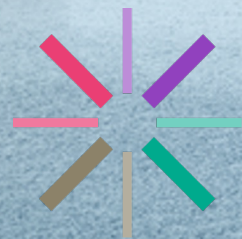


Dani Schnider

Wieviel Zeit braucht mein Data Warehouse?



Callista

About me



Dani Schnider

- Working for Callista
- Oracle ACE Director
- Member of DDVUG
- Hobby: Craft Beer Brewing



[@danischnider.bsky.social](https://bsky.social/@danischnider)

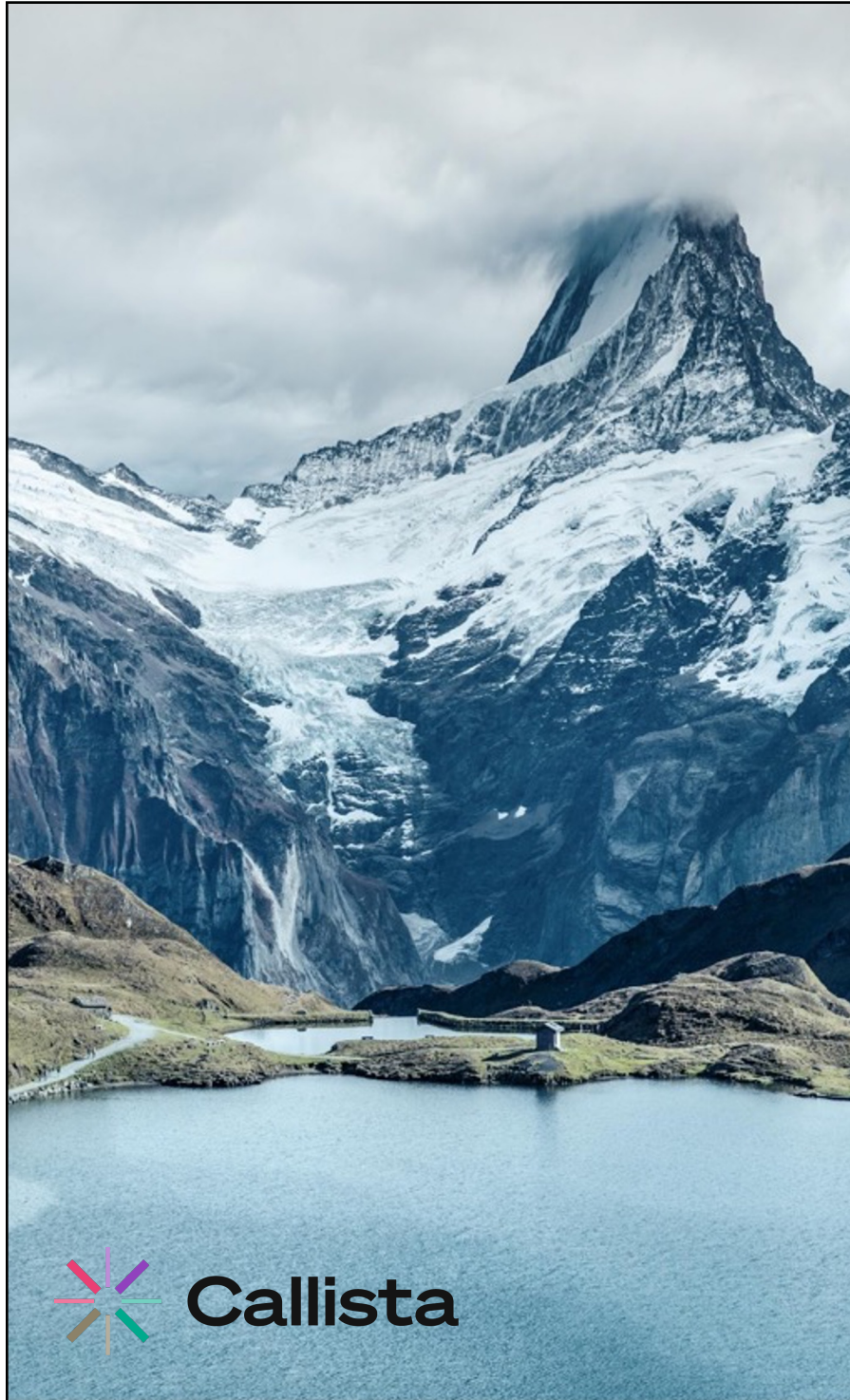


danischnider.wordpress.com



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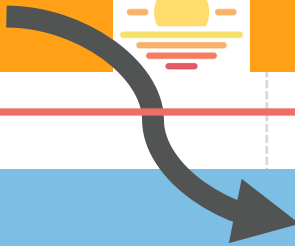




