)
- Confluent Platform (on premises/cloud)
- Redpanda
- WarpStream







### **Amazon MSK**

Securely stream data with a fully managed, highly available Apache Kafka service



Automate provisioning, configuring, and tuning



Fully compatible with open source Apache Kafka



Highly secure



Lower cost



# **Amazon MSK fully managed**

Self-managed Kafka

### On premises

App dev/optimization

Scaling

High availability

Kafka install/patching

Rolling version upgrades

Broker/ZK maintenance

Within-cluster data transfer cost

Encryption

OS patching

OS install

Hardware maintenance

Hardware lifecycle

Power/network/HVAC

### **Amazon EC2**

App dev/optimization

Scaling

High availability

Kafka install/patching

Rolling version upgrades

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### **Amazon MSK**

App dev/optimization

Scaling\*

High availability

Kafka install/patching

Rolling version upgrades

Broker/ZK maintenance

Within-cluster data transfer cost

Encryption

**AWS** managed

OS patching

OS install

Hardware maintenance

Hardware lifecycle

Power/network/HVAC

More focus
on creating
streaming
applications
than
managing
infrastructure

\*Cluster expansion and scaling storage



# **Amazon MSK Serverless**



Easily run Apache Kafka clusters without rightsizing cluster capacity

Instantly scale I/O without worrying about scaling capacity up and down or reassigning partitions

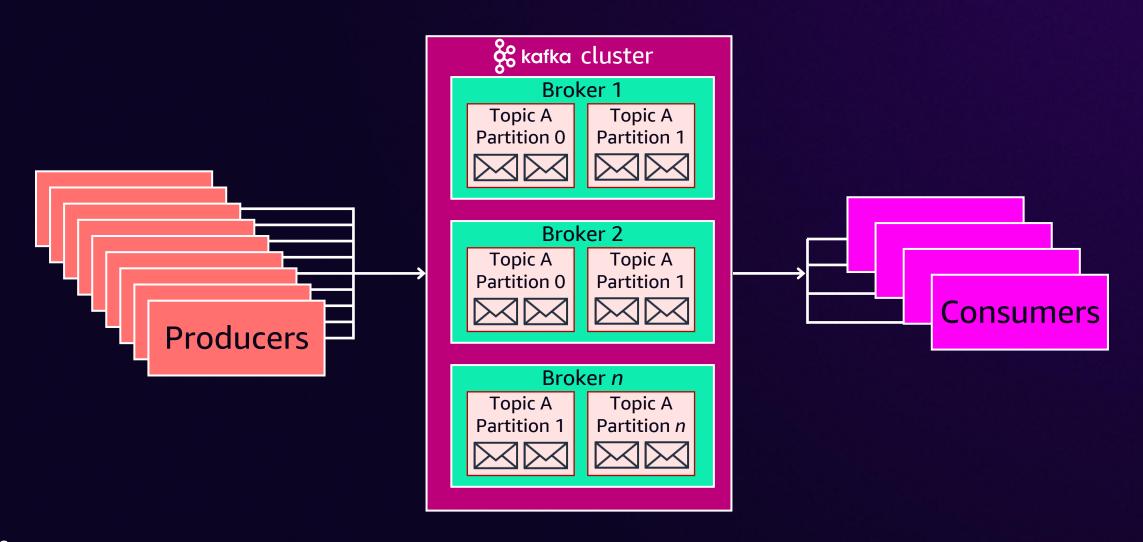
Pay for the data volume you stream and retain



# Streaming architecture

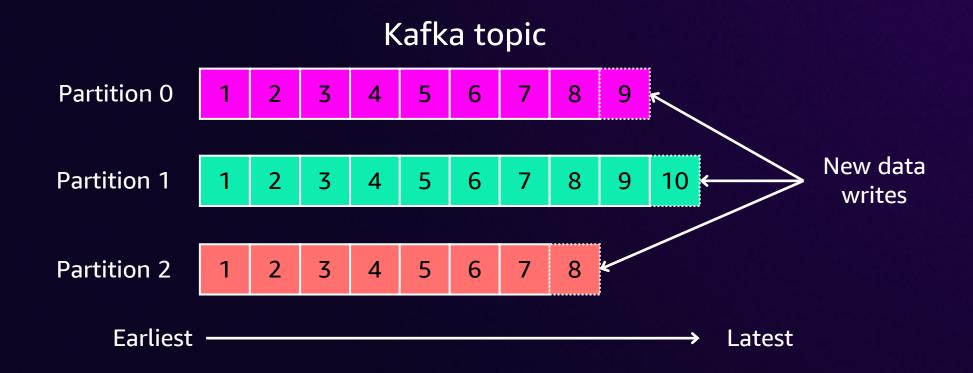


# Kafka clusters, brokers, topics, partitions, records



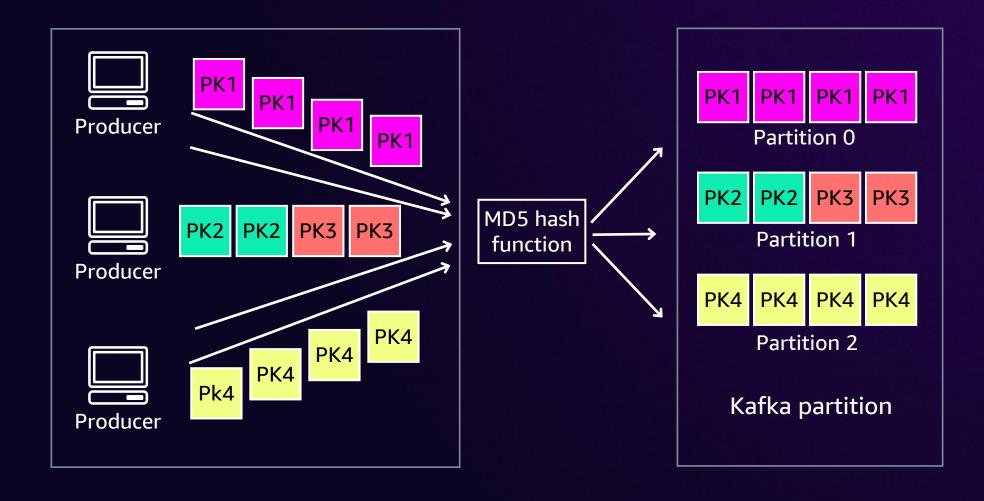


# Kafka partitions





# **Partition keys**





# **Partition assignment**

### Random hash

- Random hash, records are randomly sent to different partitions
- Load balances records across all available partitions

### **Time-based hash**

- Groups of records sent to a single partition if they arrive at the same time
- Identical timestamp results in an identical hash

# Application-specific hash: Example: customerID as the key

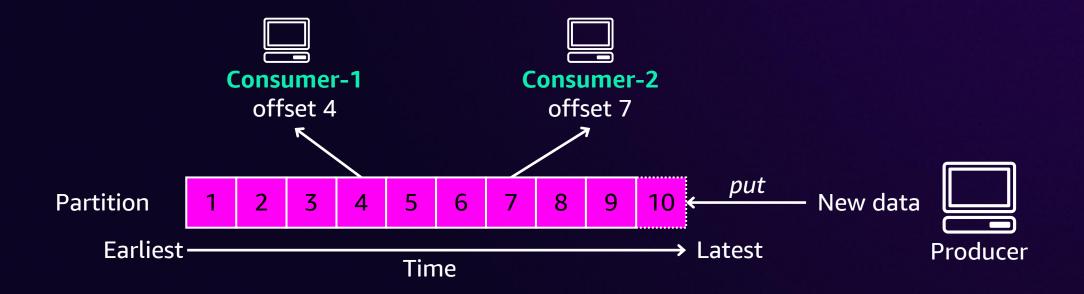
- All records for that customer are routed to the same partition, always in order
- Useful for downstream aggregation logic
- May limit the record capacity per customerID



