



# Data Patterns for Successful Applications

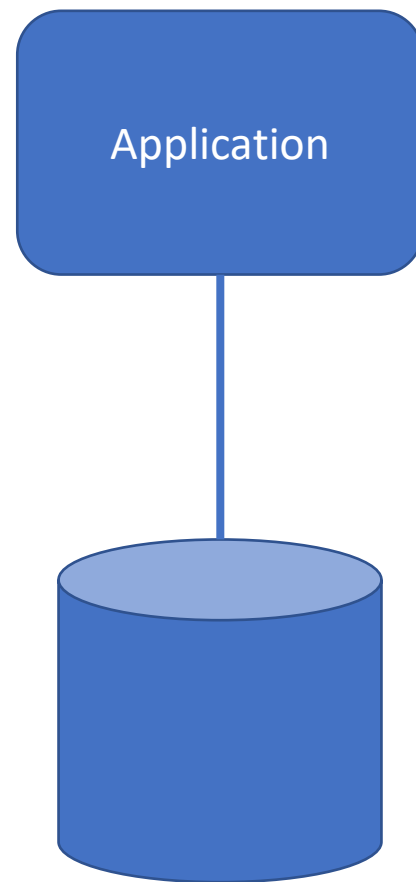
Sean Whitesell

So, what we going to do?

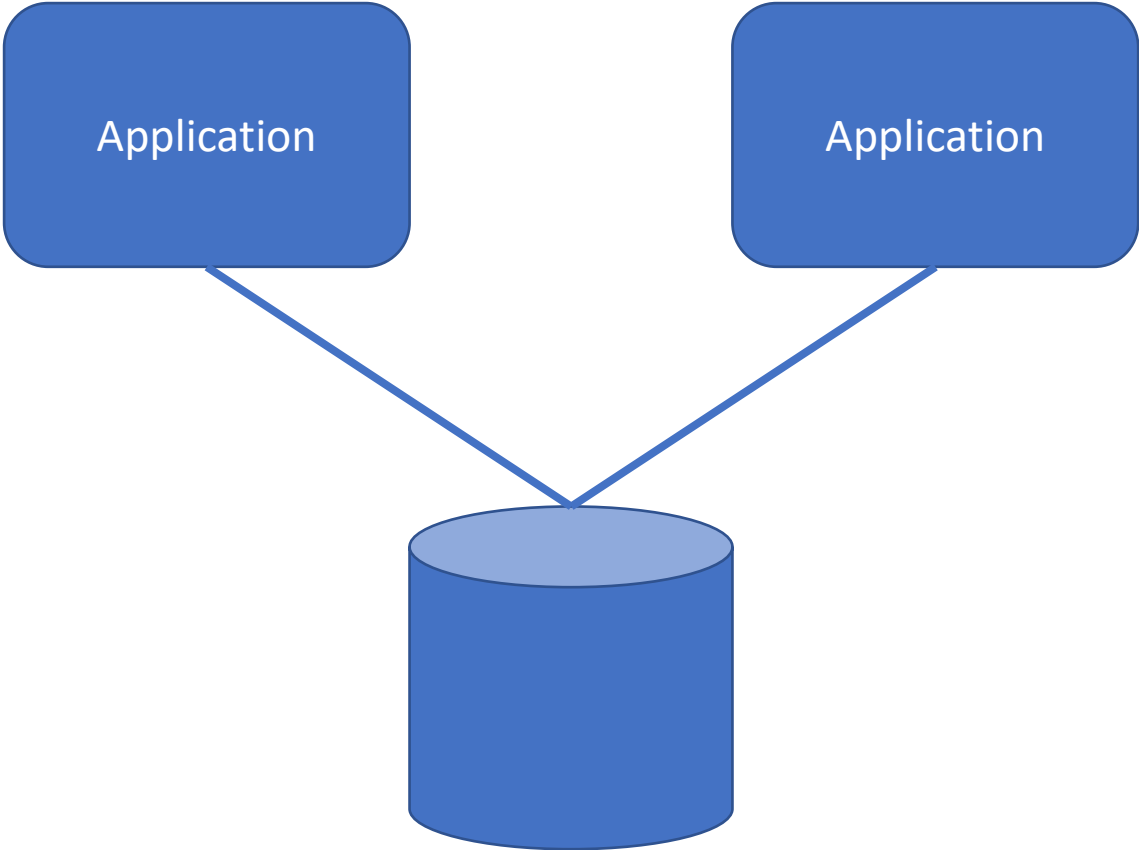
Agenda:

- Common Architecture
- Data Model
- CQS
- CQRS
- Eventual Consistency
- Views
- Event Sourcing
- CQRS + Event Sourcing

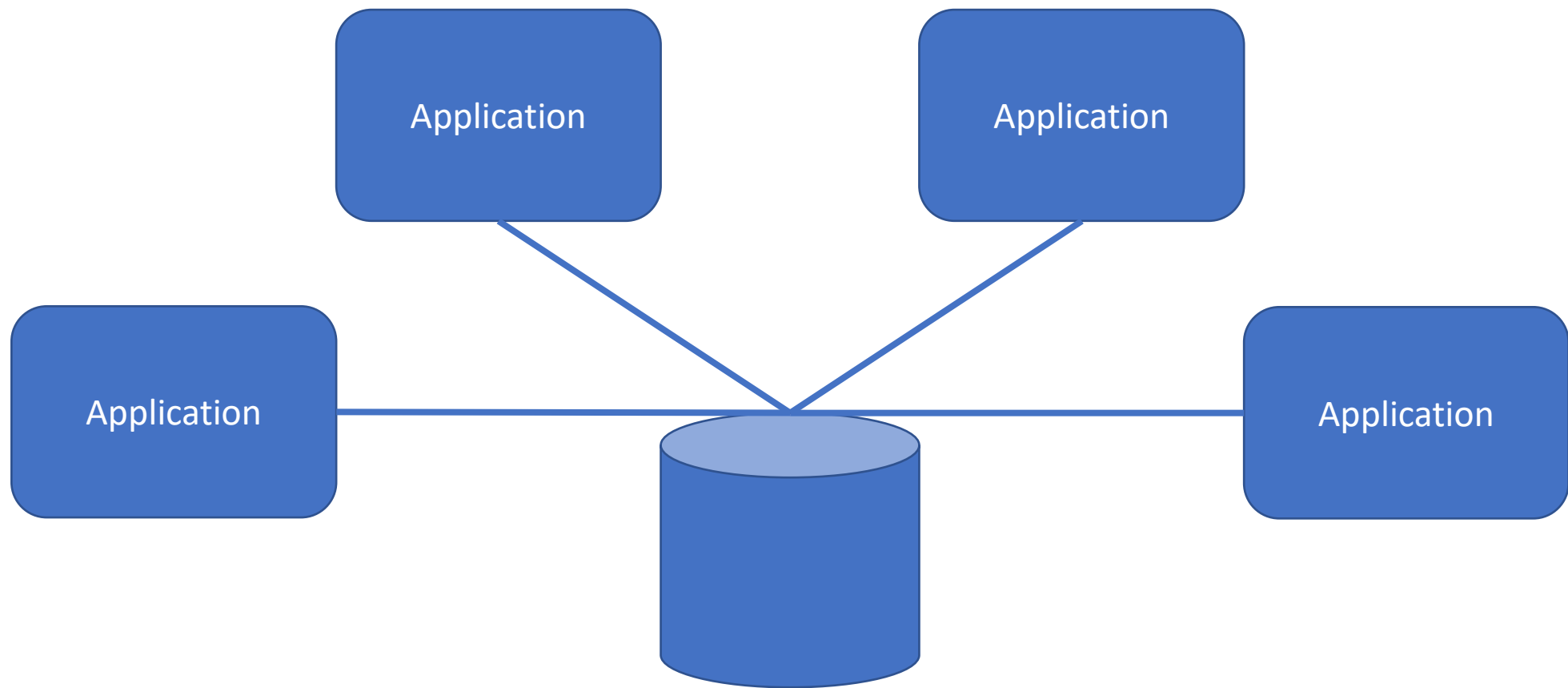
# Common Architecture



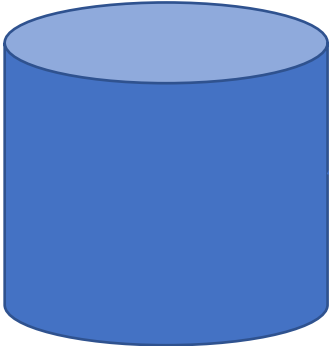
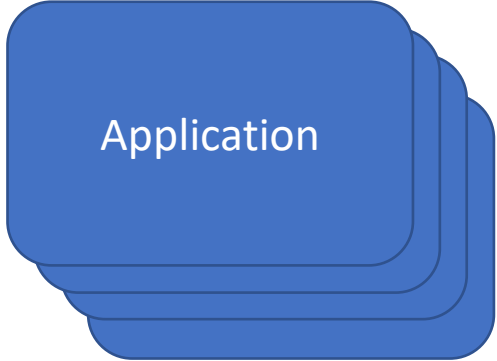
# Common Architecture



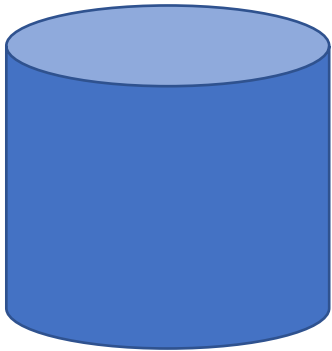
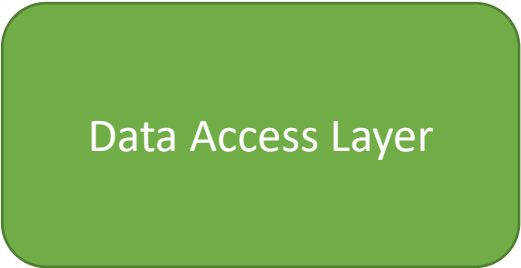
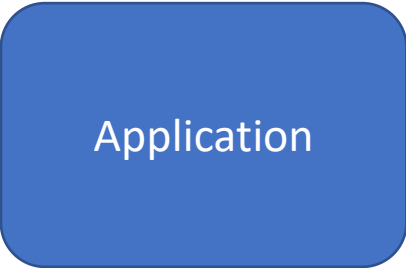
# Common Architecture



# Common Architecture



# Common Architecture



Could be inside the app or in a DLL/package.



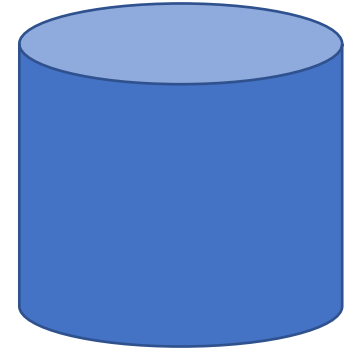
## Common Architecture

Application

```
public class InsuranceClaim
{
    public void CreateInsuranceClaim( ClaimInfo information )

    public ClaimInfo GetInsuranceClaimInfoById( int id )
}

public class ClaimInfo
{
}
```



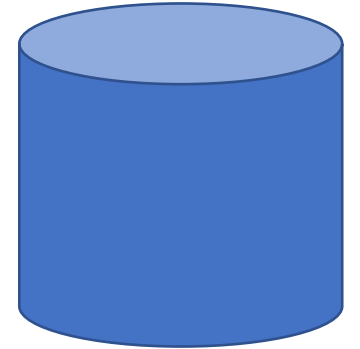
## Common Architecture

Application

```
public class InsuranceClaim
{
    PayInsuranceClaim( ClaimInfo information )
    ApproveInsuranceClaim( ClaimInfo information )
    RejectInsuranceClaim( ClaimInfo information )

    public ClaimInfo GetInsuranceClaimInfoById( int id )
}

public class ClaimInfo
{
}
```