Callista

Ausgangslage

DWH Timeline



2020

2021

2022

2023

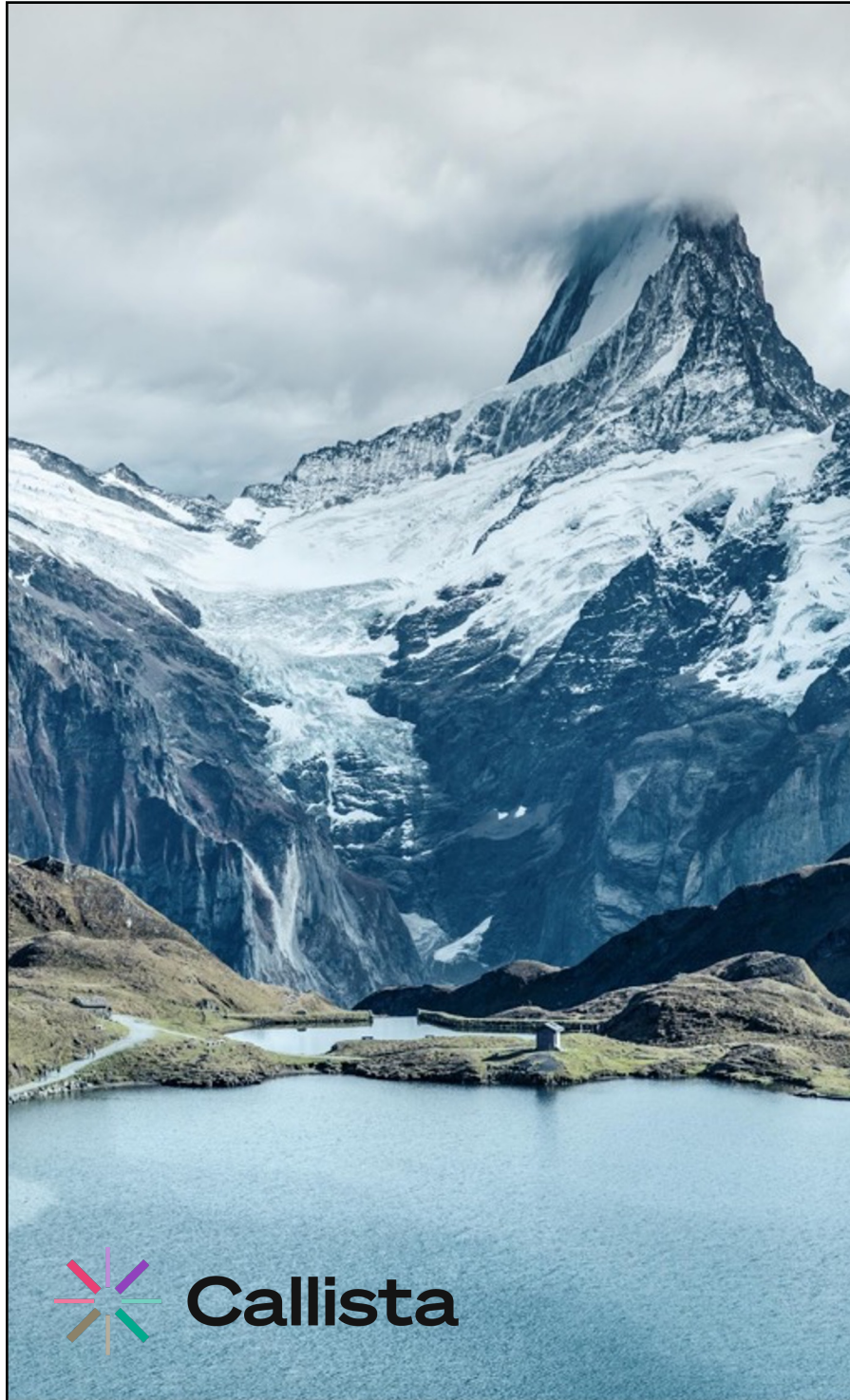
2024

2025

2026



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Historisierungs- konzepte



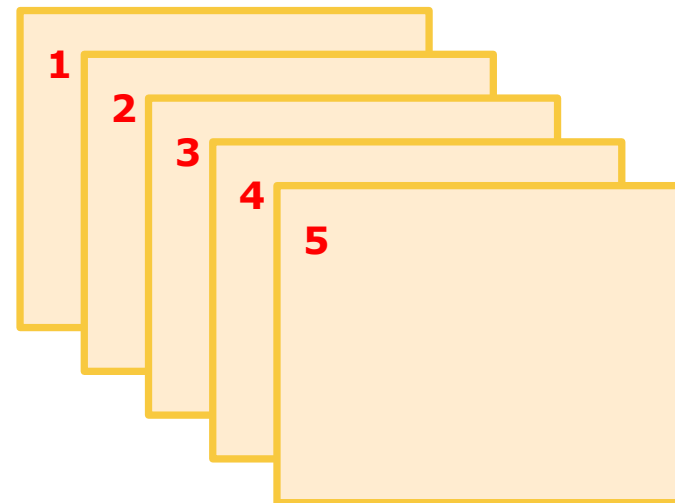
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Historisierung Ladezeitpunkt



1
2
3
4
5

⌘ HASH_KEY	🕒 LOAD_TIMESTAMP
A13CC05A0103051D	2024-08-30T18:53:18.124
A13CC05A0103051D	2024-10-07T03:10:46.345
A13CC05A0103051D	2024-10-11T02:48:44.023
A13CC05A0103051D	2024-10-14T02:48:54.500
A13CC05A0103051D	2024-10-23T03:01:07.379