# Kafka offset

Tracks partition record sequence

Consumers store this to keep track of their position in the stream





# Processing streaming data



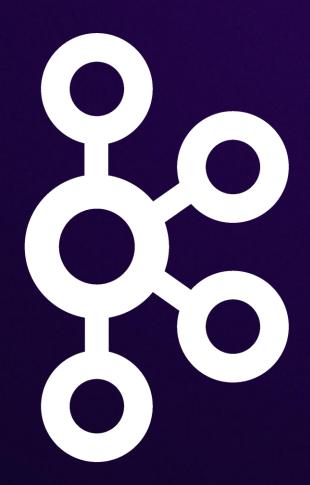
# **Consuming streaming records**

# **Processing**

- Amazon EventBridge bus
- Amazon EventBridge Pipes
- Lambda event source mapping
- Kafka Connect

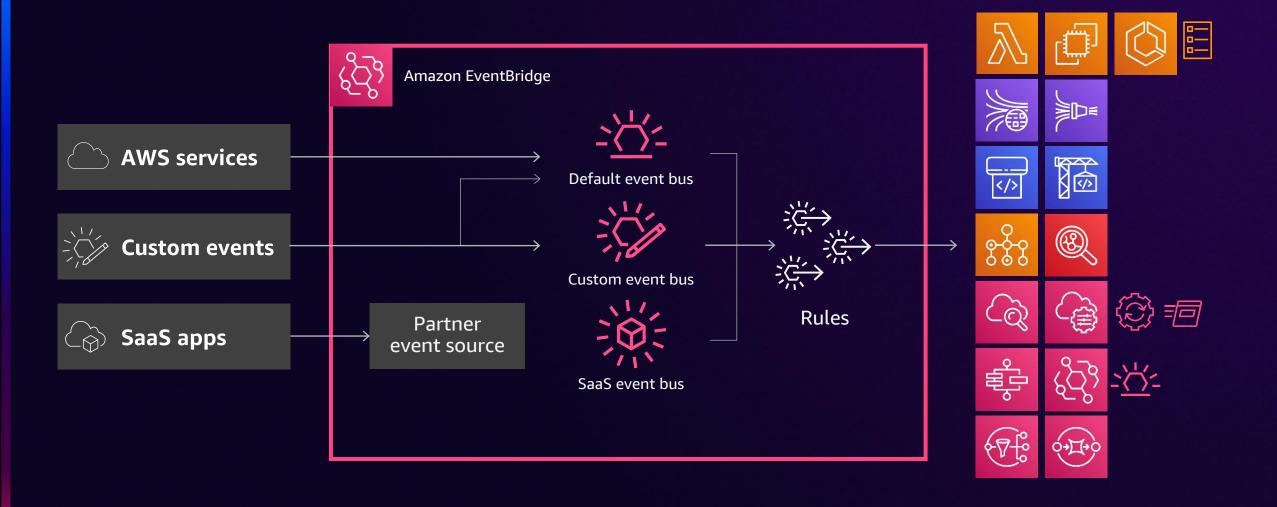
# **Analytics**

- Amazon Managed Service for Apache Flink
- AWS Glue





# Amazon EventBridge event bus



# Kafka and EventBridge bus

### Kafka

- Stream events (pull)
- Requires smart endpoints
- Open source, run anywhere
- Fully managed (Amazon MSK)

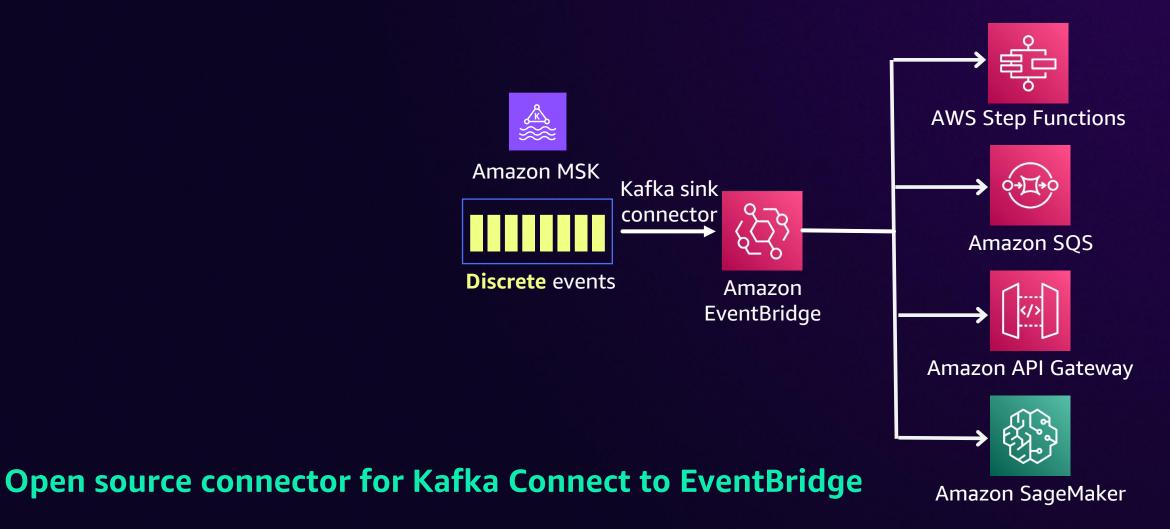


### **EventBridge**

- Discrete events (push)
- AWS and partner integrations
- Low code
- Fully managed

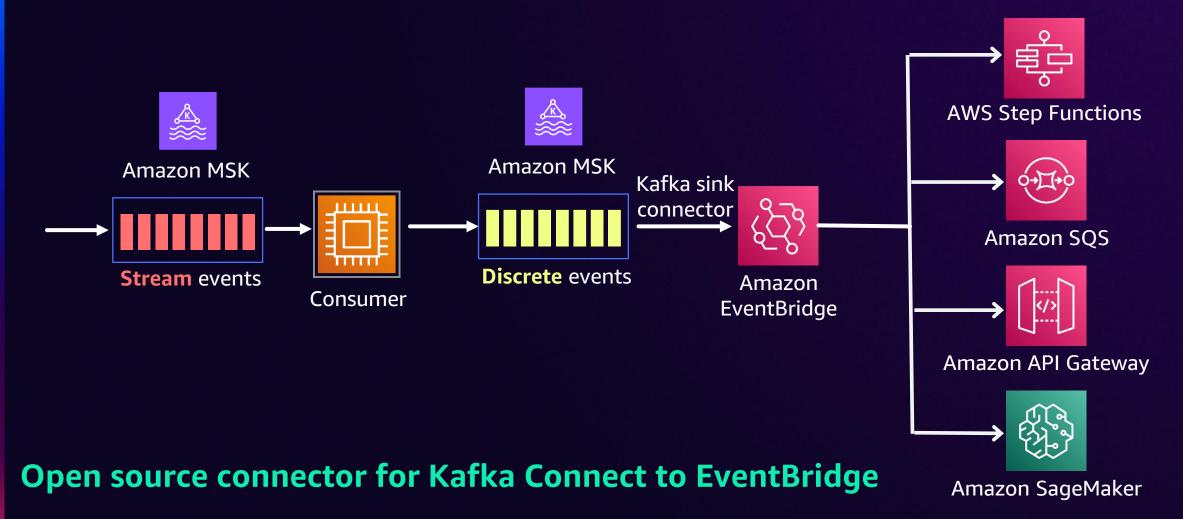


# Kafka connector for Amazon EventBridge





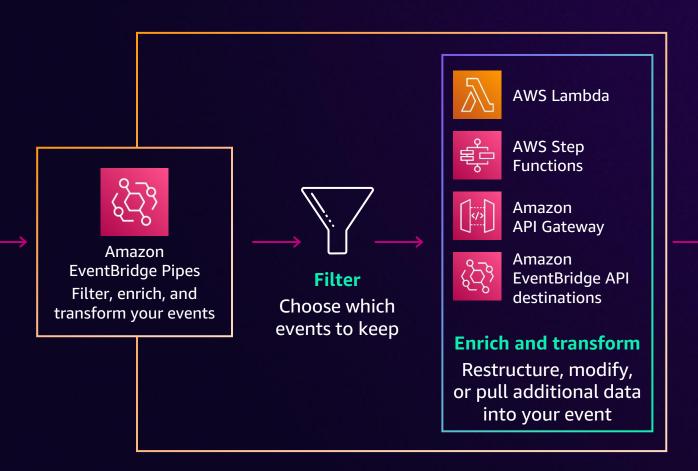
# Kafka connector for Amazon EventBridge