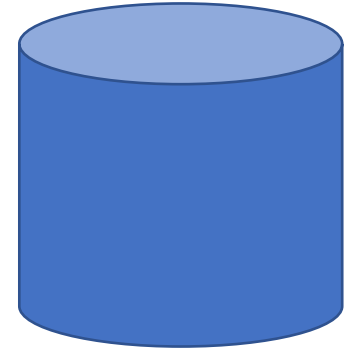
## Common Architecture

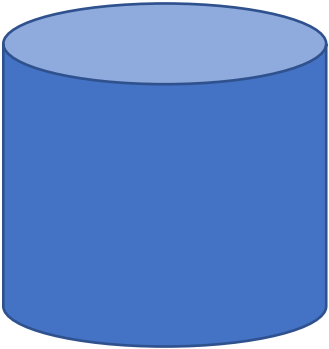
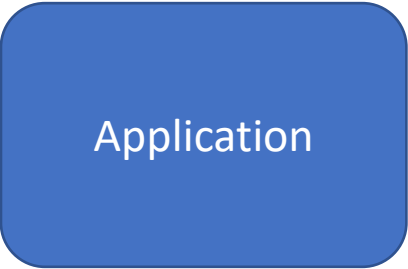
Application

```
public class InsuranceClaim
{
    PayInsuranceClaim( ClaimInfo information )
    ApproveInsuranceClaim( ClaimInfo information )
    RejectInsuranceClaim( ClaimInfo information )

    public ClaimInfo GetInsuranceClaimInfoById( int id )
}

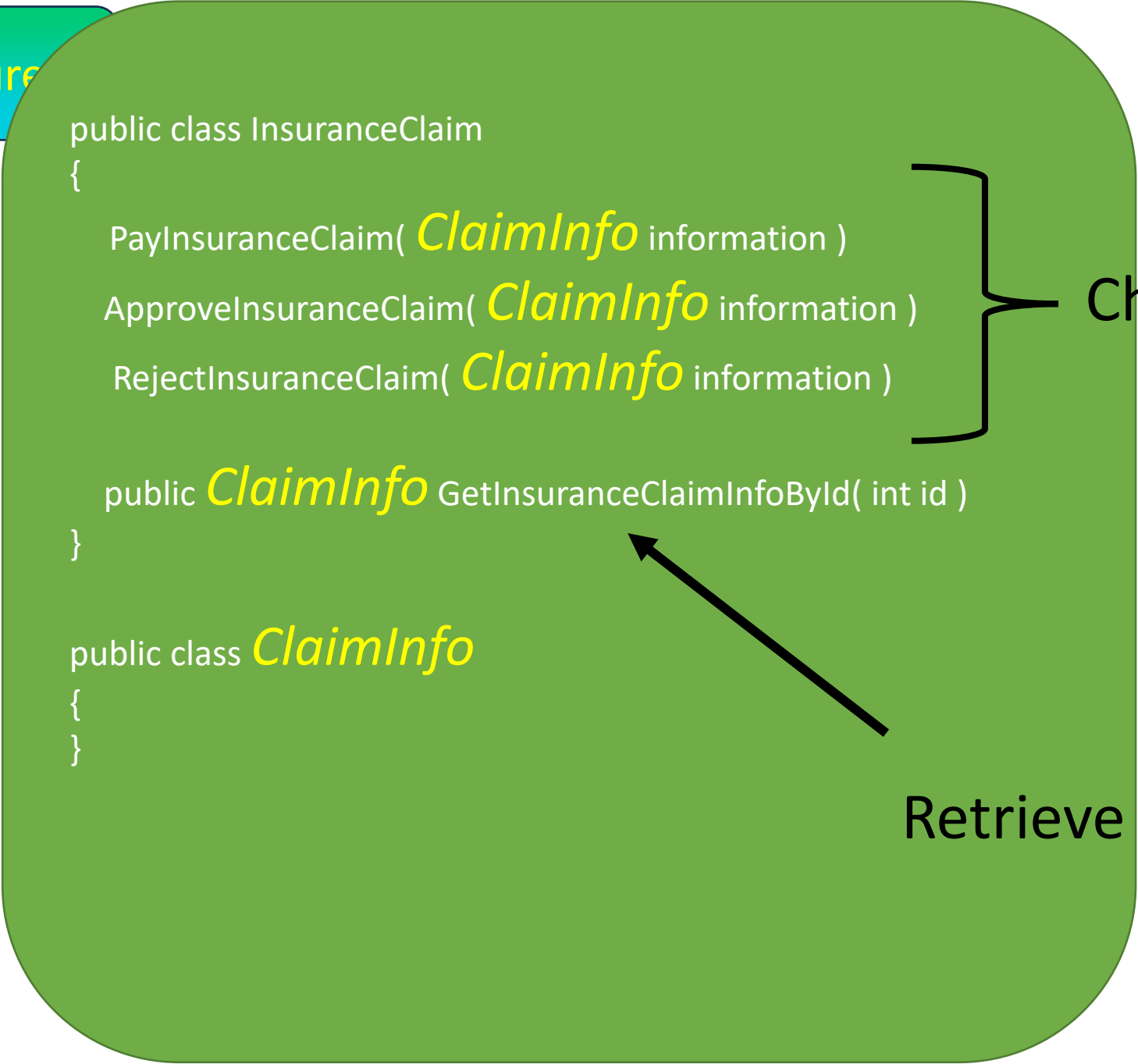
public class ClaimInfo
{
}
```



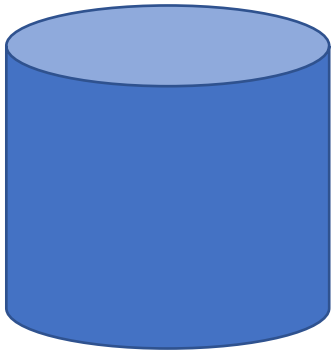


# Common Architecture

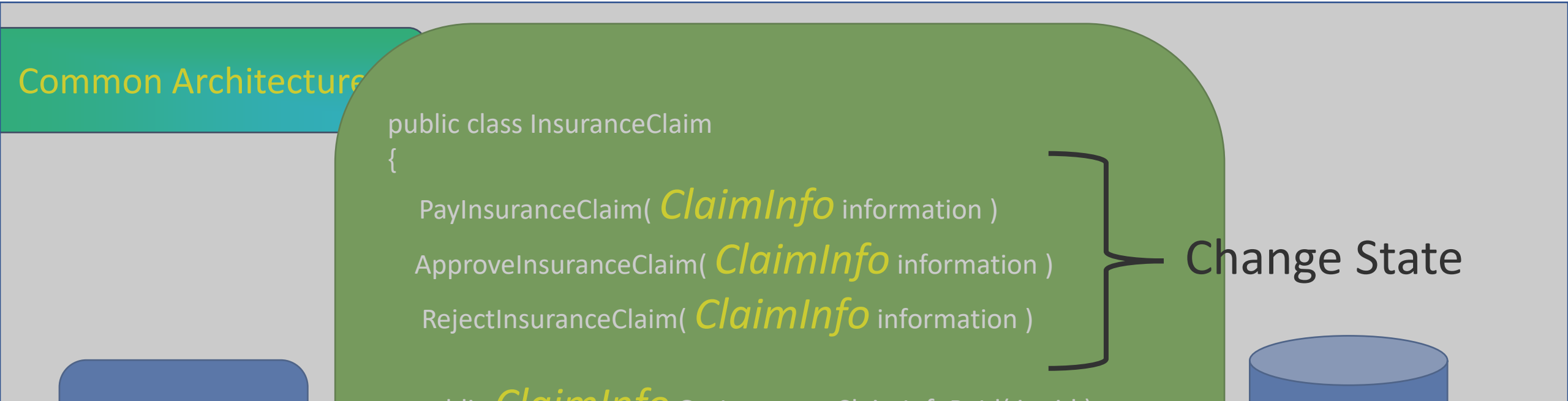
Application



Change State



Retrieve State



CQS

Command – Query – Separation



## Common Architecture

```
public class InsuranceClaim  
{
```

```
    PayInsuranceClaim( ClaimInfo information )
```

```
    ApproveInsuranceClaim( ClaimInfo information )
```

```
    RejectInsuranceClaim( ClaimInfo information )
```

} Change State

CQS

Command – Query – Separation

*Retrieving data should not cause data to be changed.*

```
public class InsuranceClaim  
{
```

```
    PayInsuranceClaim( ClaimInfo information )
```

```
    ApproveInsuranceClaim( ClaimInfo information )
```

```
    RejectInsuranceClaim( ClaimInfo information )
```

But I'm already doing that!

Change State

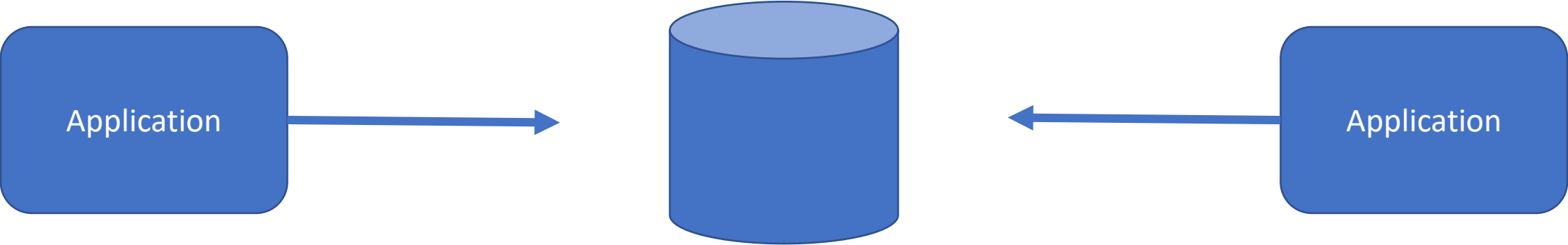
CQS

Command – Query – Separation

*Retrieving data should not cause data to be changed.*



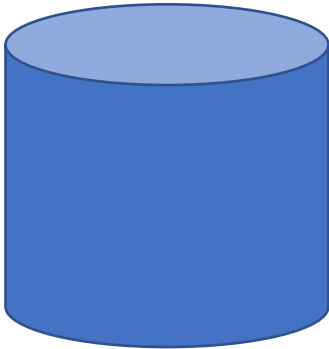
# Common Architecture



# Common Architecture

Data Access Layer

Application



Application

## Pain Points

Data Access Layer

Application

Application

## Pain Points

Data Access Layer

Application

Application

### 1. Code change contention

## Pain Points

Data Access Layer

Application

Application

1. Code change contention
2. Performance differences

## Pain Points

Data Access Layer

Application

Application

1. Code change contention
2. Performance differences
3. Unclear schema ownership

## Pain Points

Data Access Layer

Application

Application

1. Code change contention
2. Performance differences
3. Unclear schema ownership
4. May need to consider duplicating code to allow apps to evolve independently

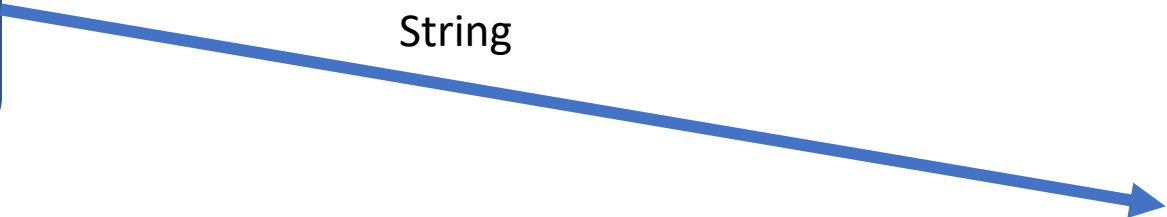
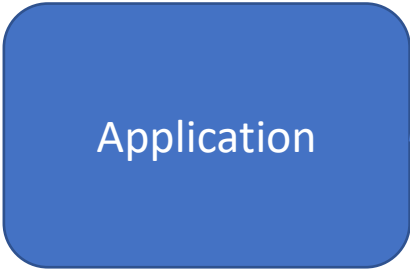
Application

String

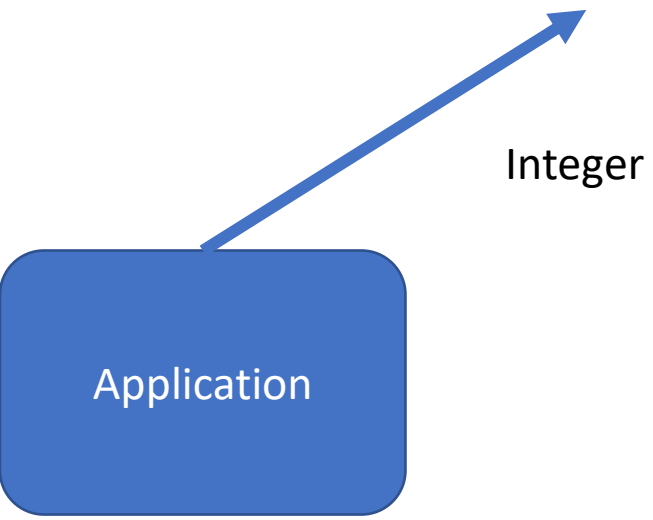
Pain Points

							ProcessingCode





							ProcessingCode



Application

Pain Points

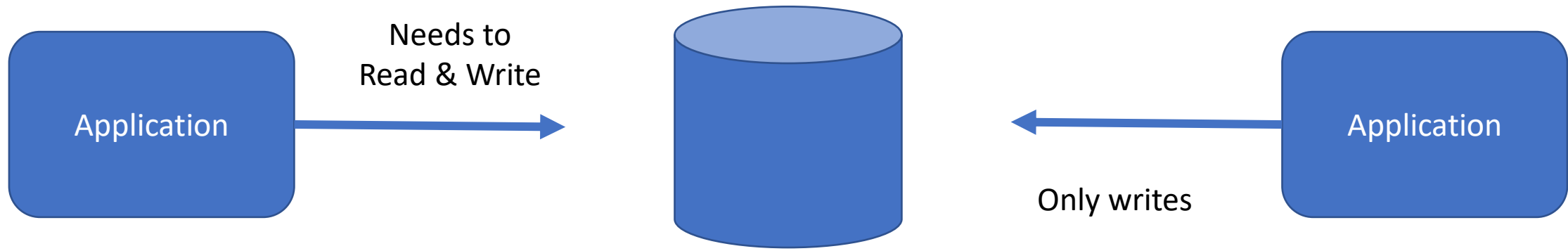
Index 1

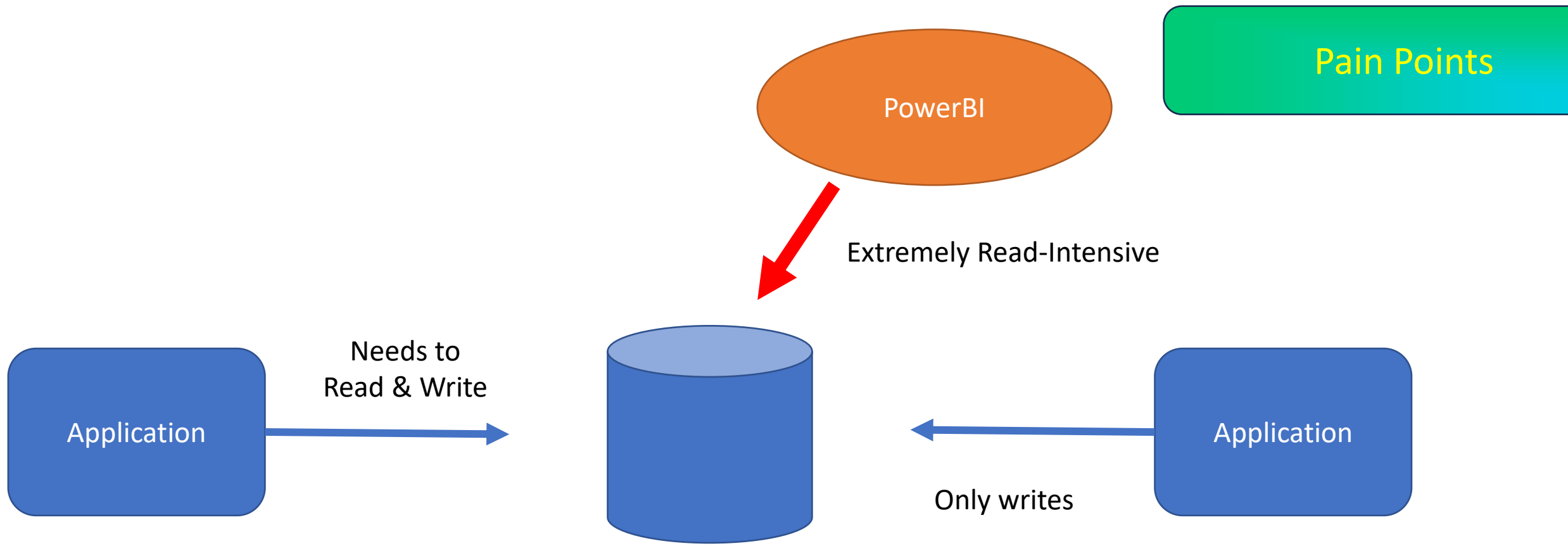
Index 2

Index 3

Index 4

## Pain Points

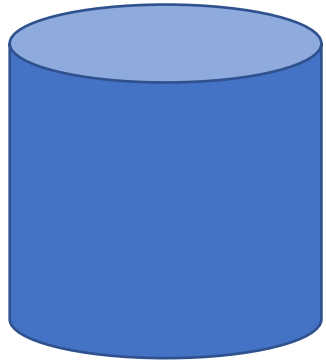




What is this “Data Store” of which you speak?