Standard in Data Warehouses:

- Historisierung über Ladezeitpunkt
- Delta-Loads von Stammdaten
- Mit jeder Änderung wird neue Version geschrieben
- Laden von Bewegungsdaten

Eine Zeitachse:

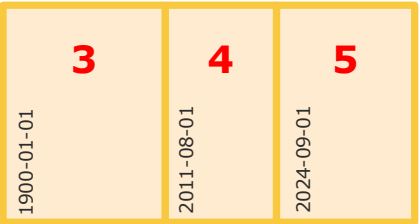
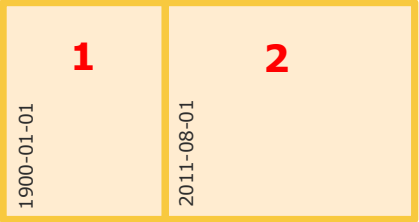
- Ladezeitpunkt

Fachliche Historisierung



1
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 HASH_KEY	 LOAD_TIMESTAMP	 BEGIN_DATE	 END_DATE
F4F291F16C359BCF	2024-08-30T14:57:10.330	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-08-30T14:57:10.330	2011-08-01	2099-12-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2011-08-01	2024-08-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2024-09-01	2099-12-31



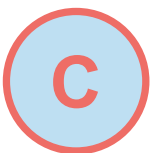
Zusätzliche Anforderung:

- Fachliche Historisierung im Quellsystem
- Gültigkeitsintervalle für Stammdaten

Zwei Zeitachsen:

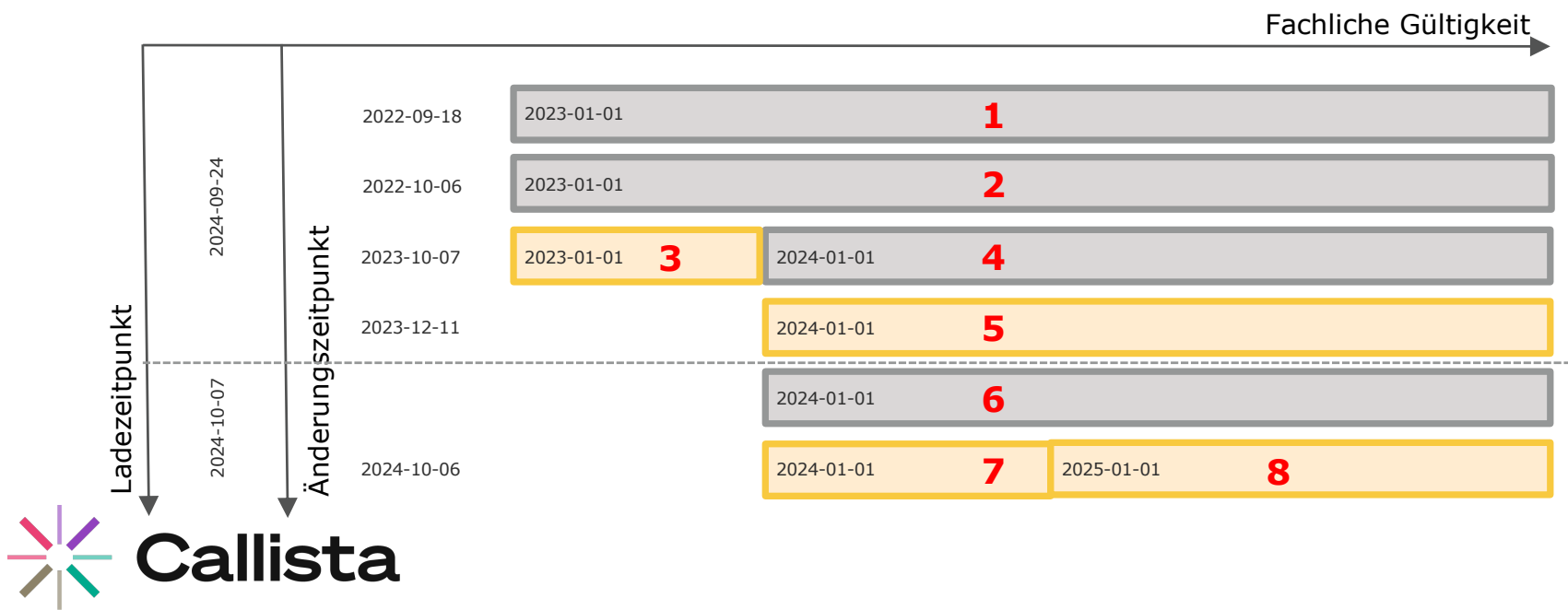
- Ladezeitpunkt
- Fachliche Gültigkeit (von/bis)

Bi-temporale Datenquelle



1
2
3
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-

HASH_KEY	LOAD_TIMESTAMP	BEGIN_DATE	END_DATE	CREATED_AT	REPLACED_AT
002272C88E18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-09-18T08:43:22.9...	2022-10-06T02:39:39.1...
002272C88E18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-10-06T02:39:39.1...	2023-10-07T10:02:24.5...
002272C88E18D58B	2024-09-24T14:20:08.138	2023-01-01	2023-12-31	2023-10-07T10:02:24.5...	null
002272C88E18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-10-07T10:02:24.5...	2023-12-11T14:41:16.0...
002272C88E18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-12-11T14:41:16.0...	null