# **EventBridge Pipes: Point-to-point**

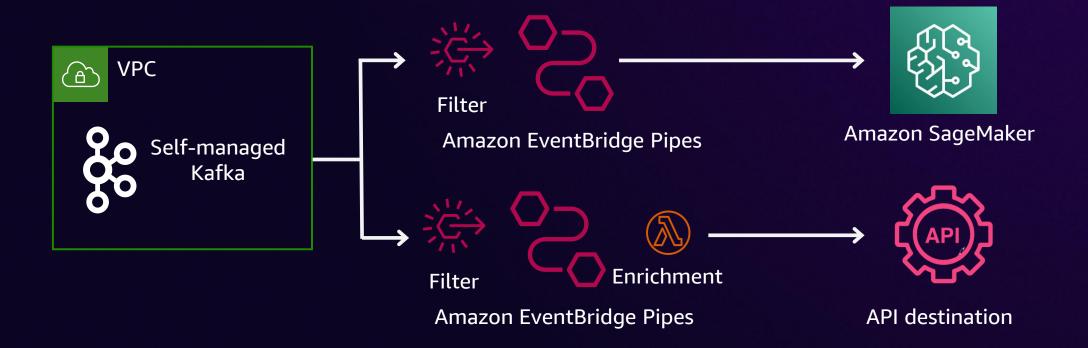






# Kafka use case: Connect to API destination

Connect your self-managed Kafka cluster to other AWS services and HTTP APIs without writing any code



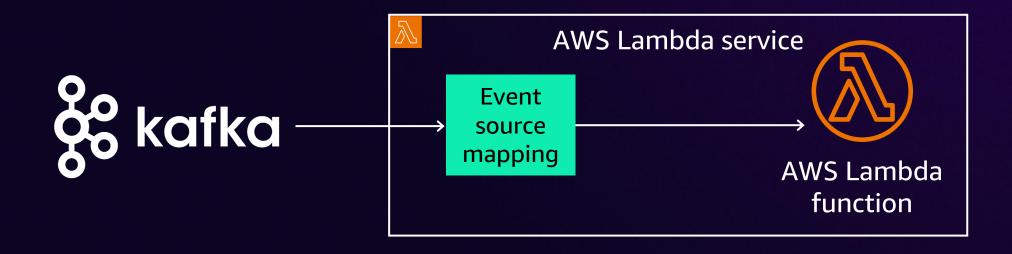


# **AWS Lambda and Kafka**



# Kafka Lambda consumer options







# Kafka/Confluent Lambda sink connector



Polls Kafka partitions and calls your function synchronously or asynchronously

At-least once semantics

Option to batch records

Scales up to soft maximum of 10 connectors

Amazon MSK Connect capacity options: provisioned/auto scaled based on workers



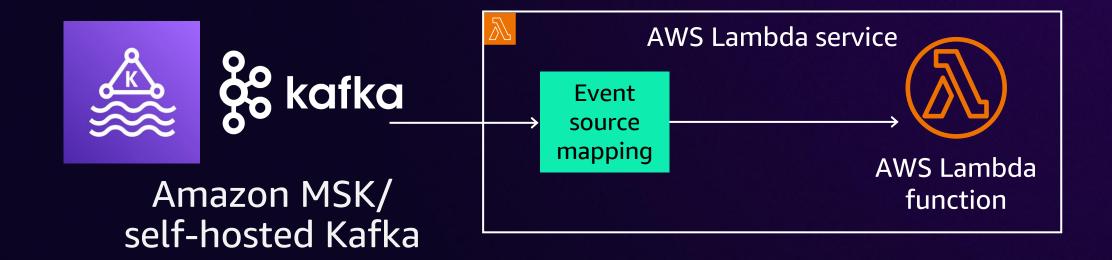
### Sink connector error handling



- Connector can send to Kafka dead-letter queue (DLQ)
- Lambda error handling semantics follow async/sync invocations
  - Async: Lambda service retries twice (three total attempts)
    - Send to Lambda DLQ/destinations for failed invocations
  - Sync: By default, fails and stops processing for that partition
    - Option to log to another Kafka topic and continue processing



### Lambda event source mapping

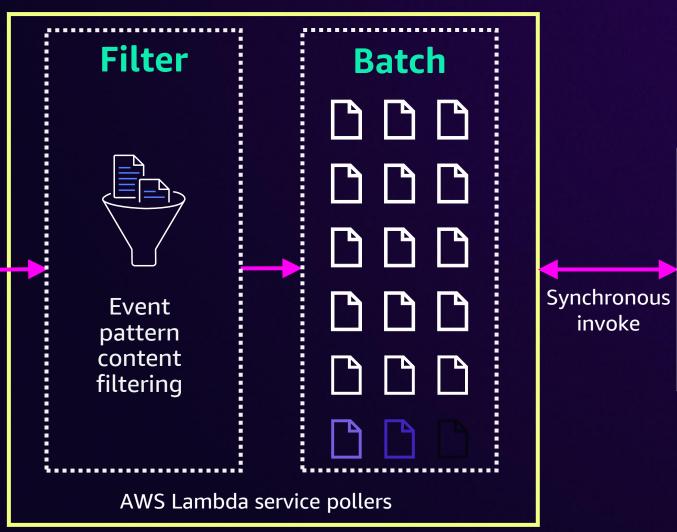




#### Lambda event source mapping

LAMBDA RESOURCE THAT READS FROM AN EVENT SOURCE AND INVOKES A LAMBDA FUNCTION

# **Event source Amazon Kinesis DynamoDB Streams** Amazon SQS Amazon MSK Amazon MQ Apache Kafka



**Target** 

AWS Lambda

function



### Lambda event source mapping

Serverless processing using Lambda functions Lambda service polls Kafka automatically Custom processing in any language runtime

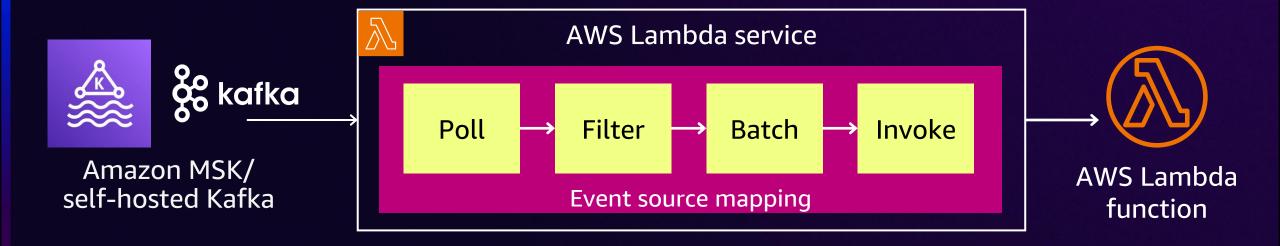
Configurable starting position
Supports optional filtering
Records delivered in a batch as a payload