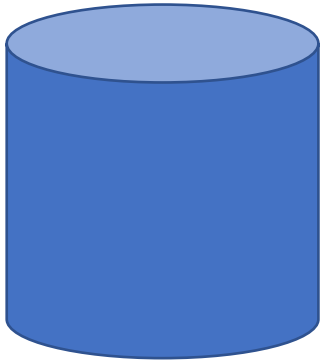
A database is a data store. But a data store is not necessarily a database.

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A database has an “engine” that maintains data integrity among many other functions.

A database is a data store. But a data store is not necessarily a database.

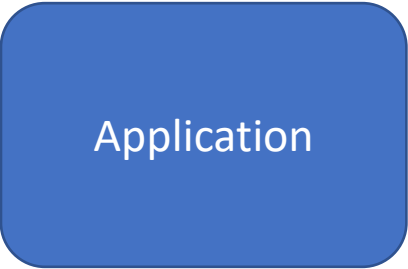


A database has an “engine” that maintains data integrity among many other functions.

A data store could be a database but could also be a File, Excel File, Azure File Share, Azure Table Storage, Azure Blob Account, AWS S3 Bucket, .....

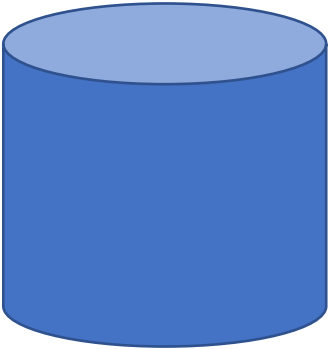






*ClaimInfo*

- Id
- Carrier Id
- Policy Id
- Claimant Info
- Claim Date
- Loss Date
- Loss Description
- Claim Status
- Claim Type
- Claim Amount
- Supporting Documents
- Investigation Details
- Payments
- Resolution Details
- Create Date
- Create User
- Update Date
- Update User



## *ClaimInfoDetails*

Id

Carrier Id

Policy Id

Claimant Info

Claim Date

Loss Date

Loss Description

Claim Status

Claim Type

Claim Amount

Supporting Documents

Investigation Details

Payments

Resolution Details

Create Date

Create User

Update Date

Update User

## *NewClaimInfo*

Id

Carrier Id

Policy Id

Claimant Info

Claim Date

Loss Date

Loss Description

Claim Status

Claim Type

Claim Amount

~~Supporting Documents~~

~~Investigation Details~~

~~Payments~~

~~Resolution Details~~

Create Date

Create User

~~Update Date~~

~~Update User~~

## *NewClaimInfo*

Id  
Carrier Id  
Policy Id  
Claimant Info  
Claim Date  
Loss Date  
Loss Description  
Claim Status  
Claim Type  
Claim Amount  
Create Date  
Create User

## *AddClaimInfoDocs*

Id  
Policy Id  
Supporting Documents  
Create Date  
Create User

## *AmendClaimInvestigationDetail*

Claim Id  
Investigation Id  
Investigation Detail

## *AddClaimPayment*

Id  
Policy Id  
Payment Detail  
Payment Amount  
Create Date  
Create User

### *NewClaimInfo*

Id  
Carrier Id  
Policy Id  
Claimant Info  
Claim Date  
Loss Date  
Loss Description  
Claim Status

### *AddClaimInfoDocs*

Id  
Policy Id  
Supporting Documents  
Create Date  
Create User

### *AmendClaimInvestigationDetail*

Claim Id  
Investigation Id  
Investigation Detail

## Write Models

Create Date  
Create User

Policy Id  
Payment Detail  
Payment Amount  
Create Date  
Create User

## *ClaimInfoDetails*

Id

Carrier Id

Policy Id

Claimant Info

Claim Date

Loss Date

Loss Description

Claim Status

Claim Type

Claim Amount

Supporting Documents

Investigation Details

Payments

Resolution Details

Create Date

Create User

Update Date

Update User

## *ClaimInfoDetails*

Id  
Carrier Id  
Policy Id  
Claimant Info  
Claim Date  
Loss Date  
Loss Description  
Claim Status  
Claim Type  
Claim Amount  
Supporting Documents  
Investigation Details  
Payments  
Resolution Details  
Create Date  
Create User  
Update Date  
Update User

## *ClaimSupportDocs*

Id  
Carrier Id  
Policy Id  
Supporting Documents

## *ClaimStatusHistory*

Id  
Policy Id  
Claim Status

## *ClaimResolutionDetails*

Id  
Policy Id  
ResolutionDetails

## *ClaimAppliedPmts*

Id  
Carrier Id  
Policy Id  
Payment Details  
Payment Amount

## *ClaimInvestigationDetails*

Id  
Policy Id  
Investigation Details

### *ClaimInfoDetails*

Id  
Carrier Id  
Policy Id  
Claimant Info  
Claim Date  
Loss Date  
Loss Description  
Claim Status

### *ClaimSupportDocs*

Id  
Carrier Id  
Policy Id  
Supporting Documents

### *ClaimStatusHistory*

Id  
Policy Id  
Claim Status

### *ClaimResolutionDetails*

Id

### *ClaimAppliedPmts*

## Read Models

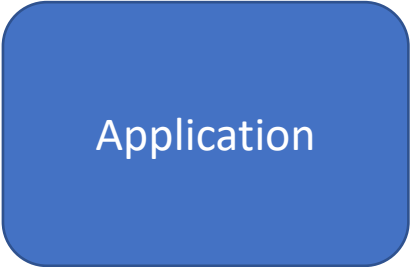
Supporting Documents  
Investigation Details  
Payments  
Resolution Details  
Create Date  
Create User  
Update Date  
Update User

Policy Id  
Payment Details  
Payment Amount

### *ClaimInvestigationDetails*

Id  
Policy Id  
Investigation Details



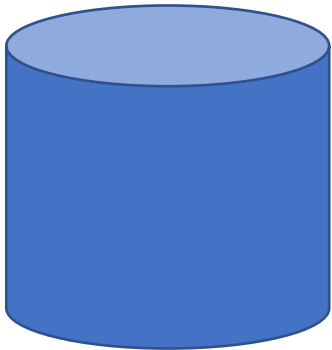


Application



Write Models

Changes data



Read Models

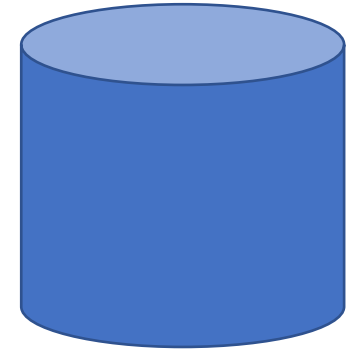
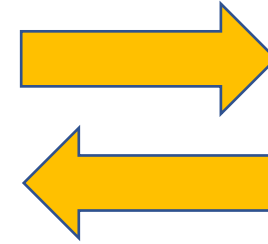
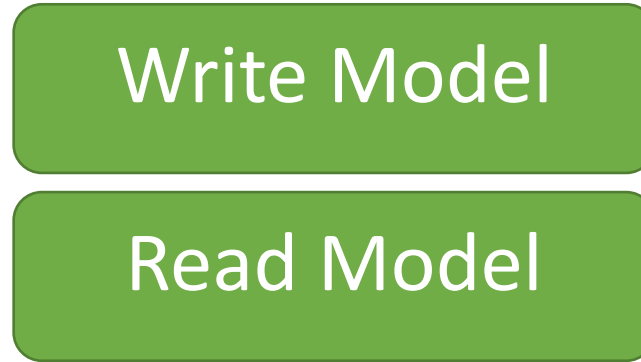
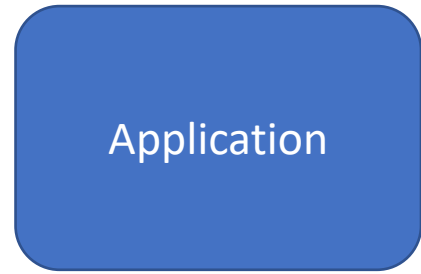
Does ***not*** change data