Bi-temporale Historisierung:

- Fachliche und technische Historisierung im Quellsystem
- Zusätzlich werden Daten im DWH historisiert
- Somit tri-temporale Historisierung

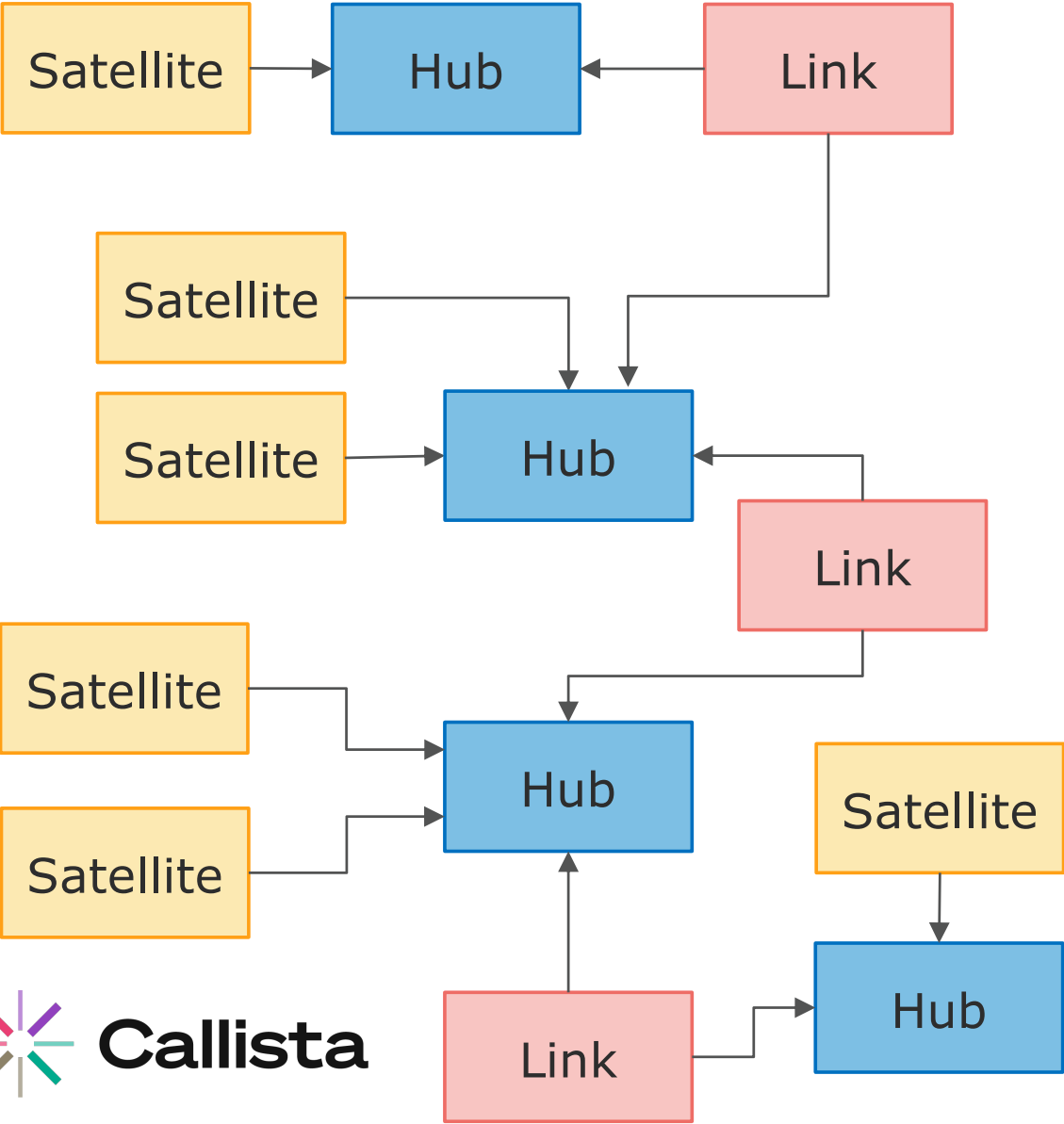
Drei Zeitachsen:

- Ladezeitpunkt
- Fachliche Gültigkeit (von/bis)
- Technische Historisierung im Quellsystem



Multi-temporale Historisierung mit Data Vault

Data Vault



Data Vault: Historisierte Satelliten

 HASH_KEY	 LOAD_TIMESTAMP
A13CC05A0103051D	2024-08-30T18:53:18.124
A13CC05A0103051D	2024-10-07T03:10:46.345
A13CC05A0103051D	2024-10-11T02:48:44.023
A13CC05A0103051D	2024-10-14T02:48:54.500
A13CC05A0103051D	2024-10-23T03:01:07.379

S_PRODUCT_DESCRIPTION	
 Product_Key	
 Load_Timestamp	
Product_Name	
Description	
Color	
Length	
Width	
Height	
Weight	
Producer	
 Record_Source	