**AWS Lambda** 

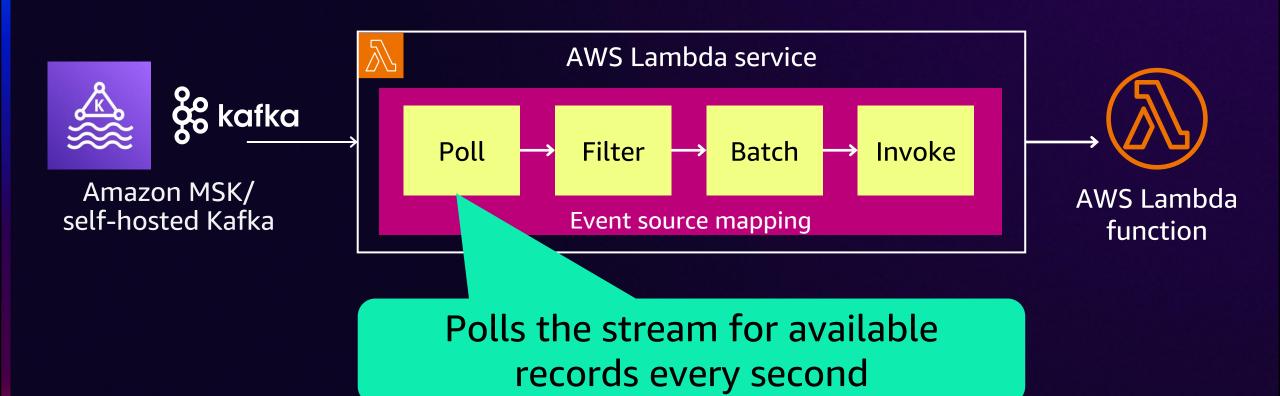


### **Event source mapping**





### **Event source mapping: Polling**





### **Event source mapping: Starting position**



#### TRIM\_HORIZON

Start reading at earliest record in the stream

#### **AT\_TIMESTAMP**

Start reading at specific timestamp

#### **LATEST**

Start reading from latest record once Lambda configures the ESM

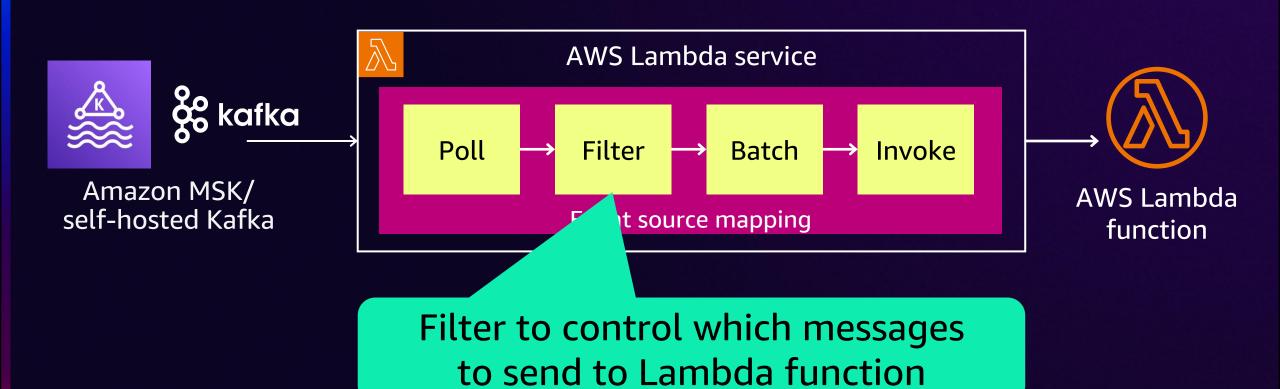
Possible delay between configuring the ESM and processing the first record

### Kafka event source mapping: Consumer group ID

- Any Kafka topic consumer uses a consumer group
- ESM creates this by default, generates randomly unique value
  - Lambda identified as a new consumer to start processing at a specified position
- Can create ESM that uses a custom consumer group ID
  - Connect Lambda to an existing consumer group
  - Consuming starts from where Kafka recorded the consumer group left off
  - Connect Lambda to a topic that is replicated using MirrorMaker 2



### **Event source mapping: Filtering**





### **Event source mapping: Filtering**

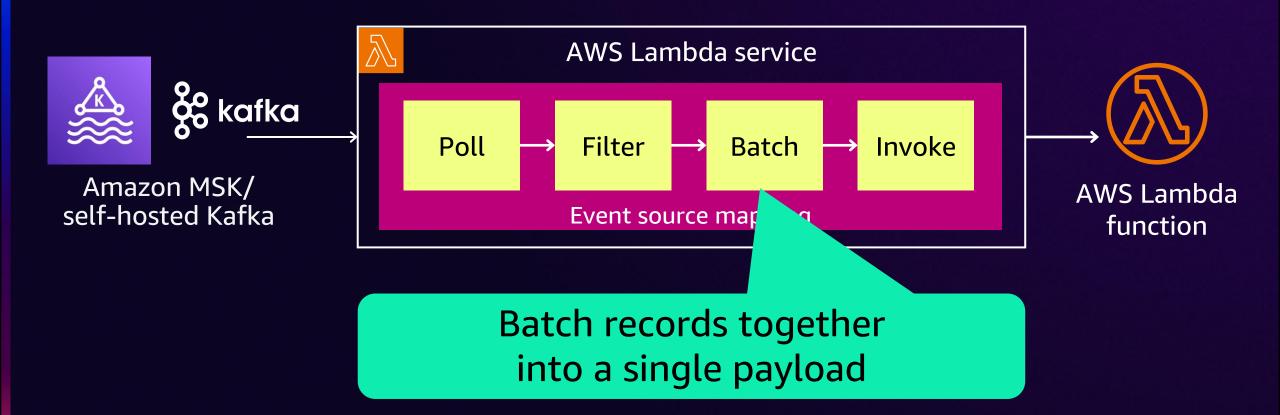
```
FleetTirePressureMapping:
                                                function invocation
 Type: AWS::Lambda::EventSourceMapping
 Properties:
   FunctionName: fleet-tire-pressure-evaluator
   BatchSize: 100
   StartingPosition: LATEST
   EventSourceArn:
     arn:aws:kafka:...:stream/fleet-telemetry
     FilterCriteria:
        Filters:
           - Pattern:
                "data": {
                   "tire_pressure": [{"numeric": ["<", 32]}]
```

Filter incoming messages before

Reduce traffic to function, reduce cost

- Same pattern matching rules as Amazon EventBridge
- Define up to 5 patterns per ESM, up to 2,048 characters each
- Batching applied after filtering

### **Event source mapping: Batching**





#### **Event source mapping: Batching**

- Batching window reaches its maximum value
  - Default batch window is 500 ms
  - Can configure any value from 0 to 300 seconds (5 minutes) in increments of seconds
- Batch size is met
  - Minimum/default batch size = 1, maximum = 10,000
- Payload size reaches 6 MB
  - Cannot modify this limit, as this is the Lambda invocation payload limit