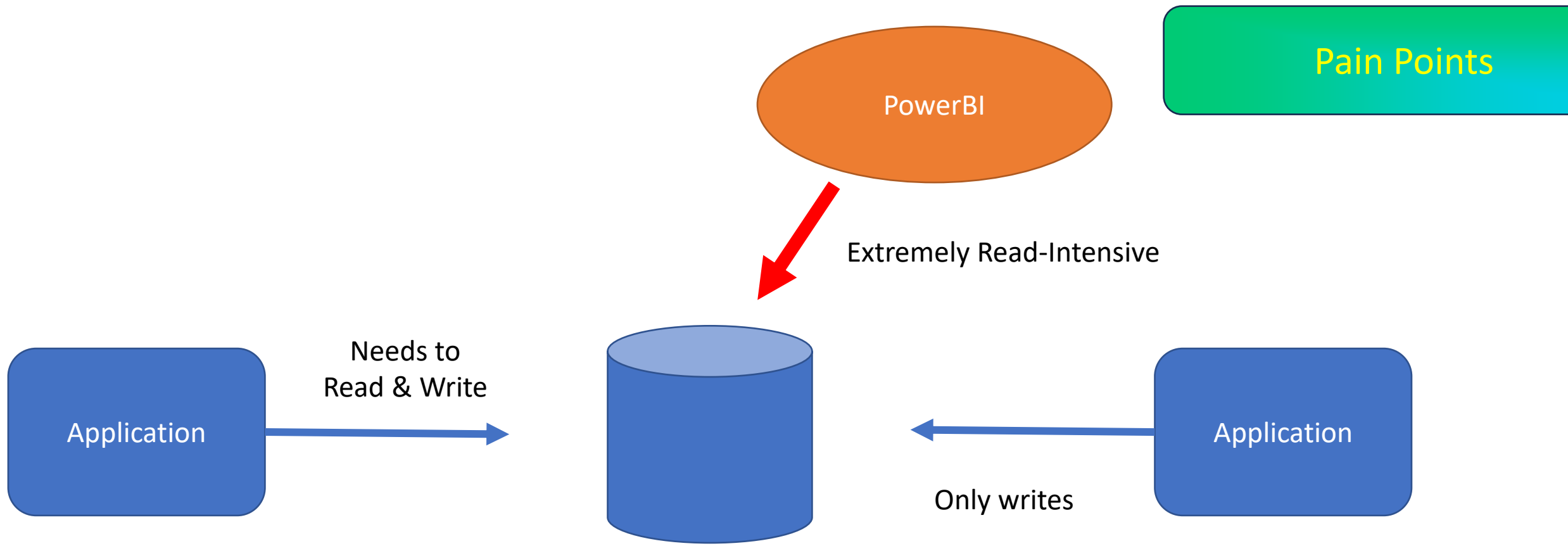


CQRS

Command – Query – Responsibility - Segregation

CQRS





CQRS

\*Does not have to be Write-Only

Application

Write Model

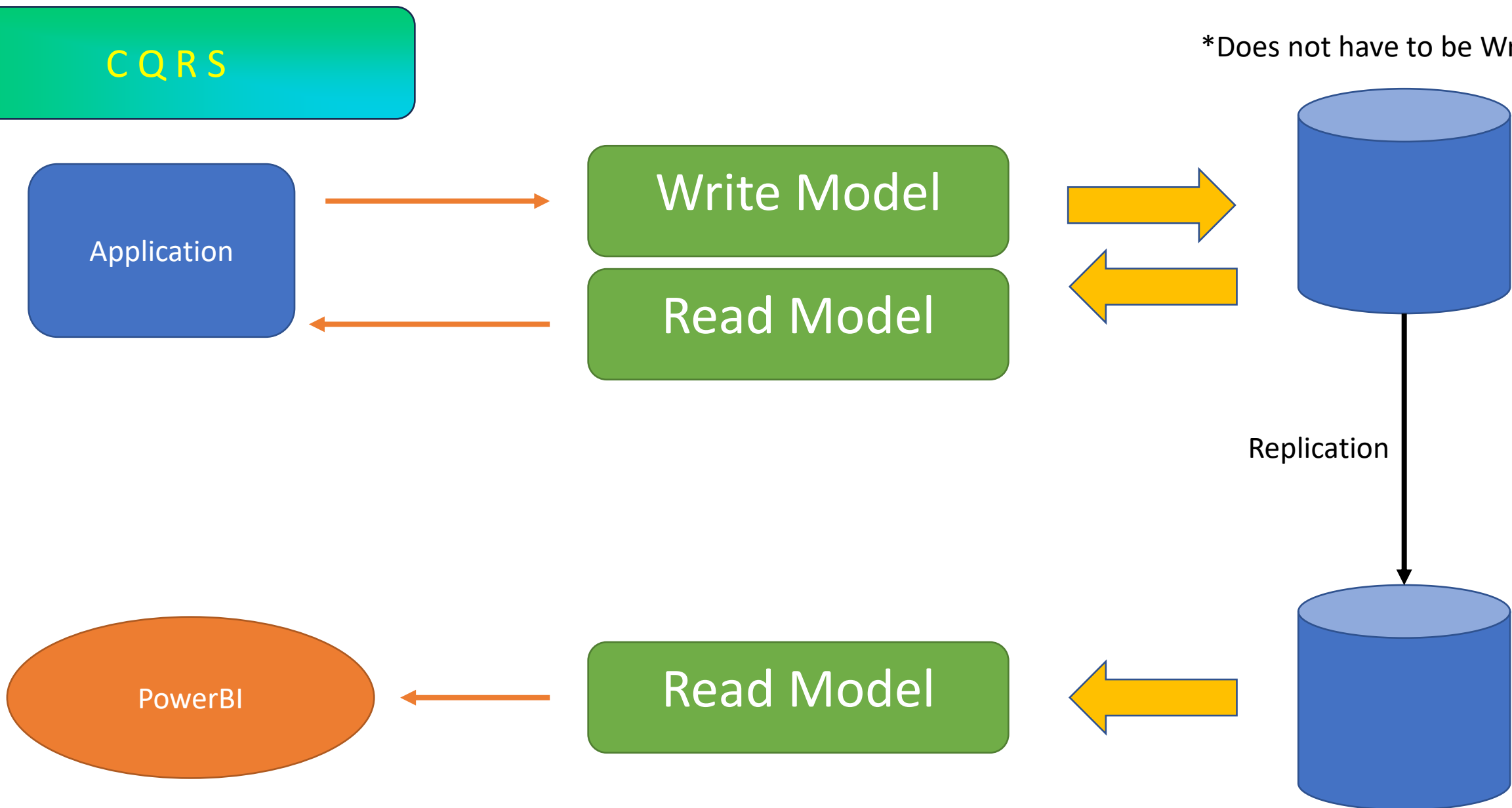
Read Model

PowerBI

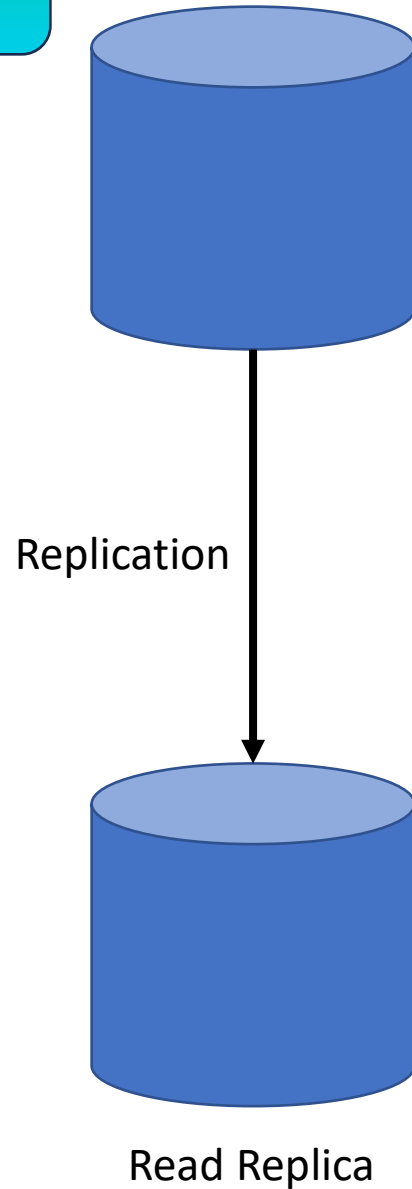
Read Model

Replication

Read Replica



# Replication



MySQL Replication

Postgres – Streaming Replication

SQL Server – Transactional Replication

MongoDB – Replication Sets

Amazon Aurora

CQRS

Application

Write Model

Msg System

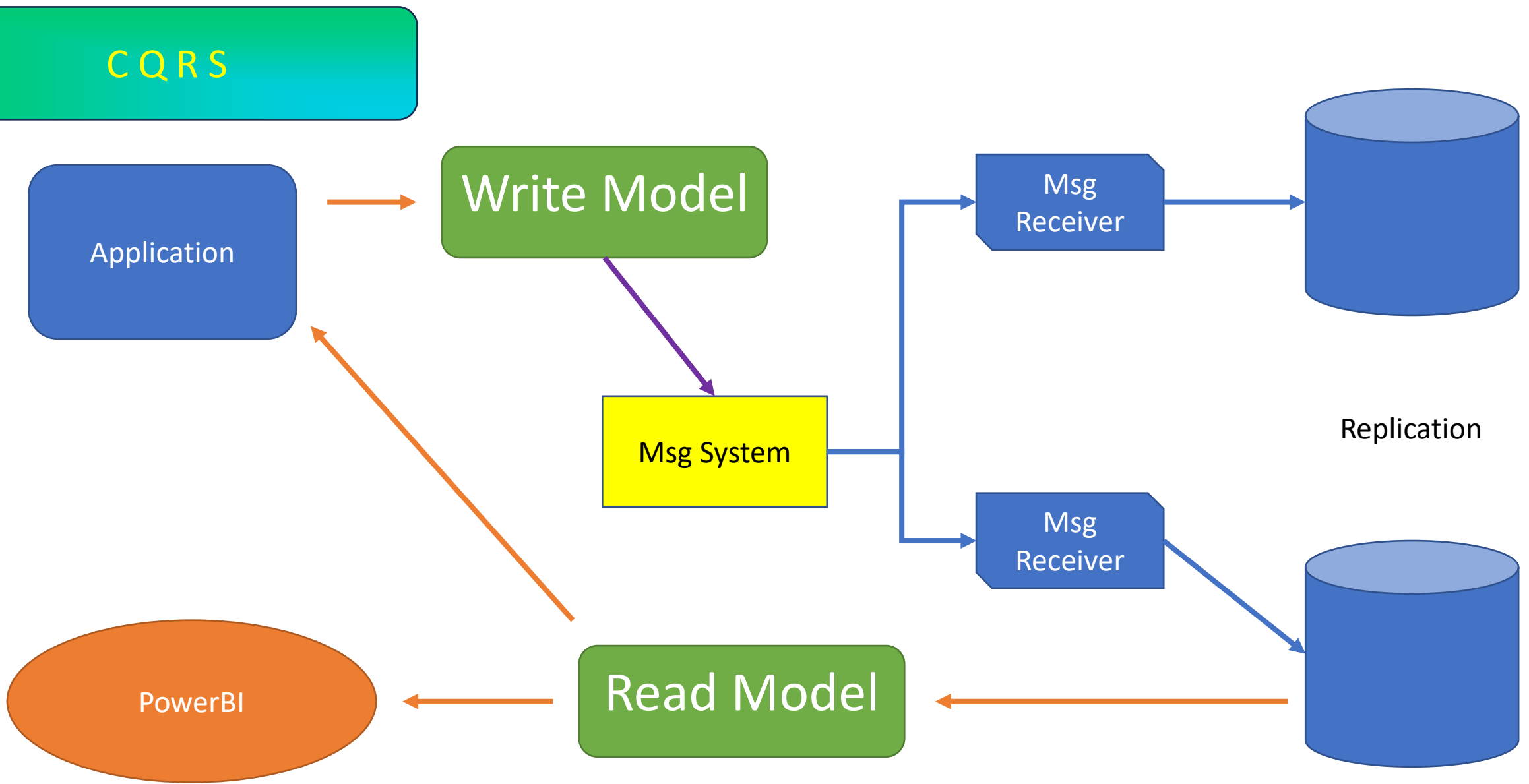
Msg  
Receiver

Replication

Msg  
Receiver

PowerBI

Read Model



CQRS

Application

Write Model

Msg System

Msg  
Receiver

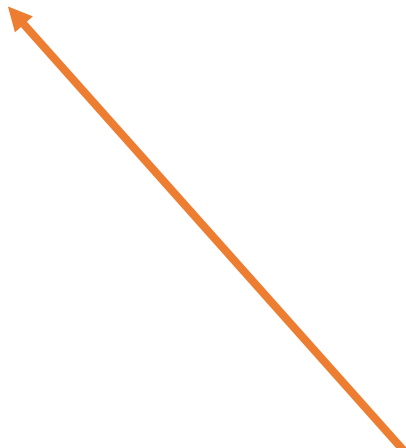
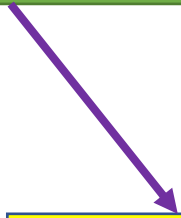
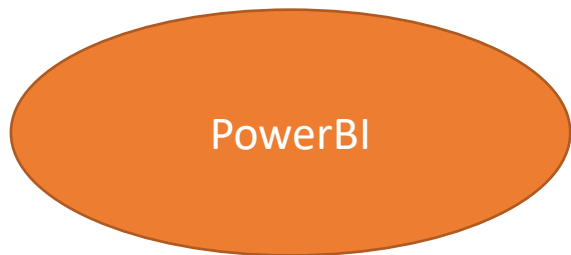
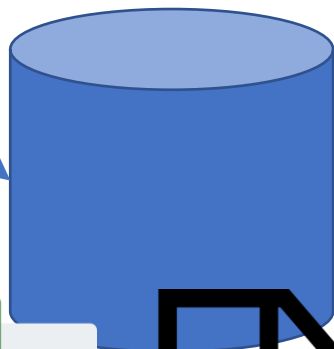
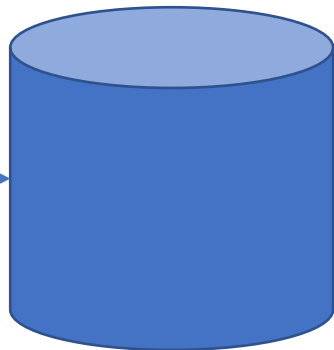
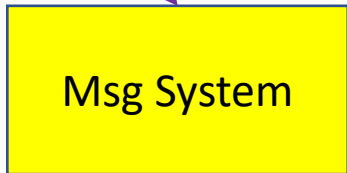
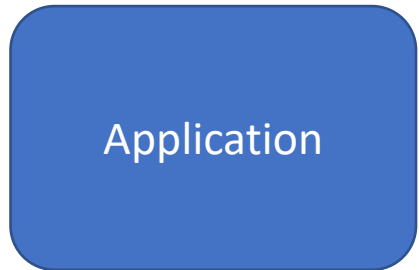
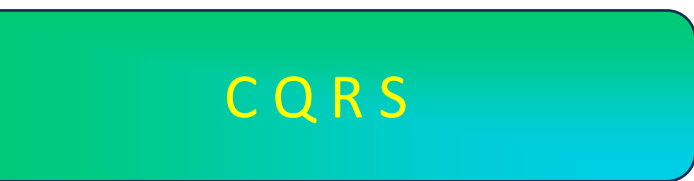
Replication

Msg  
Receiver

PowerBI

Read Model

10  
01





CQRS

Application

Write Model

Msg System

Msg  
Receiver

SQL

Replication

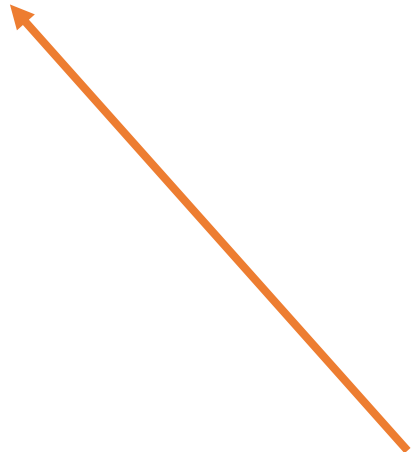
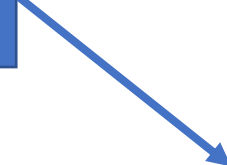
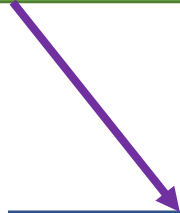
Msg  
Receiver