H_PRODUCT			
 Product_Key			
 Product_Code			
 Load_Timestamp			
 Record_Source			

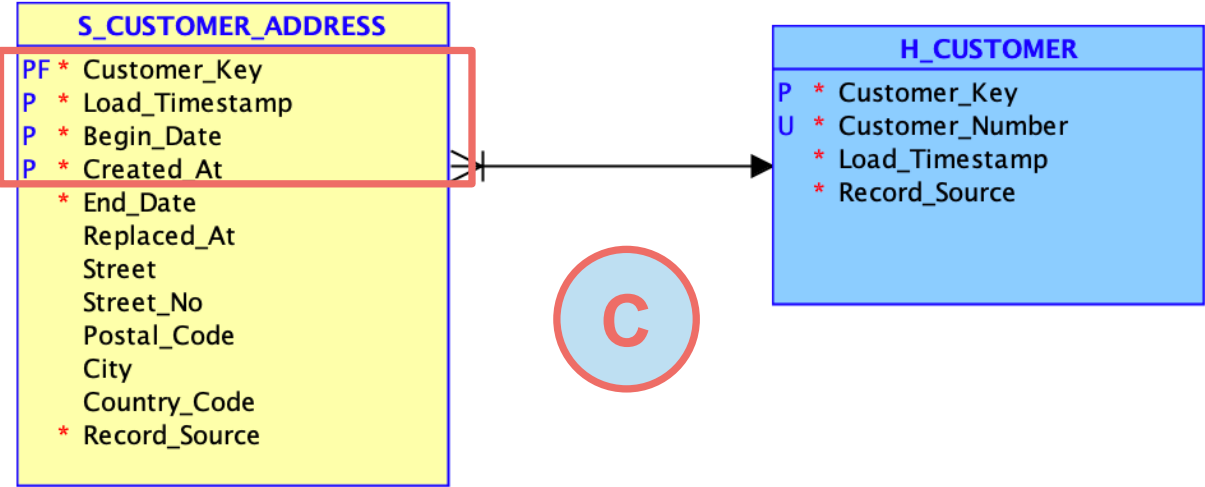
 HASH_KEY	 LOAD_TIMESTAMP	 BEGIN_DATE	 END_DATE
F4F291F16C359BCF	2024-08-30T14:57:10.330	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-08-30T14:57:10.330	2011-08-01	2099-12-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2011-08-01	2024-08-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2024-09-01	2099-12-31

S_PRODUCT_PRICE	
 Product_Key	
 Load_Timestamp	
 Begin_Date	
 End_Date	
List_Price	
Minimal_Price	
Cost_Price	
 Record_Source	