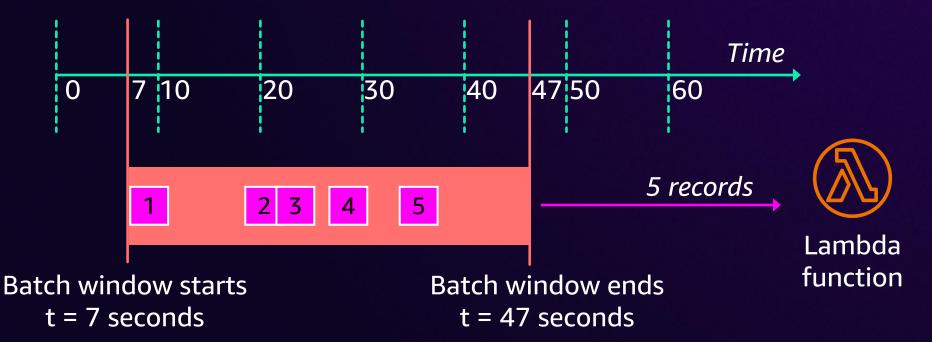


### **Batching: Maximum batch window reached**

**Maximum batching window = 40 seconds** 

Maximum batch size = 10

Maximum batch bytes = 6 MB



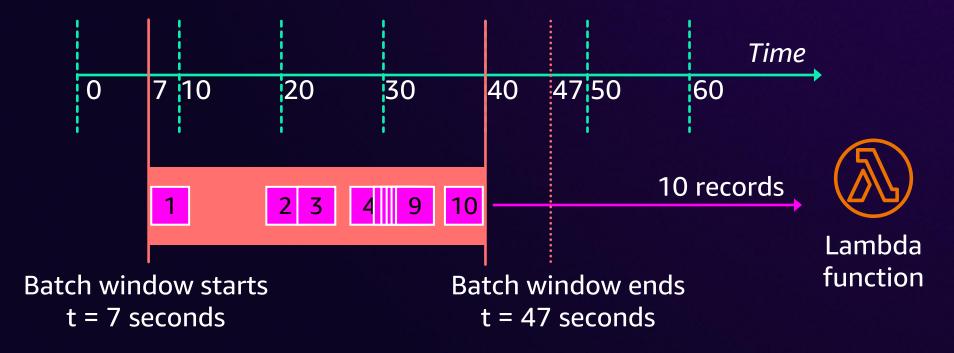


### Batching: Maximum batch size reached

Maximum batching window = 40 seconds

Maximum batch size = 10

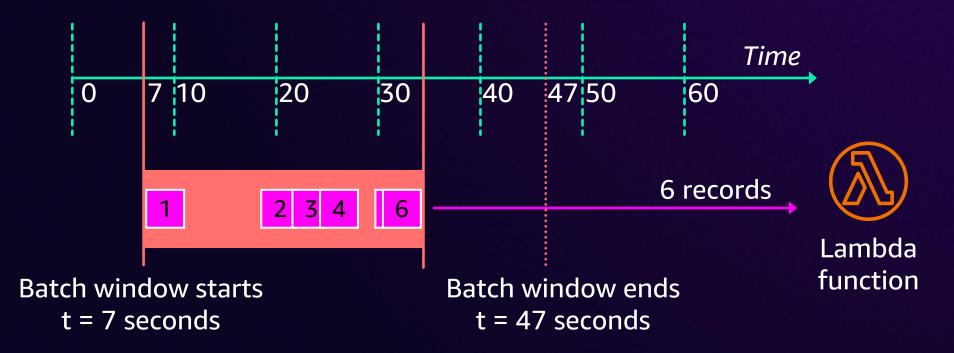
Maximum batch bytes = 6 MB





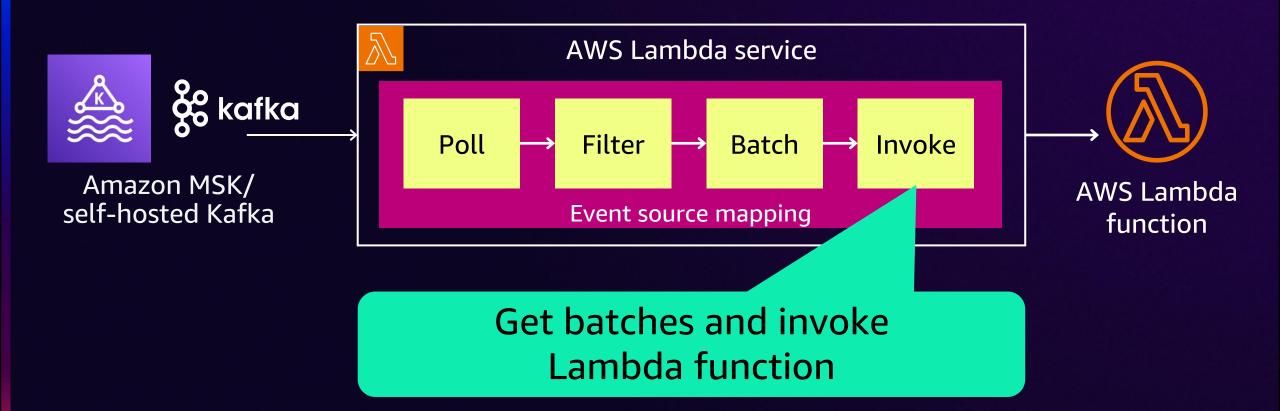
### Batching: Maximum batch payload size reached

Maximum batching window = 40 seconds Maximum batch size = 10 Maximum batch bytes = 6 MB





#### **Event source mapping**





#### **Example events**

#### Kafka

```
"eventSource": "aws:kafka",
"eventSourceArn": "arn:aws:kafka:us-east-1:123456789012:cluster/vpc-2priv-2pub/751d2973-a626-4...
"records": {
 "mytopic-0": [
        "topic": "mytopic"
        "partition": "0",
        "offset": 15,
        "timestamp": 1545084650987,
        "timestampType": "CREATE_TIME",
        "key":"abcDEFghiJKLmnoPQRstuVWXyz1234==",
        "value": "SGVsbG8sIHRoaXMgaXMgYSB0ZXN0Lg==",
        "headers":[
               "headerKey":[
                  104,
                  101,
                  101
```

aws

#### Lambda authentication to Kafka

| Kafka hosting option  | SASL/SCRAM<br>+TLS | SASL/PLAIN | IAM | TLS | Unauthenticated |
|-----------------------|--------------------|------------|-----|-----|-----------------|
| Self-managed Kafka    | Yes                | Yes        | No  | Yes | No              |
| Amazon MSK            | Yes                | No         | Yes | Yes | Yes             |
| Amazon MSK Serverless | No                 | No         | Yes | No  | No              |

SASL: Store credentials in AWS Secrets Manager

Amazon MSK: Secret name must begin with prefix: *AmazonMSK*\_

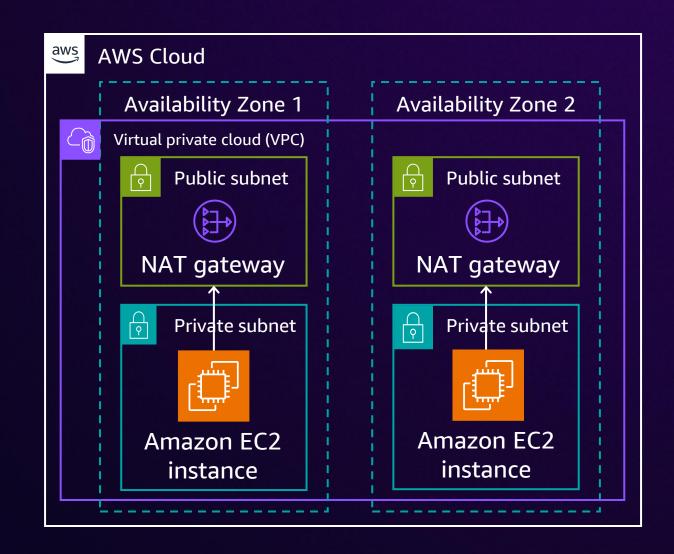
Amazon MSK Serverless: Only supports IAM



#### Self-hosted Kafka networking

# Lambda ESM connectivity to self-hosted Kafka

- Accesses Kafka over WAN
- Requires NAT gateway in public subnet(s)
- Configure subnets/security groups for access
- Lambda function and Amazon MSK VPC can be same or different account

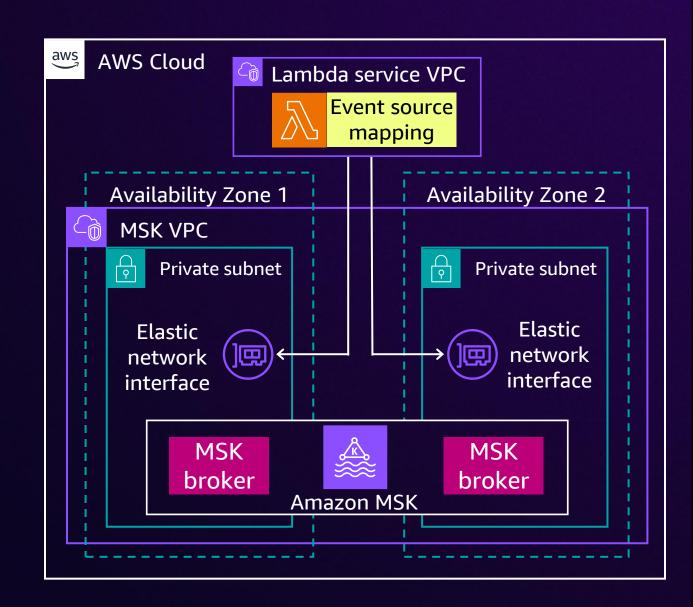




### Amazon MSK networking: Lambda ESM to MSK

#### Lambda ESM connectivity to Amazon MSK

- Doesn't use function VPC settings
- ESM creates an ENI inside each cluster subnet
- Uses subnet/security group settings on target cluster
- Security group rule must grant self inbound/outbound access