PowerBI

Read Model



Azure Cosmos DB



CQRS

Application

Write Model

Msg System

Msg Receiver

SQL

Data Delay

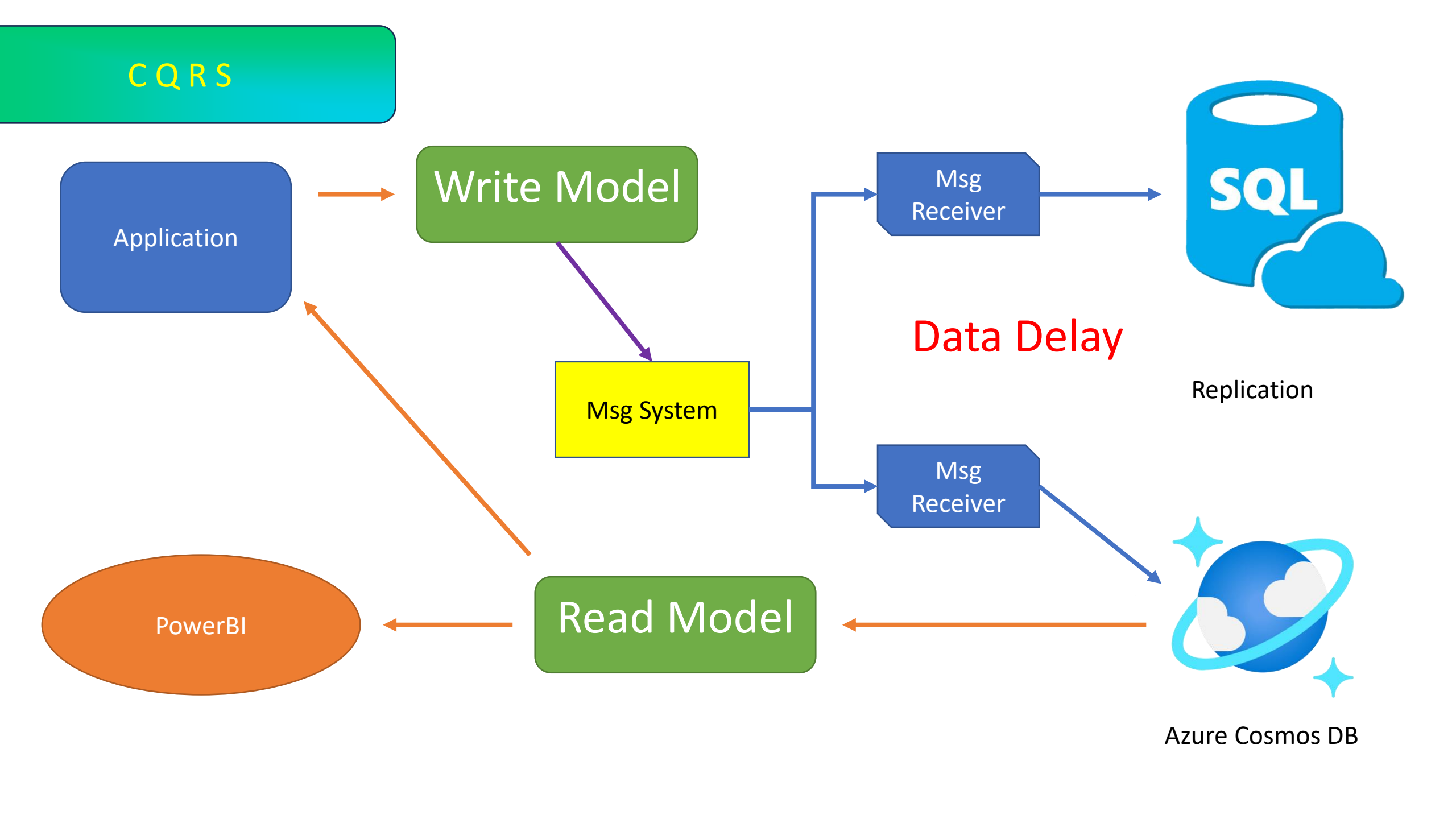
Replication

PowerBI

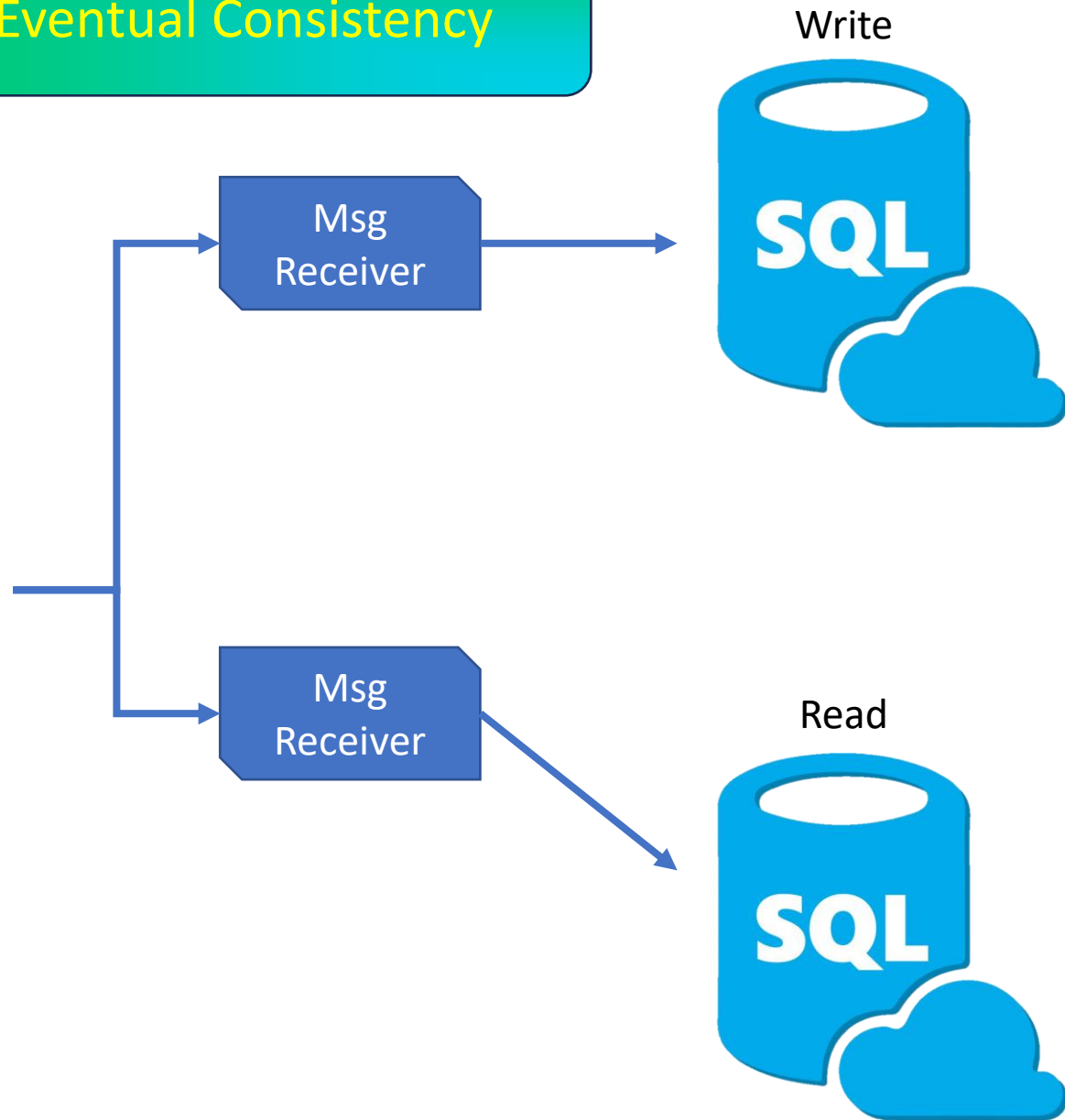
Read Model

Msg Receiver

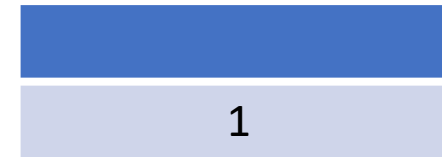
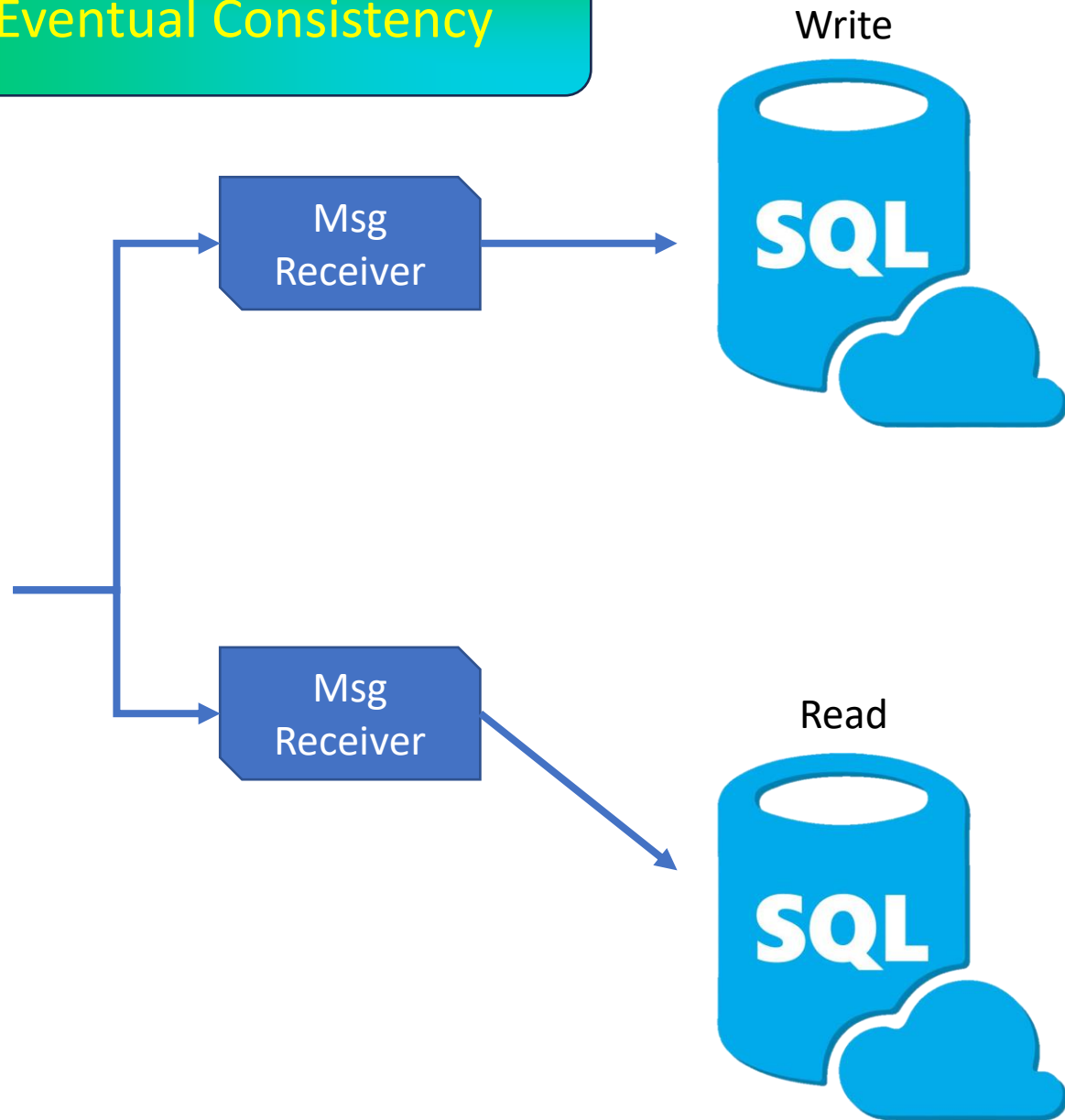
Azure Cosmos DB