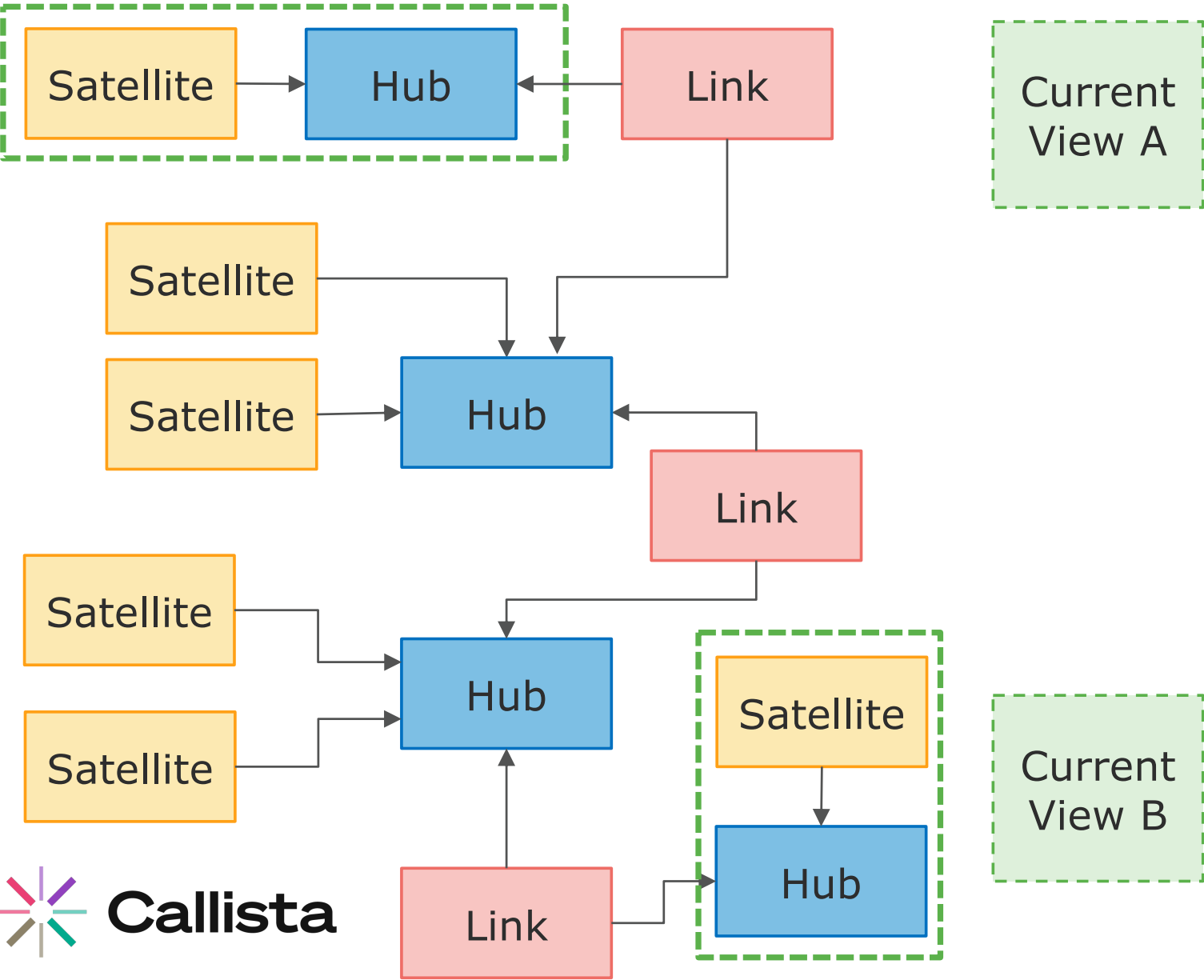


Data Vault: Historisierte Satelliten

HASH_KEY	LOAD_TIMESTAMP	BEGIN_DATE	END_DATE	CREATED_AT	REPLACED_AT
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-09-18T08:43:22.9...	2022-10-06T02:39:39.1...
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-10-06T02:39:39.1...	2023-10-07T10:02:24.5...
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2023-12-31	2023-10-07T10:02:24.5...	null
002272C8BE18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-10-07T10:02:24.5...	2023-12-11T14:41:16.0...
002272C8BE18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-12-11T14:41:16.0...	null
002272C8BE18D58B	2024-10-07T03:10:46.345	2024-01-01	2099-12-31	2023-12-11T14:41:16.0...	2024-10-06T00:25:10.8...
002272C8BE18D58B	2024-10-07T03:10:46.345	2024-01-01	2024-12-31	2024-10-06T00:25:10.8...	null
002272C8BE18D58B	2024-10-07T03:10:46.345	2025-01-01	2099-12-31	2024-10-06T00:25:10.8...	null



Data Vault + Current Views



Filtern auf gültige Versionen

A

 HASH_KEY	 LOAD_TIMESTAMP
A13CC05A0103051D	2024-08-30T18:53:18.124
A13CC05A0103051D	2024-10-07T03:10:46.345
A13CC05A0103051D	2024-10-11T02:48:44.023
A13CC05A0103051D	2024-10-14T02:48:54.500
A13CC05A0103051D	2024-10-23T03:01:07.379

B

 HASH_KEY	 LOAD_TIMESTAMP	 BEGIN_DATE	 END_DATE
F4F291F16C359BCF	2024-08-30T14:57:10.330	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-08-30T14:57:10.330	2011-08-01	2099-12-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2011-08-01	2024-08-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2024-09-01	2099-12-31

Pro Hash Key:

- Letzte geladene Version

Pro Hash Key und Beginndatum:

- Letzte geladene Version

Current View für Hub mit einem Satelliten



```
CREATE OR REPLACE VIEW example1_curr AS
WITH last_version AS (
    SELECT sat.*
           , RANK() OVER (PARTITION BY hash_key
                        ORDER BY load_timestamp DESC) rnk
    FROM example1_sat sat
)
SELECT h.hub_key
       , ...
       , ...
FROM example1_hub h
LEFT JOIN last_version s
    ON s.hash_key = h.hash_key
   AND s.rnk = 1
```

 HASH_KEY	 LOAD_TIMESTAMP
A13CC05A0103051D	2024-08-30T18:53:18.124
A13CC05A0103051D	2024-10-07T03:10:46.345
A13CC05A0103051D	2024-10-11T02:48:44.023
A13CC05A0103051D	2024-10-14T02:48:54.500
A13CC05A0103051D	2024-10-23T03:01:07.379

Current View für Hub mit einem Satelliten



```
CREATE OR REPLACE VIEW example2_curr AS
WITH last_version AS (
    SELECT sat.*
           , RANK() OVER (PARTITION BY hash_key, begin_date
                           ORDER BY load_timestamp DESC) rnk
    FROM example2_sat sat
)
SELECT h.hub_key
       , s.begin_date
       , s.end_date
       , ...
       , ...
FROM example2_hub h
LEFT JOIN last_version s
    ON s.hash_key = h.hash_key
   AND s.rnk = 1
```