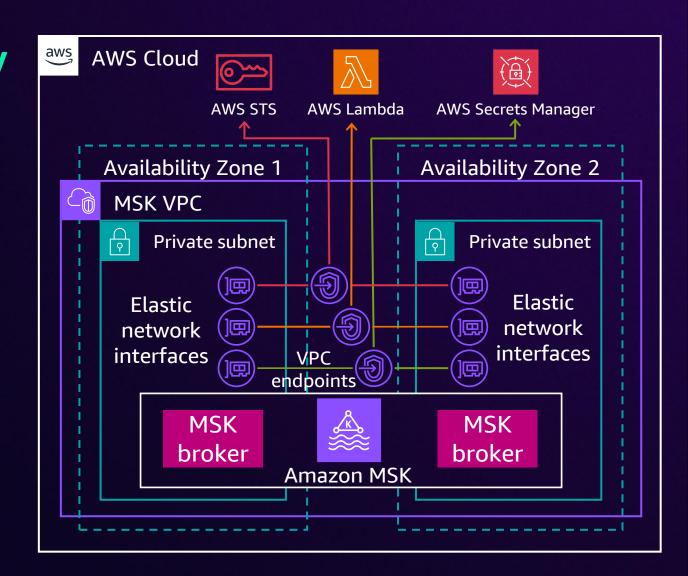
#### Amazon MSK networking: VPC outbound

#### MSK VPC outbound connectivity

**On-Demand** 

#### **VPC** endpoint option

- MSK VPC requires outbound connectivity to
  - AWS Lambda
  - AWS Security Token Service (AWS STS)
  - AWS Secrets Manager



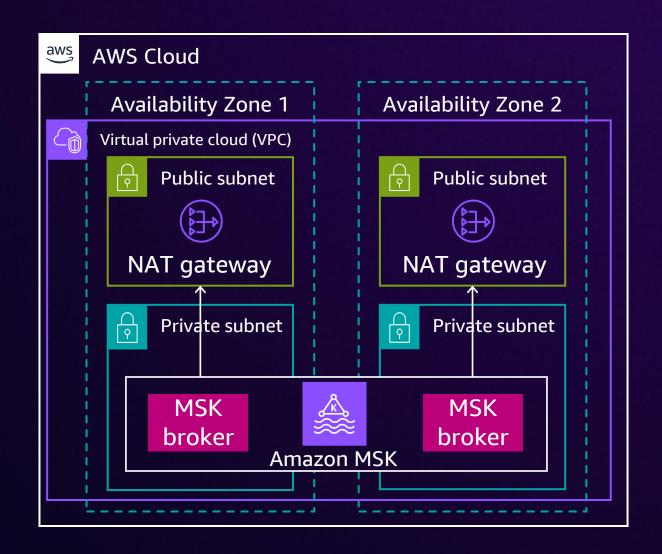


#### Amazon MSK networking: VPC outbound

# MSK VPC outbound connectivity On-Demand

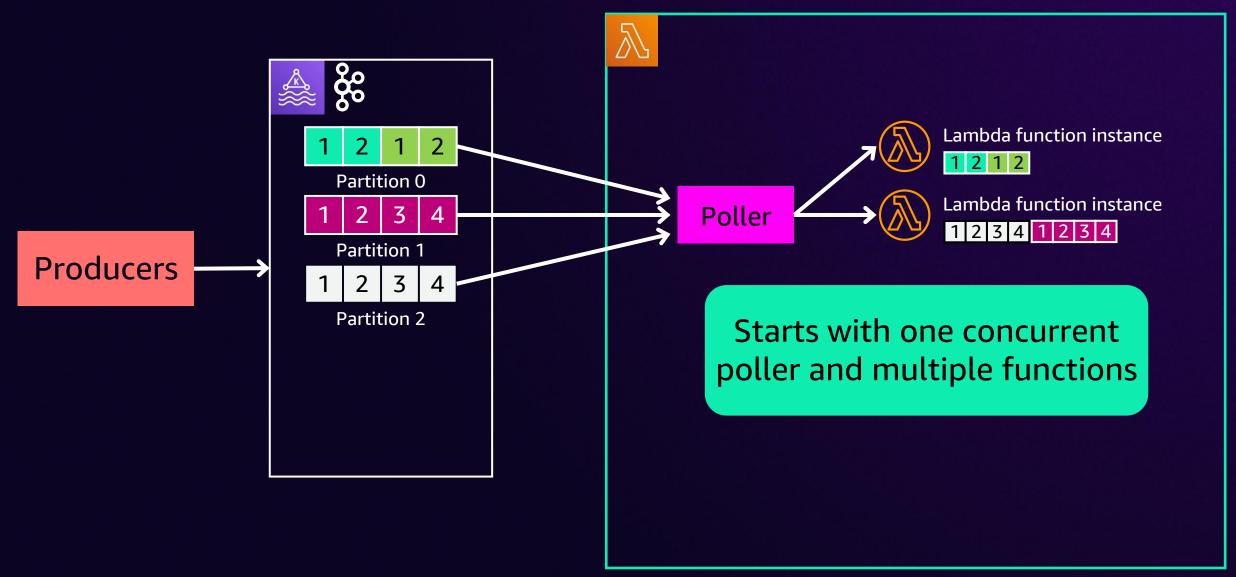
#### **NAT** gateway option

- MSK VPC requires outbound connectivity to
  - AWS Lambda
  - AWS STS
  - AWS Secrets Manager