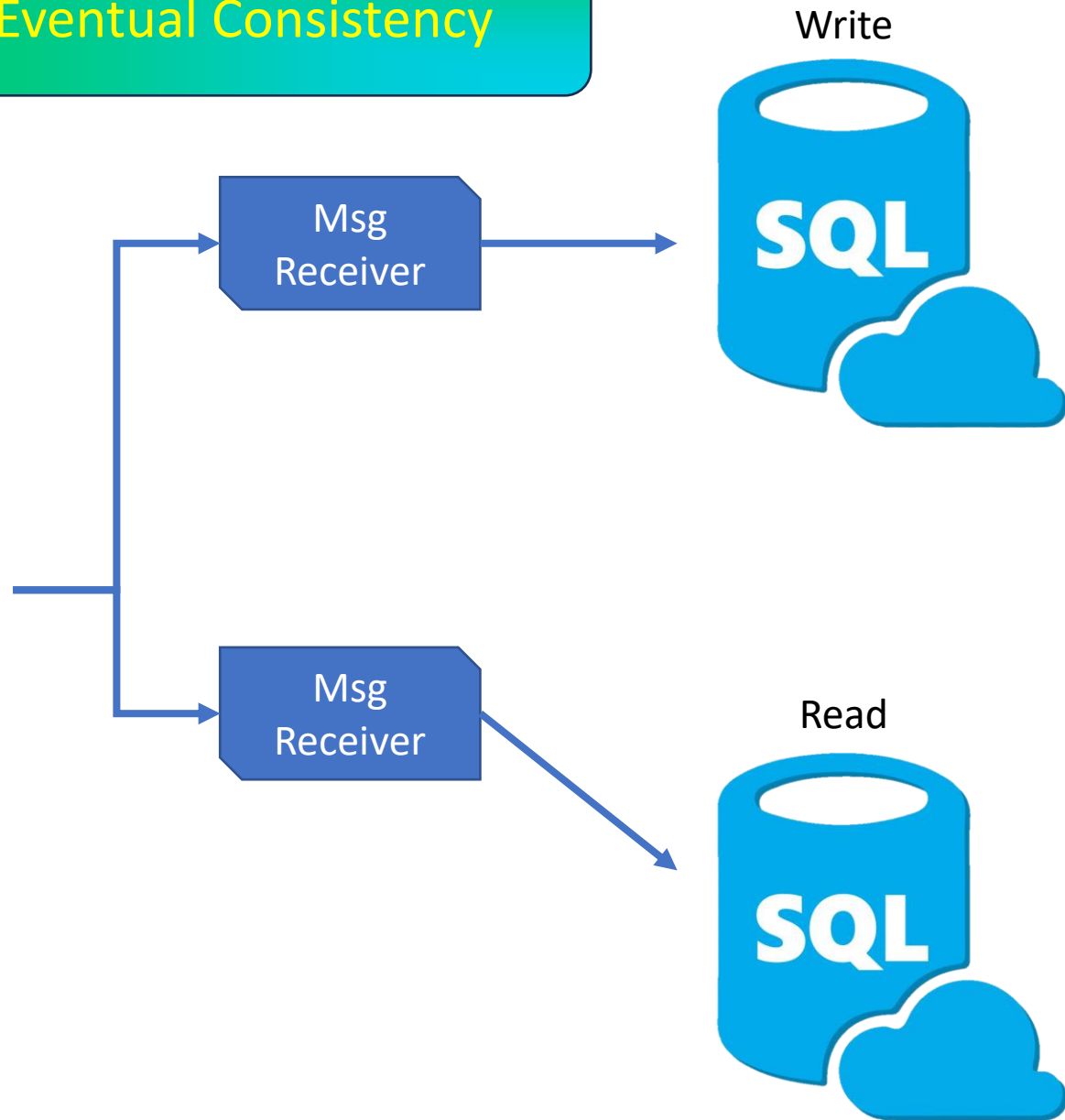
# Eventual Consistency



# Eventual Consistency



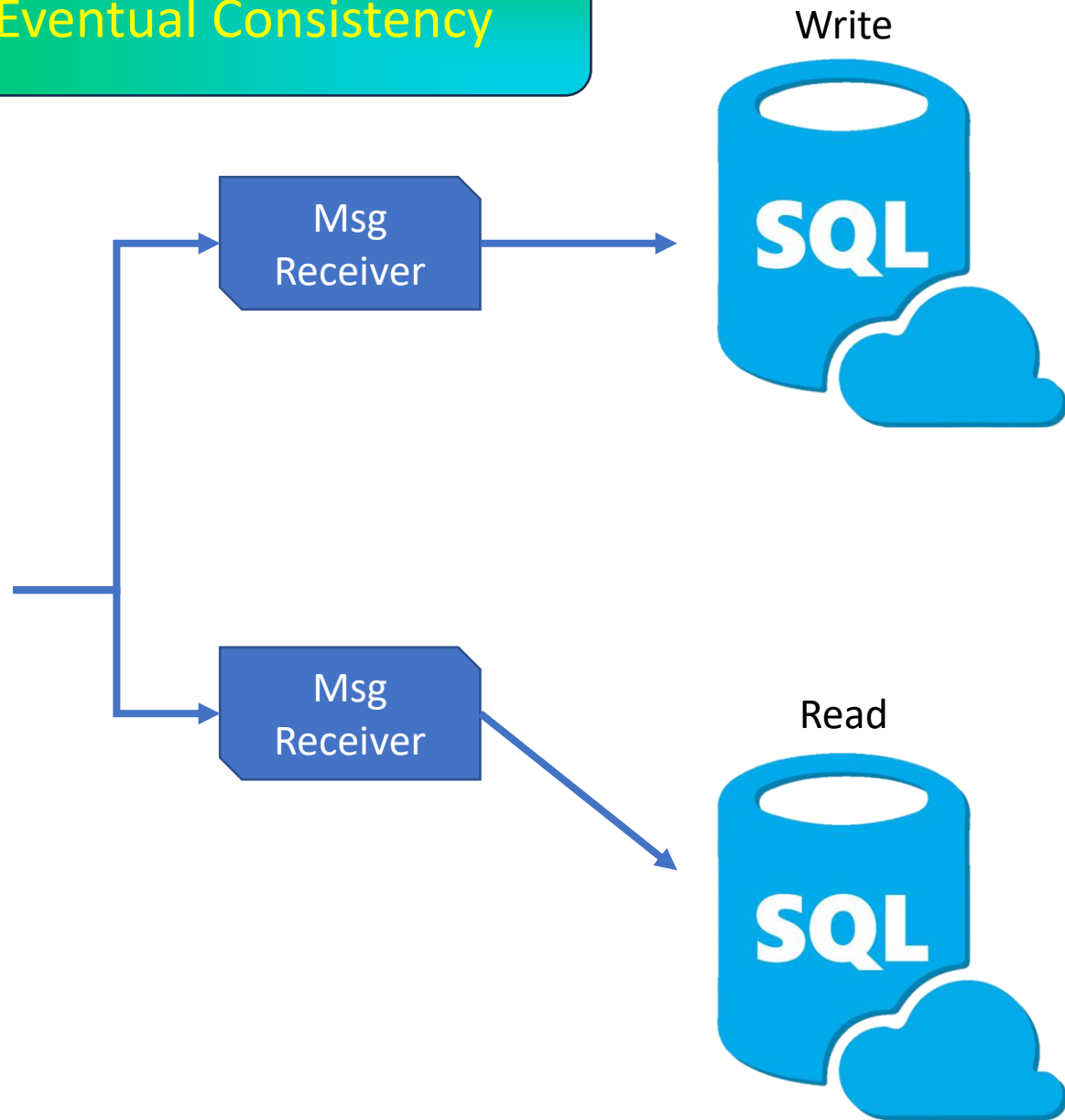
# Eventual Consistency



1
2

1
2

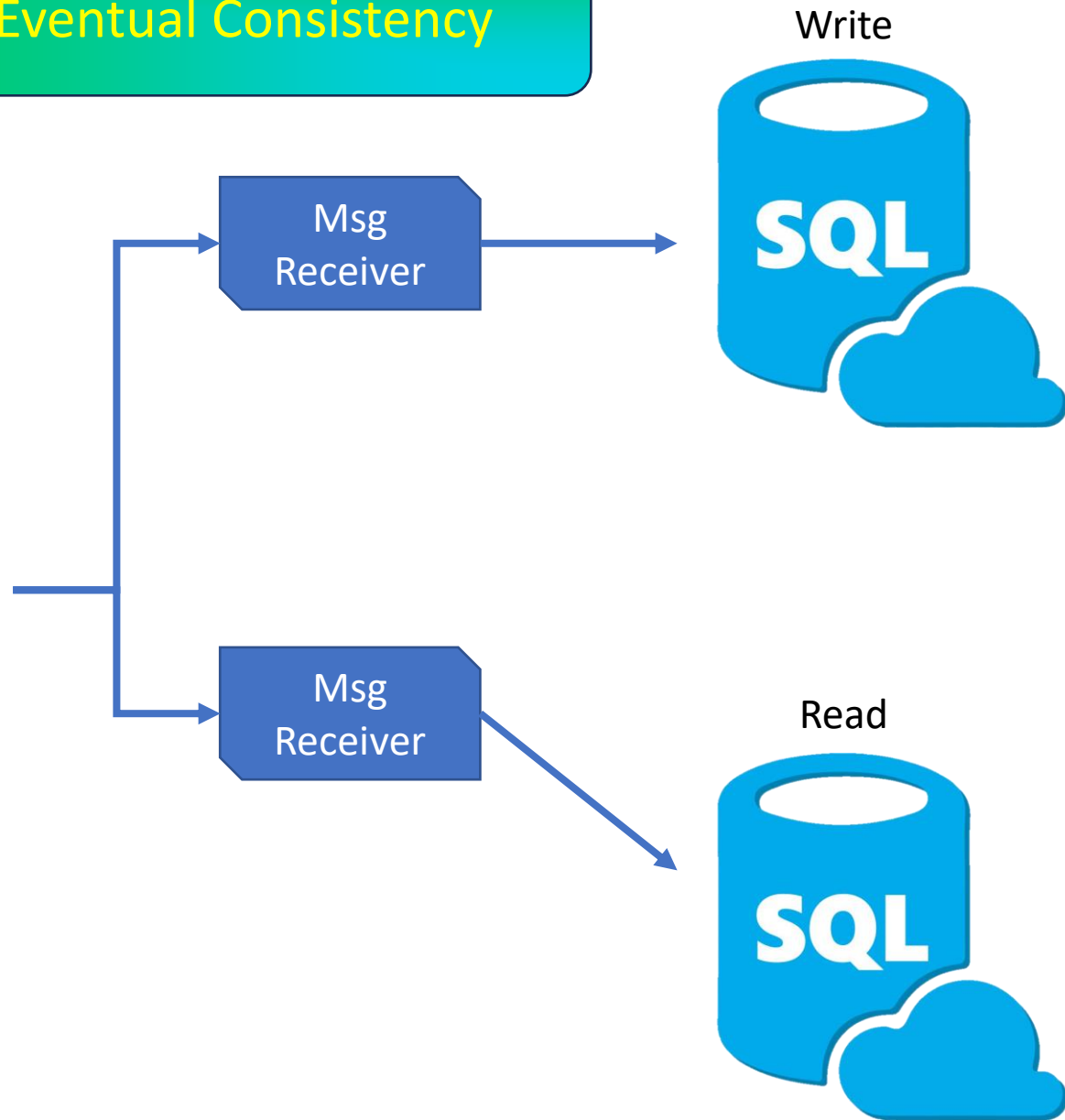
# Eventual Consistency



1
2
3

1
2

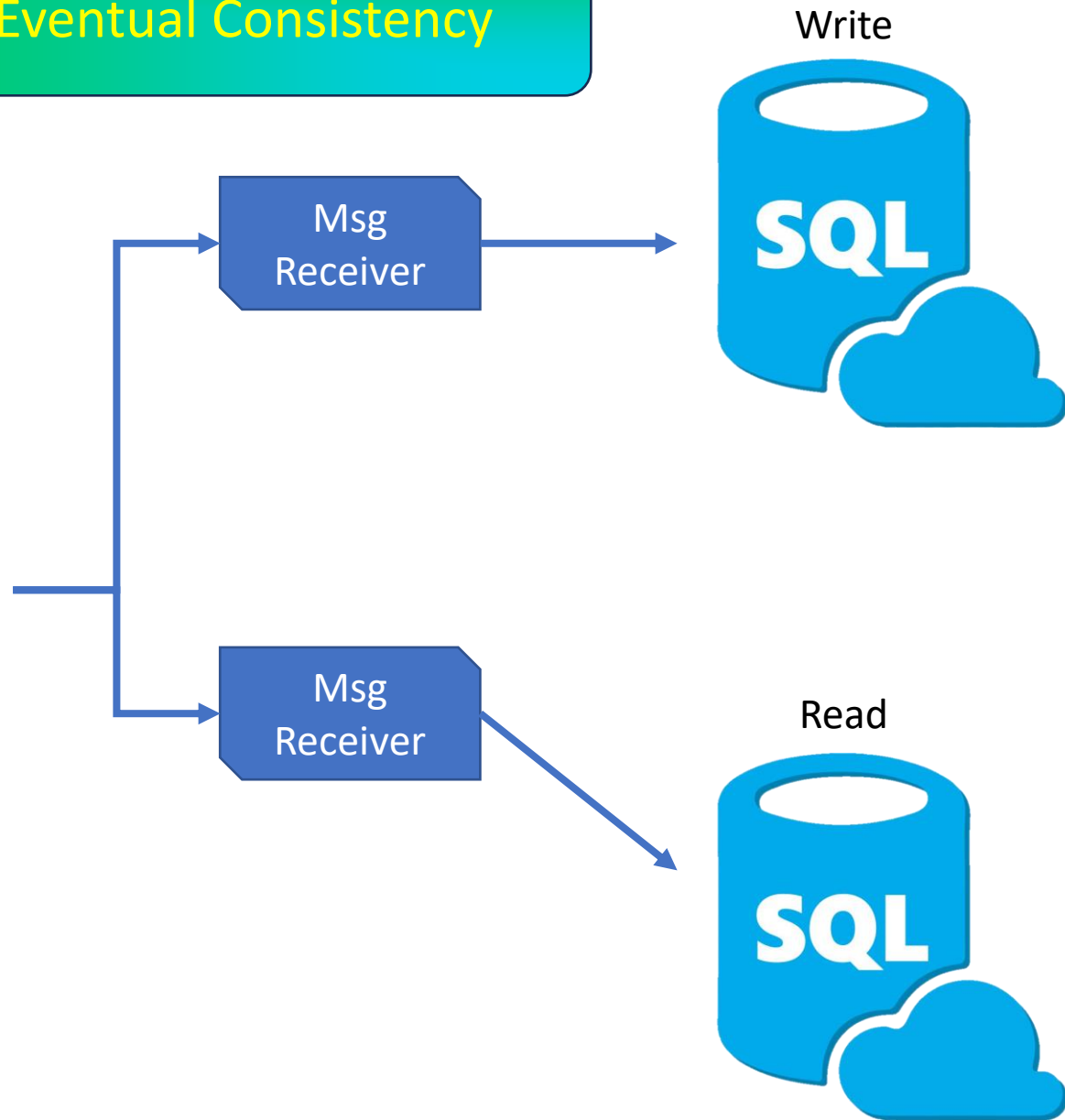
# Eventual Consistency



1
2
3
4

1
2
3

# Eventual Consistency

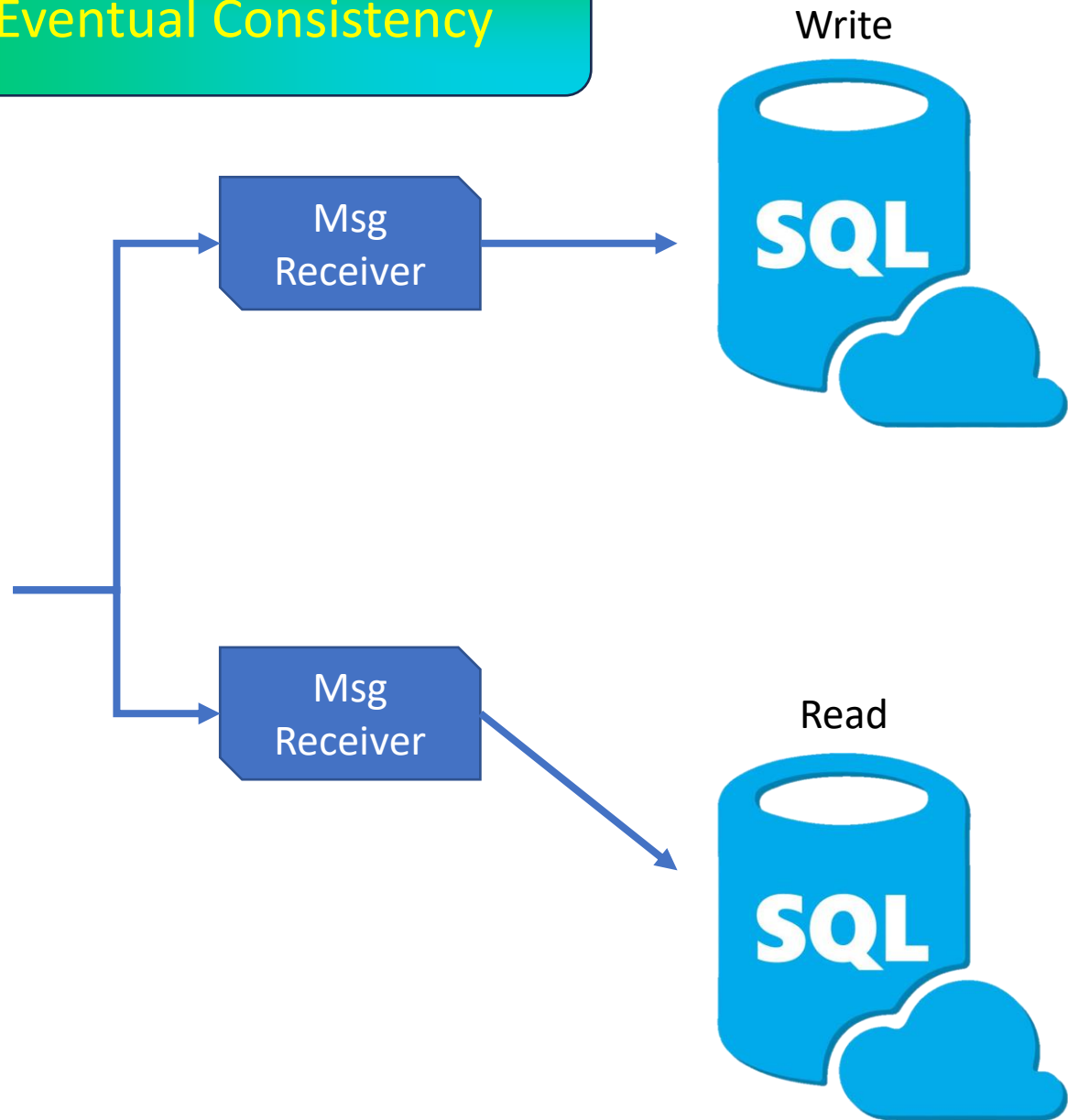


1
2
3
4
5

1
2
3
4

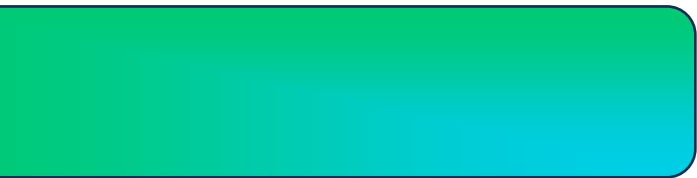


# Eventual Consistency



1
2
3
4
5

1
2
3
4
5



Select \* From blah



1
2
<b>4</b>
<b>3</b>
5



1
2
3
4
5

View

Select \* From blah

Read



1
2
<b>4</b>
<b>3</b>
5



View

1
2
3
4
5

View

Read

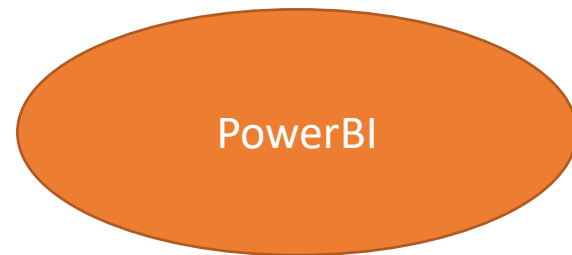


View

1
2
3
4
5



PowerBI



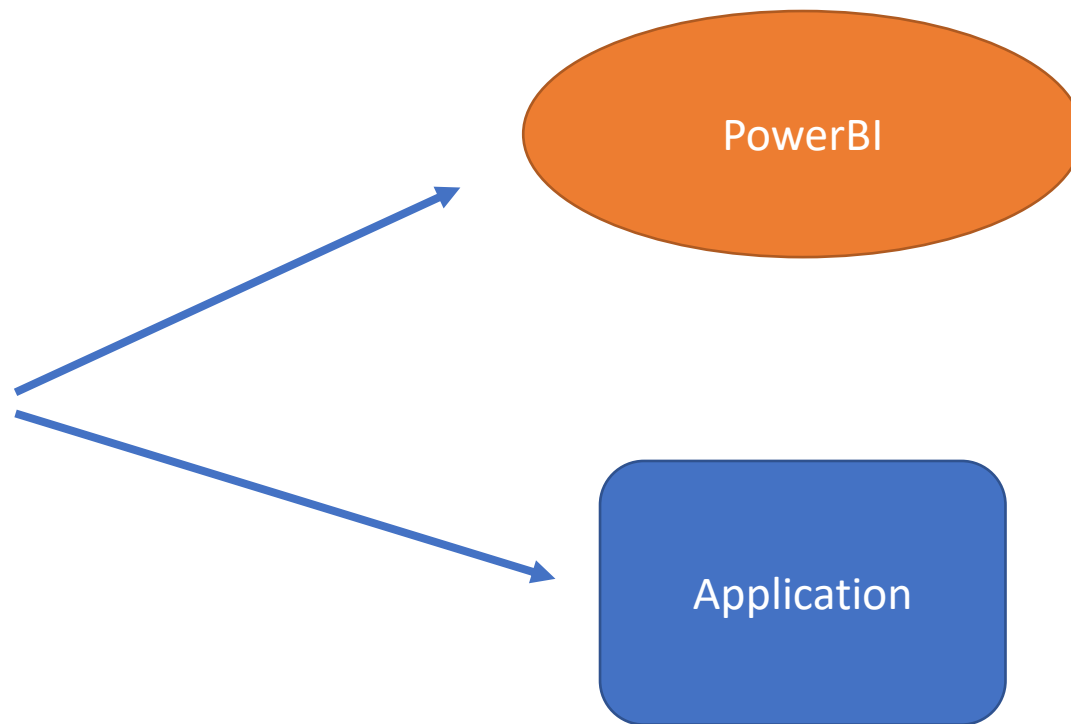
View

Read



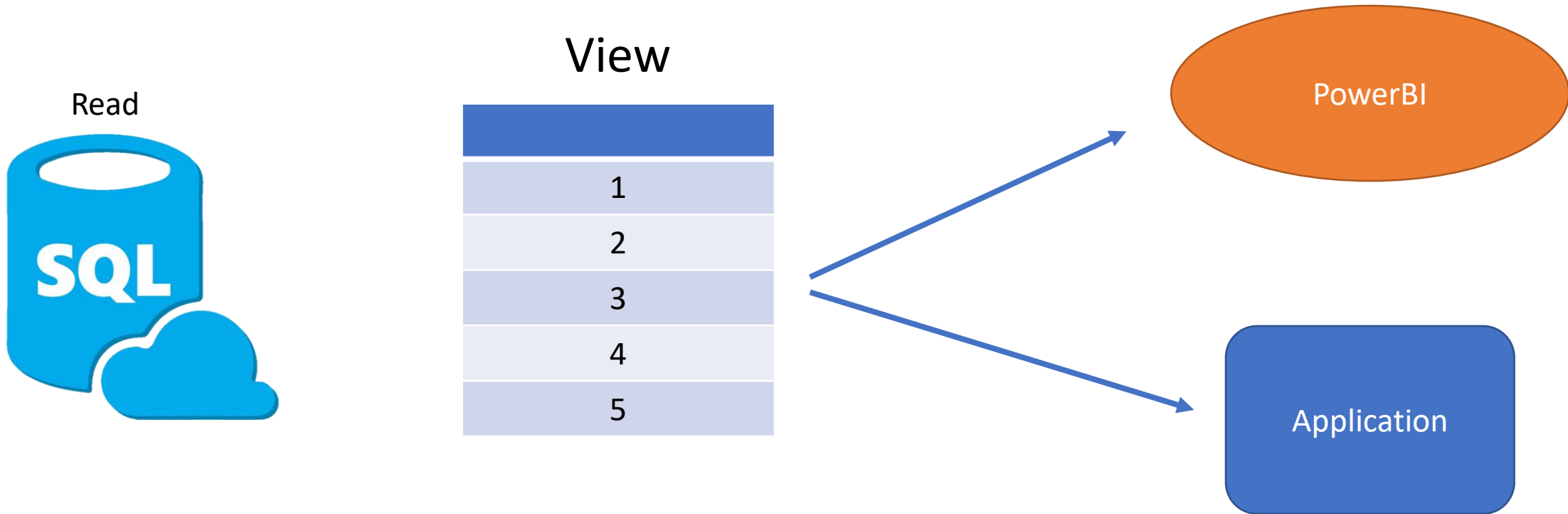
View

1
2
3
4
5



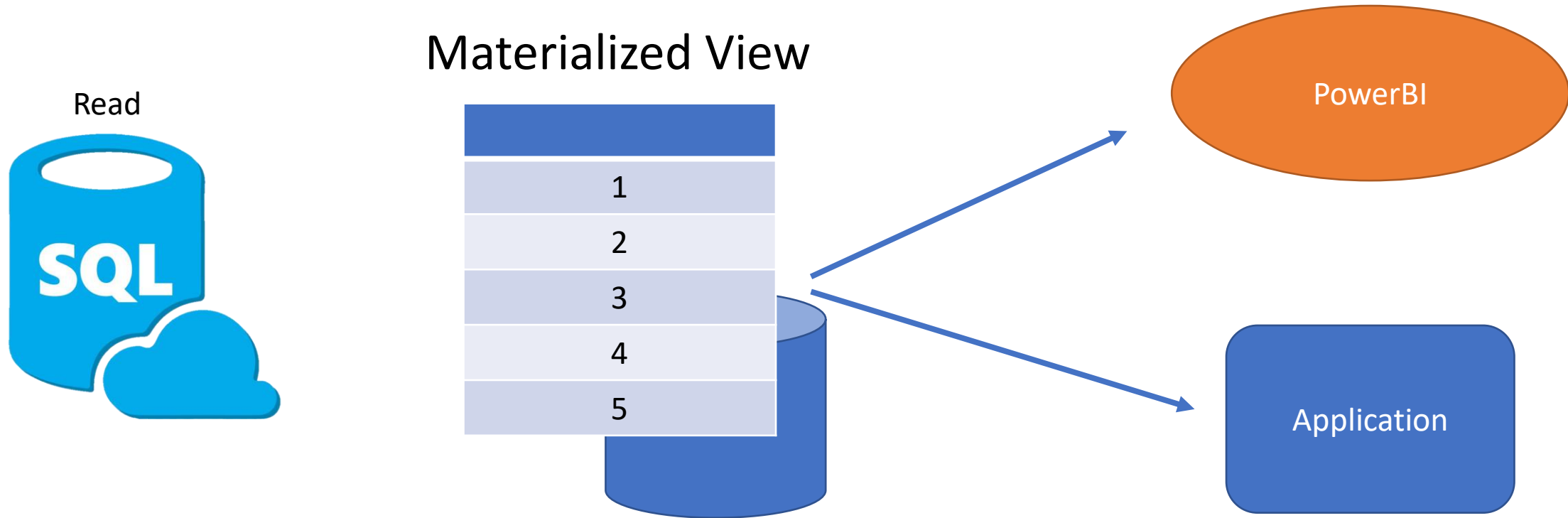
## View

*A view* executes the query for every request.



## Materialized View

*A materialized view is a form of a cache.*



# Event Sourcing



## Event Sourcing

	A	B	C	D	E	F	G	H
1	<b>Checkbook Register</b>							© 2008 Vertex42 LLC
2	<a href="http://www.vertex42.com/ExcelTemplates/excel-checkbook.html">http://www.vertex42.com/ExcelTemplates/excel-checkbook.html</a>							See instructions in the Help worksheet