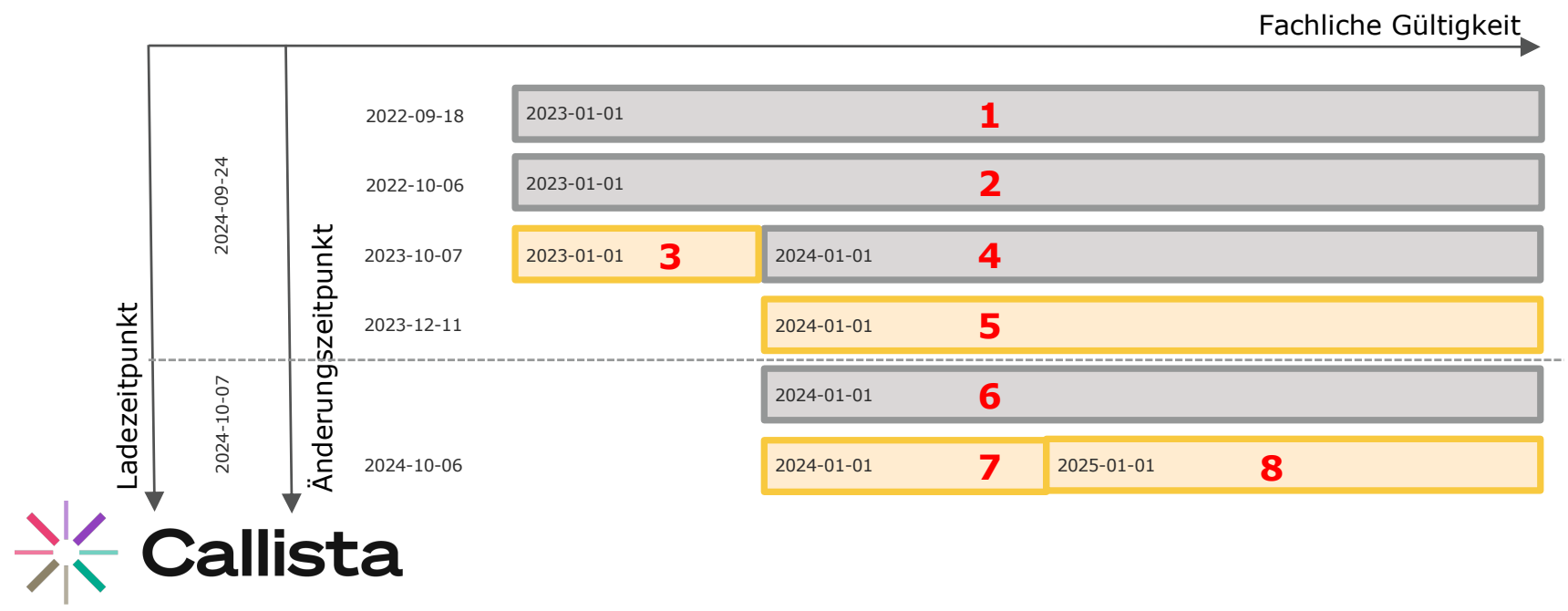
HASH_KEY	LOAD_TIMESTAMP	BEGIN_DATE	END_DATE
F4F291F16C359BCF	2024-08-30T14:57:10.330	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-08-30T14:57:10.330	2011-08-01	2099-12-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	1900-01-01	2011-07-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2011-08-01	2024-08-31
F4F291F16C359BCF	2024-09-11T02:17:13.581	2024-09-01	2099-12-31

Filtern auf gültige Versionen C

1
2
3
4
5
6
7
8

HASH_KEY	LOAD_TIMESTAMP	BEGIN_DATE	END_DATE	CREATED_AT	REPLACED_AT
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-09-18T08:43:22.9...	2022-10-06T02:39:39.1...
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-10-06T02:39:39.1...	2023-10-07T10:02:24.5...
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2023-12-31	2023-10-07T10:02:24.5...	null
002272C8BE18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-10-07T10:02:24.5...	2023-12-11T14:41:16.0...
002272C8BE18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-12-11T14:41:16.0...	null
002272C8BE18D58B	2024-10-07T03:10:46.345	2024-01-01	2099-12-31	2023-12-11T14:41:16.0...	2024-10-06T00:25:10.8...
002272C8BE18D58B	2024-10-07T03:10:46.345	2024-01-01	2024-12-31	2024-10-06T00:25:10.8...	null
002272C8BE18D58B	2024-10-07T03:10:46.345	2025-01-01	2099-12-31	2024-10-06T00:25:10.8...	null

- Pro Hash Key und Beginndatum:
- Letzte geladene Version der letzten Änderung
 - Nur technisch gültige Versionen (REPLACED_AT is null)