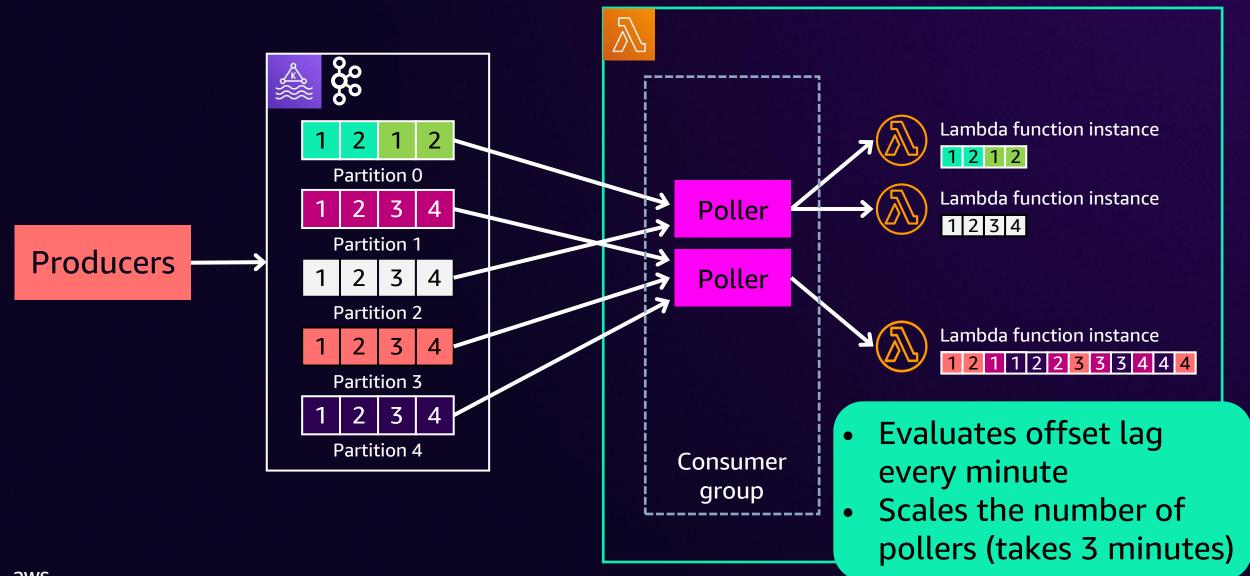


### Amazon MSK to Lambda: Scaling

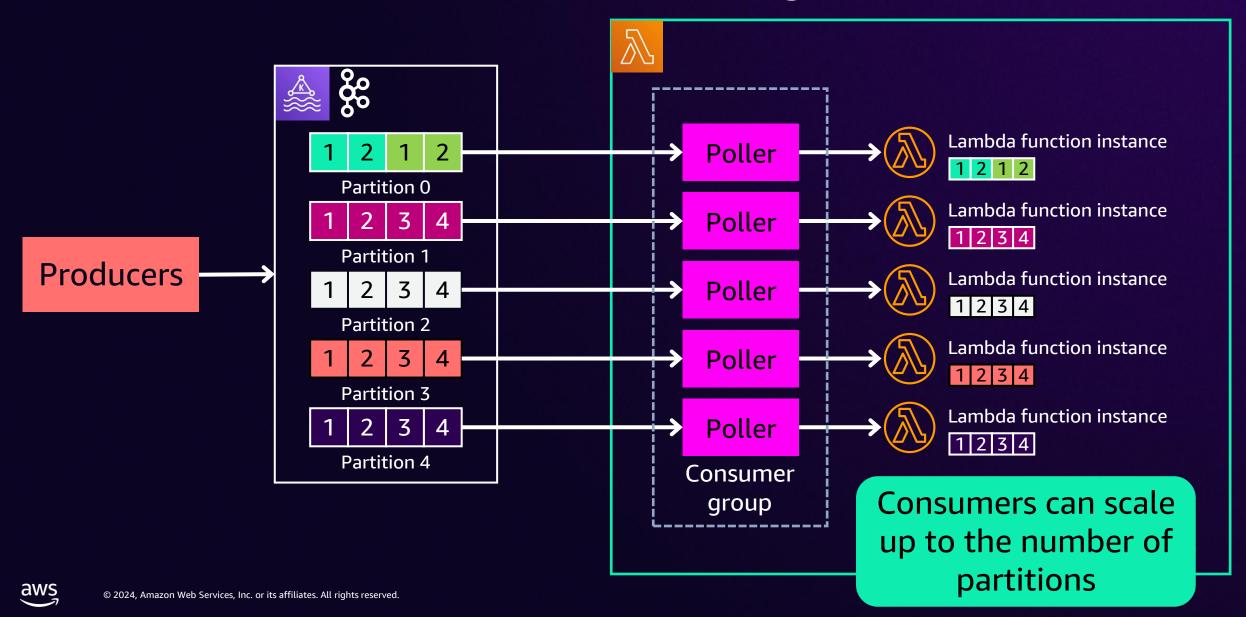




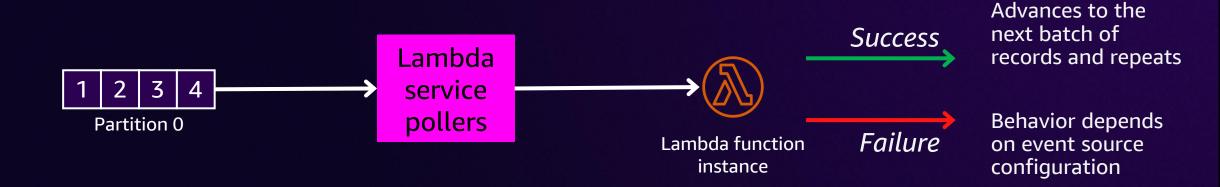
### **Amazon MSK to Lambda: Scaling**



### **Amazon MSK to Lambda: Scaling**



#### **Partition processing**



#### **Default settings**

- Invokes the function with the same batch of records
- Repeat until it succeeds or the records age out of the stream

#### **Failure destination**

- Send batch to the configured failure destination
  - SQS/SNS: metadata
  - S3: invocation record
- If no failure destination is configured, they are discarded



#### New Lambda and Kafka features: 2023-2024

- Scaling
  - Faster scale-up and slower scale-down
  - Provisioned Mode
- Availability
  - On-failure destinations for Kafka ESMs
- Configuration
  - Starting position timestamp for Kafka
  - ESM filtering enhancements and filter criteria encryption
  - Cross account support for MSK
  - Provisioned Mode simplified networking



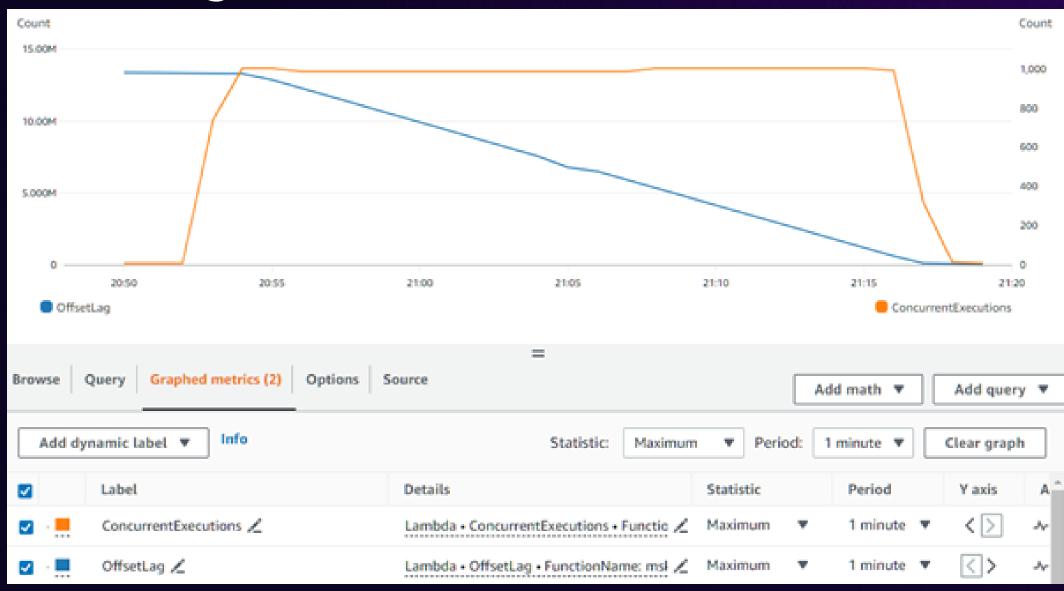




## Managing performance



### Kafka scaling





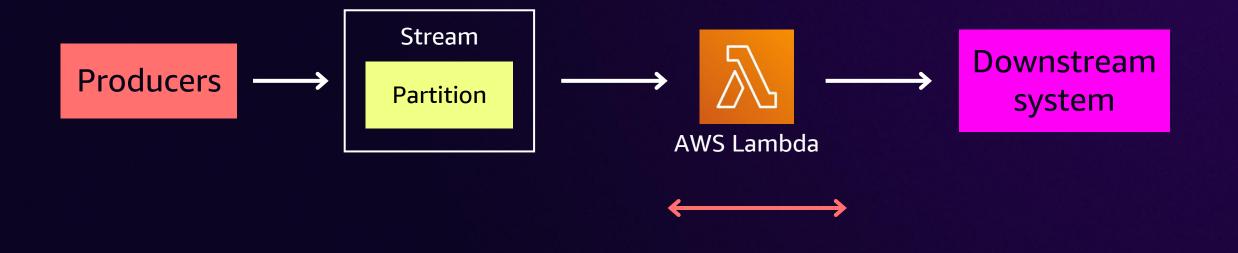
#### **Provisioned Mode**



- Provision event pollers in advance to handle sudden spikes in traffic
- For applications with stringent performance requirements
- Controls to optimize throughput (up to 5 MB/s throughput)
  - minimum event pollers (1-200)
  - maximum event pollers (1-2000)
- Billing unit: Event Poller Unit (EPU) 20 MB/s of throughput
- No longer required to configure AWS PrivateLink or NAT gateway



## Measuring performance



**Individual Lambda function** 

### Measuring performance



**End-to-end testing** 



### Measuring performance: Understand the baseline



#### Stream baseline load

- Average records per second
- Average bytes per second

#### Lambda performance baseline

- Time to process a single record
- Time to process average batch size

### Measuring performance: What's changed?



Increase in record volume per partition?

Increase in the size of the records?

Any function errors, throttles?