3								
4	<b>Date</b>	<b>Num</b>	<b>Payee/Transaction Description</b>	<b>Category</b>	<b>R</b>	<b>Withdrawal, Payment (-)</b>	<b>Deposit, Credit (+)</b>	<b>Balance</b>
5	1/01/08		[Balance As of 01/01/2008]					546.00
6	1/01/08	DEP	Direct Deposit from Employer	Wages & Tips			1,000.00	1,546.00
7	1/10/08	EFT	Car Payment	Auto		115.20		1,430.80
8	1/15/08	2032	Joe's Food Mart	Groceries		87.34		1,343.46
9	1/18/08	TXFR	Transfer to Savings Account			100.00		1,243.46
10								
11								
12								
13								
14								
15								
16								
17								
18								

# Event Sourcing

1/1/2023	5,000

Event Sourcing

1/1/2023	5,000
1/5/2023	100
1/5/2023	-50

Event Sourcing

1/1/2023	5,000
1/5/2023	100
1/5/2023	-50
1/15/2023	3,000

Event Sourcing

1/1/2023	5,000
1/5/2023	100
1/5/2023	-50
1/15/2023	3,000
1/16/2023	-2,400

Event Sourcing

1/1/2023	5,000
1/5/2023	100
1/5/2023	-50
1/15/2023	3,000
1/16/2023	-2,400
1/20/2023	-4,300

## Event Sourcing

1/1/2023	5,000
1/5/2023	100
1/5/2023	-50
1/15/2023	3,000
1/16/2023	-2,400
1/20/2023	-4,300

Ending Balance?

## Event Sourcing

1/1/2023	5,000
1/5/2023	100
1/5/2023	-50
1/15/2023	3,000
1/16/2023	-2,400
1/20/2023	-4,300

~~Ending Balance?~~

1,350

Balance as of ... ?

Getting a balance is relative to when you query the data.