Duration, invocations, retries all affect performance

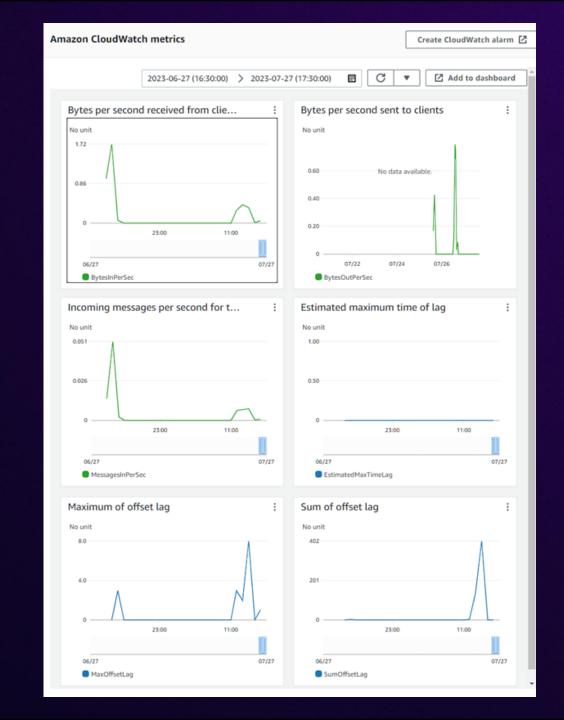


### Kafka metrics/alarms

#### **Amazon CloudWatch metrics**

- Basic/default monitoring
- Enhanced monitoring
  - Per broker/topic/partition
- consumer\_lag
- consumer\_offset

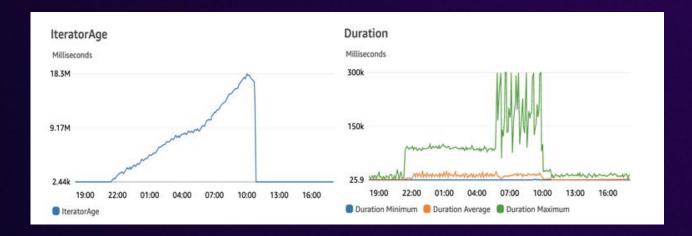
**Open monitoring with Prometheus** 

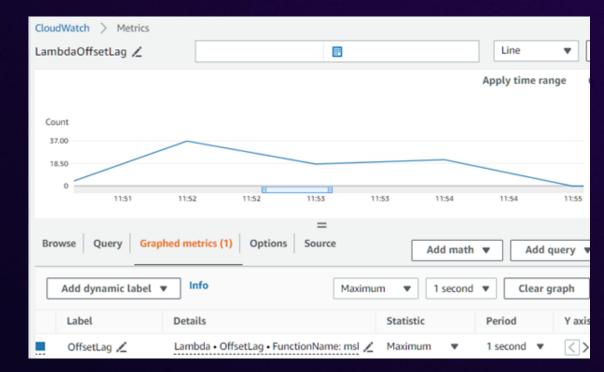


#### Lambda metrics/alarms

#### **Amazon CloudWatch metrics**

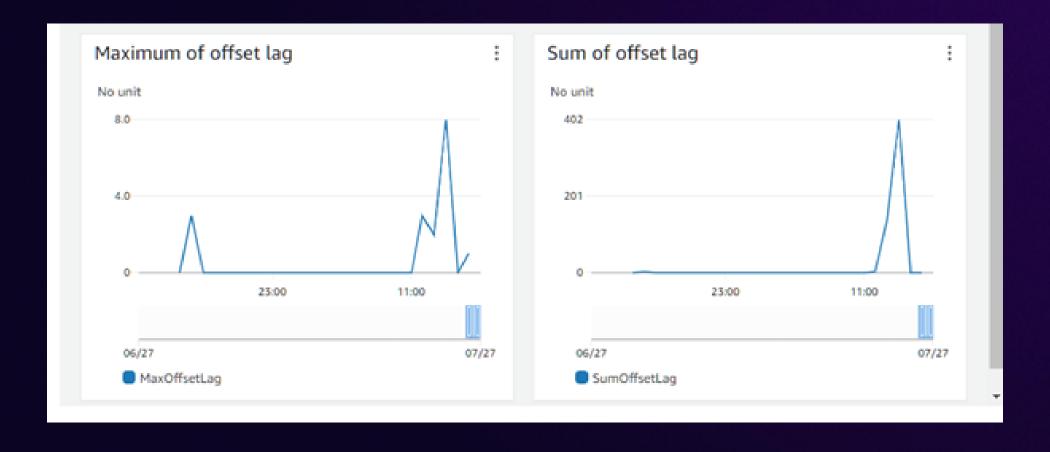
- Invocations
- Duration
- Error count
- Throttles
- Concurrency
- OffsetLag (Kafka)







### Offset lag growing





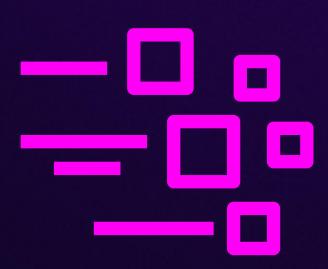
### Increasing processing throughput: Lambda

- Use filtering
- Increase the function memory allocation
- Optimize your function code
- Increase the batch size
- Gracefully handle invocation errors
- Manage your concurrency and throttles



### Increasing processing throughput: Stream

- Evenly distribute records using partition key
- Increase partitions to increase number of Lambda consumers
- Buffer records at the producer side



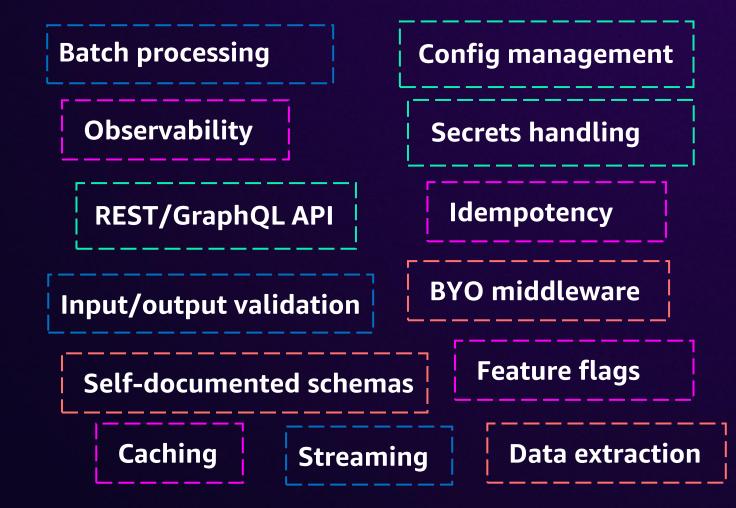


#### Best practices, for everyone

# Powertools for AWS Lambda

Python | TypeScript | Java | .NET





\*feature set may vary across languages



#### Summary

- **01** Understanding data streaming
- **02** Streaming data on AWS
- **03** Streaming architecture
- **04** Processing streaming data
- **05** AWS Lambda and Kafka
- **Managing performance**

#### Resources



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#### Check out these other sessions

#### API309: Building EDAs with Apache Kafka and Amazon EventBridge

• Chalk talk: Wednesday, Dec. 4 at 8:30 AM | Caesars Forum, Level 1, Academy 416

#### SVS216-R: Serverless data processing with AWS Lambda and Apache Kafka

- Builders' sessions:
  - Monday, Dec. 2 at 11:30 AM | Caesars Forum, Level 1, Summit 232
  - Monday, Dec. 2 at 2:30 PM | Caesars Forum, Level 1, Summit 232
  - Wednesday, Dec. 4 at 8:30 AM | Mandalay Bay, Level 2 South, Surf B

#### **SVS406: Scale streaming workloads with AWS Lambda**

• Chalk talk: Thursday, Dec. 5 at 4:00 PM | MGM Grand, Level 3, Premier 309

#### **SVS401:** Best practices for serverless developers

• Breakout session: Monday, Dec. 2 at 3:00 PM | Venetian, Level 3, Lido 3002



### Continue your AWS serverless learning

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Increase your knowledge



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https://s12d.com/serverless-learning



# Thank you!

**Julian Wood** 

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Please complete the session survey in the mobile app