## Event Sourcing

```
{
  "Shopping Cart":{
    "Id":"SC-C123-202305301907-001",
    "CustomerId":"C123",
    "CustomerName":"Sean Whitesell",
    "Action":"ItemAdded",
    "Item":{
      "ItemId":"CoffeeXYZ-12345",
      "Description":"100 ct K-cup coffee",
      "Price":"24.99"
    }
  }
}
```

\*Immutable Record

## Event Sourcing

```
{
  "Shopping Cart":{
    "Id":"SC-C123-202305301907-001",
    "CustomerId":"C123",
    "CustomerName":"Sean Whitesell",
    "Action":"ItemAdded",
    "Item":{
      "ItemId":"CoffeeXYZ-StirStraw123",
      "Description":"100 ct coffee stirring straws",
      "Price":"5.49"
    }
  }
}
```

## Event Sourcing

```
{
  "Shopping Cart":{
    "Id":"SC-C123-202305301907-001",
    "CustomerId":"C123",
    "CustomerName":"Sean Whitesell",
    "Items":[{
      "ItemId":"CoffeeXYZ-12345",
      "Description":"100 ct K-cup coffee",
      "Price":"24.99"
    },
    {
      "ItemId":"CoffeeXYZ-StirStraw123",
      "Description":"100 ct coffee stirring straws",
      "Price":"5.49"
    }
  ]
}
```

## View Cart

1. Add item Coffee
2. Add item Stir Straws

## Event Sourcing

```
{
  "Shopping Cart":{
    "Id":"SC-C123-202305301907-001",
    "CustomerId":"C123",
    "CustomerName":"Sean Whitesell",
    "Action":"ItemRemoved",
    "Item":{
      "ItemId":"CoffeeXYZ-StirStraw123",
      "Description":"100 ct coffee stirring straws",
      "Price":"5.49"
    }
  }
}
```

## Event Sourcing

```
{
  "Shopping Cart":{
    "Id":"SC-C123-202305301907-001",
    "CustomerId":"C123",
    "CustomerName":"Sean Whitesell",
    "Items":[{
      "ItemId":"CoffeeXYZ-12345",
      "Description":"100 ct K-cup coffee",
      "Price":"24.99"
    }]
  }
}
```

## View Cart

1. Add item Coffee
2. Add item Stir Straws
3. Remove item Stir Straws

## Event Sourcing

```
{  
  "Shopping Cart":{  
    "Id":"SC-C123-202305301907-001",  
    "CustomerId":"C123",  
    "CustomerName":"Sean Whitesell",  
    "Action":"ItemAdded",  
    "Item":{  
      "ItemId":"CoffeeABC-StirStraw123",  
      "Description":"200 ct coffee stirring straws",  
      "Price":"6.49"  
    }  
  }  
}
```

## Event Sourcing

```
{
  "Shopping Cart":{
    "Id":"SC-C123-202305301907-001",
    "CustomerId":"C123",
    "CustomerName":"Sean Whitesell",
    "Items":[{
      "ItemId":"CoffeeXYZ-12345",
      "Description":"100 ct K-cup coffee",
      "Price":"24.99"
    },
    {
      "ItemId":"CoffeeABC-StirStraw123",
      "Description":"200 ct coffee stirring straws",
      "Price":"6.49"
    }
  ]
}
```

## View Cart

1. Add item Coffee
2. Add item Stir Straws
3. Remove item Stir Straws
4. Add item Stir Straws

## Event Sourcing

### Forecasted and Actual Temperature Data

Time	Forecasted	Actual
6:00:00	76	77
7:00:00	76	75
8:00:00	65	62
9:00:00	60	56



### Forecasted and Actual Temperature Data

Time	Forecasted	Actual	Variation
6:00:00	76	77	1
7:00:00	76	75	-1
8:00:00	65	62	-3
9:00:00	60	56	-4

## Event Sourcing

When to consider using Event Sourcing?

## Event Sourcing

When to consider using Event Sourcing?



A word cloud of various industries and domains where Event Sourcing is applicable. The words are arranged in a cluster, with some appearing larger than others. The colors of the words vary, including shades of blue, green, and grey.

eCommerce Logistics  
Network Performance  
Audit Compliance  
Financial IoT Legal  
Healthcare Telemetry  
Inventory  
Insurance Analytics  
Retail Government  
Supply Chain

\*not exhaustive list

## Event Sourcing

Key point about Event Sourcing.

## Event Sourcing

Key point about Event Sourcing.

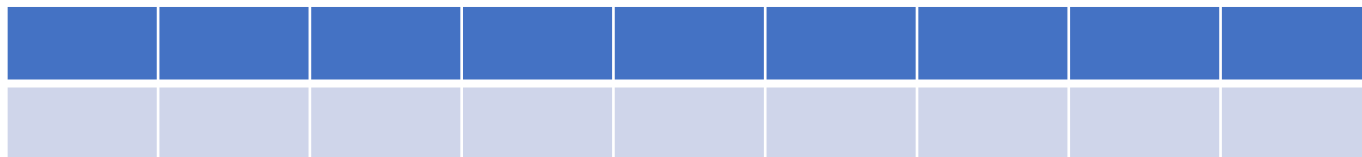
Use when you need to replay the  
change events as the “source of truth.”

## Event Sourcing

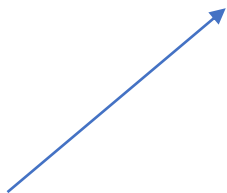
Scenario

# Event Sourcing

Scenario



Current State



The diagram illustrates the Event Sourcing architecture. At the top left, a green rounded rectangle is labeled "Event Sourcing". Below it, a horizontal grid of 18 cells (2 rows by 9 columns) represents the "Scenario". The top row of this grid is dark blue, and the bottom row is light blue. An arrow labeled "Current State" points from the bottom left towards the bottom row of the "Scenario" grid. To the right of the "Scenario" grid, the text "Change Log" is positioned above a vertical grid of 18 cells (9 rows by 3 columns). An arrow points from the "Change Log" text down to the top row of this grid. The top row of the "Change Log" grid is dark blue, and the subsequent 8 rows are light blue.

The diagram illustrates the Event Sourcing pattern. At the top left, a green rounded rectangle is labeled "Event Sourcing". Below it, a horizontal sequence of nine blue rectangles represents a "Scenario". Below the scenario, a horizontal sequence of nine light blue rectangles represents the "Current State". A blue arrow points from the "Current State" label to the first light blue rectangle. To the right, a vertical sequence of nine light blue rectangles represents the "Change Log". A blue arrow points from the "Change Log" label to the first light blue rectangle in the vertical sequence.

The diagram illustrates the Event Sourcing pattern. At the top left, a green rounded rectangle is labeled "Event Sourcing". Below it, a horizontal sequence of nine blue rectangles represents a "Scenario". Below the scenario, a horizontal sequence of nine light blue rectangles represents the "Current State". A blue arrow points from the "Current State" label to the first light blue rectangle. To the right, a vertical sequence of nine light blue rectangles represents the "Change Log". A blue arrow points from the "Change Log" label to the first light blue rectangle in the vertical sequence.

The diagram illustrates the Event Sourcing architecture. It features three main components:

- Current State:** A 2x9 grid of cells. The top row consists of 9 blue cells, and the bottom row consists of 9 light blue cells. An arrow points from this grid to the Scenario grid.
- Scenario:** A 2x9 grid of cells. The top row consists of 9 blue cells, and the bottom row consists of 9 light blue cells. It is the central component, receiving input from both the Current State and the Change Log.
- Change Log:** A 9x3 grid of cells. The top row consists of 3 blue cells, and the remaining 8 rows consist of 3 light blue cells. An arrow points from this grid to the Scenario grid.



# Event Sourcing

Which one is the source of truth?

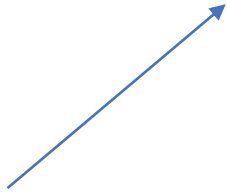

Change Log







Current State



## Event Sourcing

Event Sourcing is having a  
change log *AS* the source of truth.

# Change Log

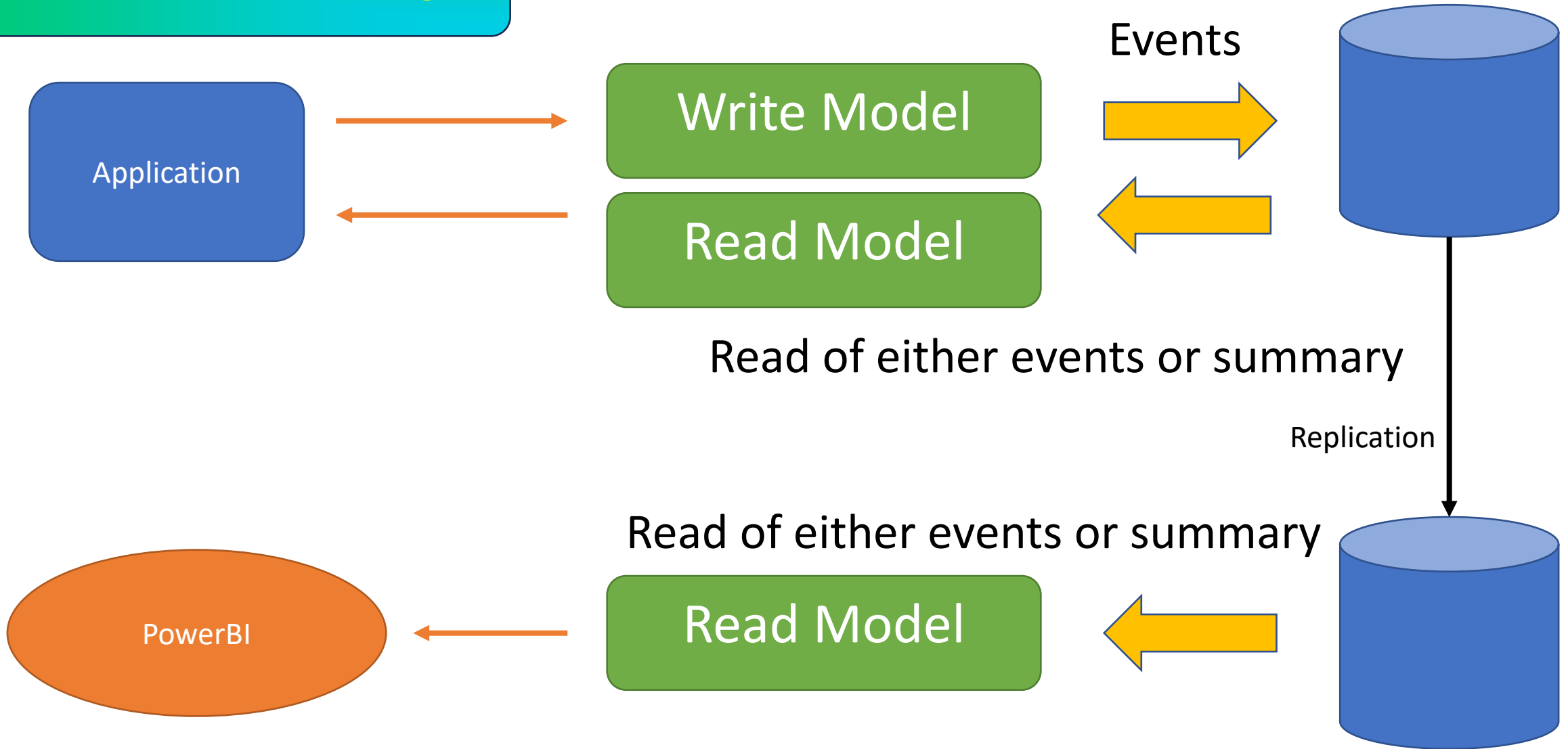


## Events of data changes

[illegible]

# CQRS + Event Sourcing

# CQRS w/ Event Sourcing



# Data Security

# Data Security

## 1. At Rest vs In Transit

Data that is stored on disk either spinning hard drive or solid-state is considered “*at rest*”.

Data in the network to or from a data store or between applications like microservices is considered “*in transit*”.

SSL connections is one way of encrypting data in transit between a source and destination.

## Data Security

1. At Rest vs In Transit
2. **Key Management**

Data encrypted at rest uses an encryption key.

Most cloud providers do not allow you access to this key. Instead, they offer you a “customer managed key”. This CMK is a “*key encrypting key*.” It is used to encrypt the key that is used for encrypting the data at rest.

## Data Security

1. At Rest vs In Transit
2. Key Management
3. **Access and Authorization**

Some databases, like SQL Server, offer **Row-Level Security**.

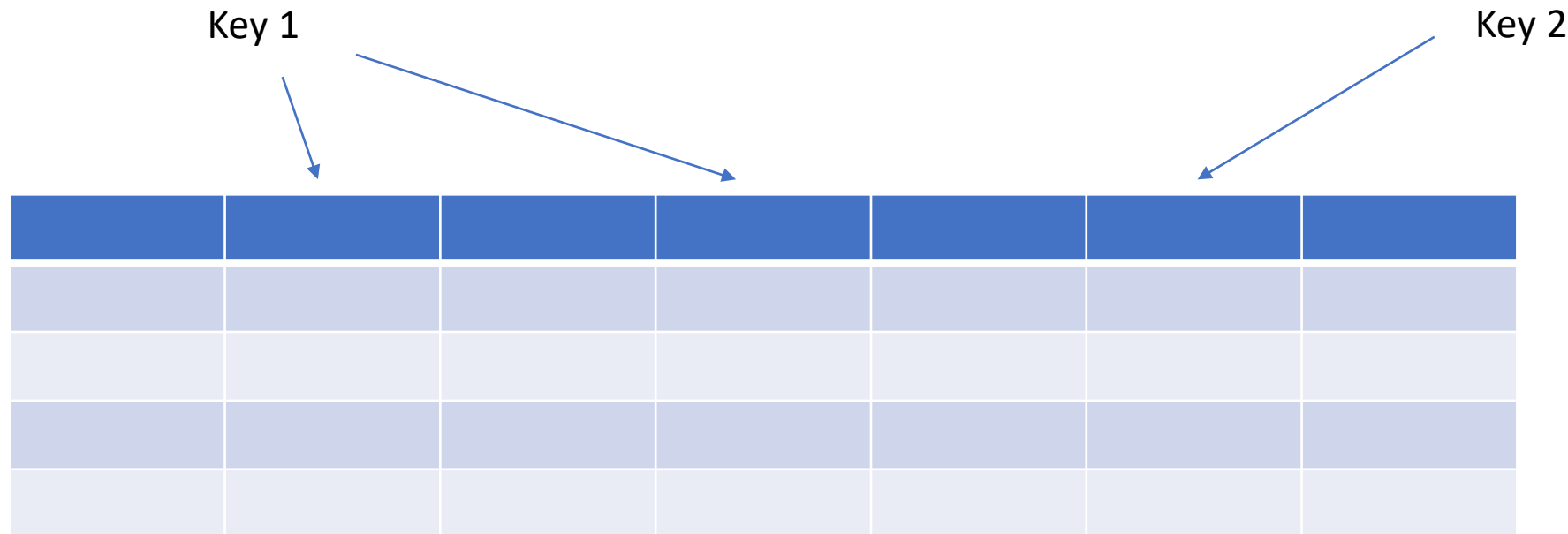
This Row-Level Security allows for control of who has access to see any data at a row-by-row level.



# Data Security

1. At Rest vs In Transit
2. Key Management
3. Access and Authorization
4. **Columnar Encryption**

Some databases, like SQL Server, offer **Transparent Data Encryption**. This uses a predefined key you set up for how the data in specified columns are encrypted.



## Data Security

1. At Rest vs In Transit
2. Key Management
3. Access and Authorization
4. Columnar Encryption
5. **Compliance**

Data residency laws are becoming more prominent.

GDPR - General Data Protection Regulation

CCPA - California Consumer Privacy Act

PII – Personally Identifiable Information

Questions?

github: seanw122/presentations



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