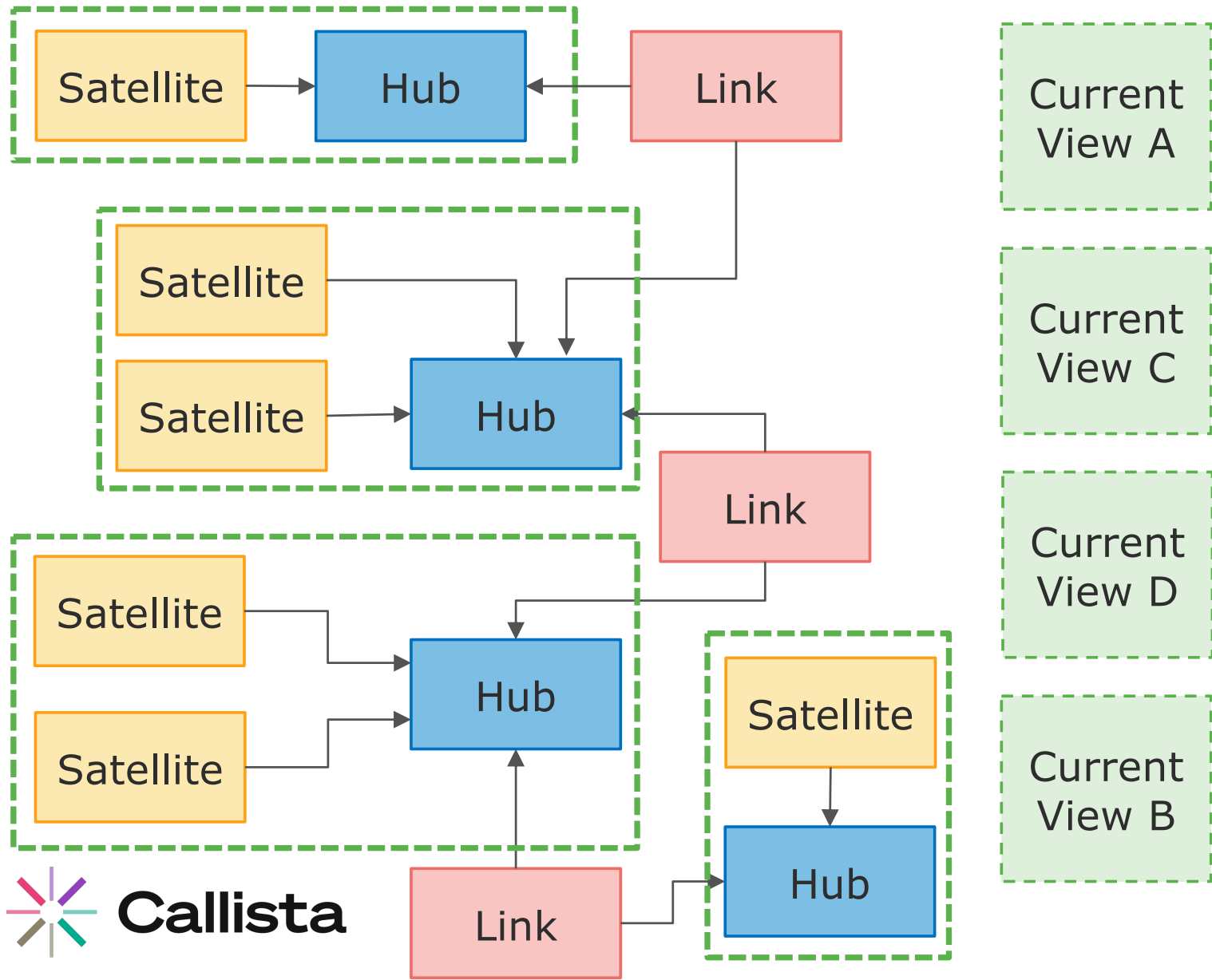
Current View für Hub mit einem Satelliten



```
CREATE OR REPLACE VIEW example3_curr AS
WITH last_version AS (
    SELECT sat.*
           , RANK() OVER (PARTITION BY hash_key, begin_date
                           ORDER BY created_at DESC, load_timestamp DESC) rnk
    FROM example3_sat sat
)
SELECT h.hub_key
      , s.begin_date
      , s.end_date
      , ...
FROM example3_hub h
LEFT JOIN last_version s
  ON s.hash_key = h.hash_key
 AND s.rnk = 1 AND s.replaced_at IS NULL
```

 HASH_KEY	 LOAD_TIMESTAMP	 BEGIN_DATE	 END_DATE	 CREATED_AT	 REPLACED_AT
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-09-18T08:43:22.9...	2022-10-06T02:39:39.1...
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2099-12-31	2022-10-06T02:39:39.1...	2023-10-07T10:02:24.5...
002272C8BE18D58B	2024-09-24T14:20:08.138	2023-01-01	2023-12-31	2023-10-07T10:02:24.5...	null
002272C8BE18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-10-07T10:02:24.5...	2023-12-11T14:41:16.0...
002272C8BE18D58B	2024-09-24T14:20:08.138	2024-01-01	2099-12-31	2023-12-11T14:41:16.0...	null
002272C8BE18D58B	2024-10-07T03:10:46.345	2024-01-01	2099-12-31	2023-12-11T14:41:16.0...	2024-10-06T00:25:10.8...
002272C8BE18D58B	2024-10-07T03:10:46.345	2024-01-01	2024-12-31	2024-10-06T00:25:10.8...	null
002272C8BE18D58B	2024-10-07T03:10:46.345	2025-01-01	2099-12-31	2024-10-06T00:25:10.8...	null

Data Vault + Current Views



Current View für Hub mit mehreren Satelliten

```
CREATE OR REPLACE VIEW example4_curr AS
WITH sat1_curr AS (...),
     sat2_curr AS (...)
SELECT h.hash_key
      , h.business_key
      , s1....
      , s2....
FROM pit_intervals pit
JOIN hub h
  ON h.hash_key = pit.hash_key
LEFT JOIN sat1_curr s1
  ON s1.hash_key = h.hash_key
LEFT JOIN sat2_curr s2
  ON s2.hash_key = h.hash_key
```

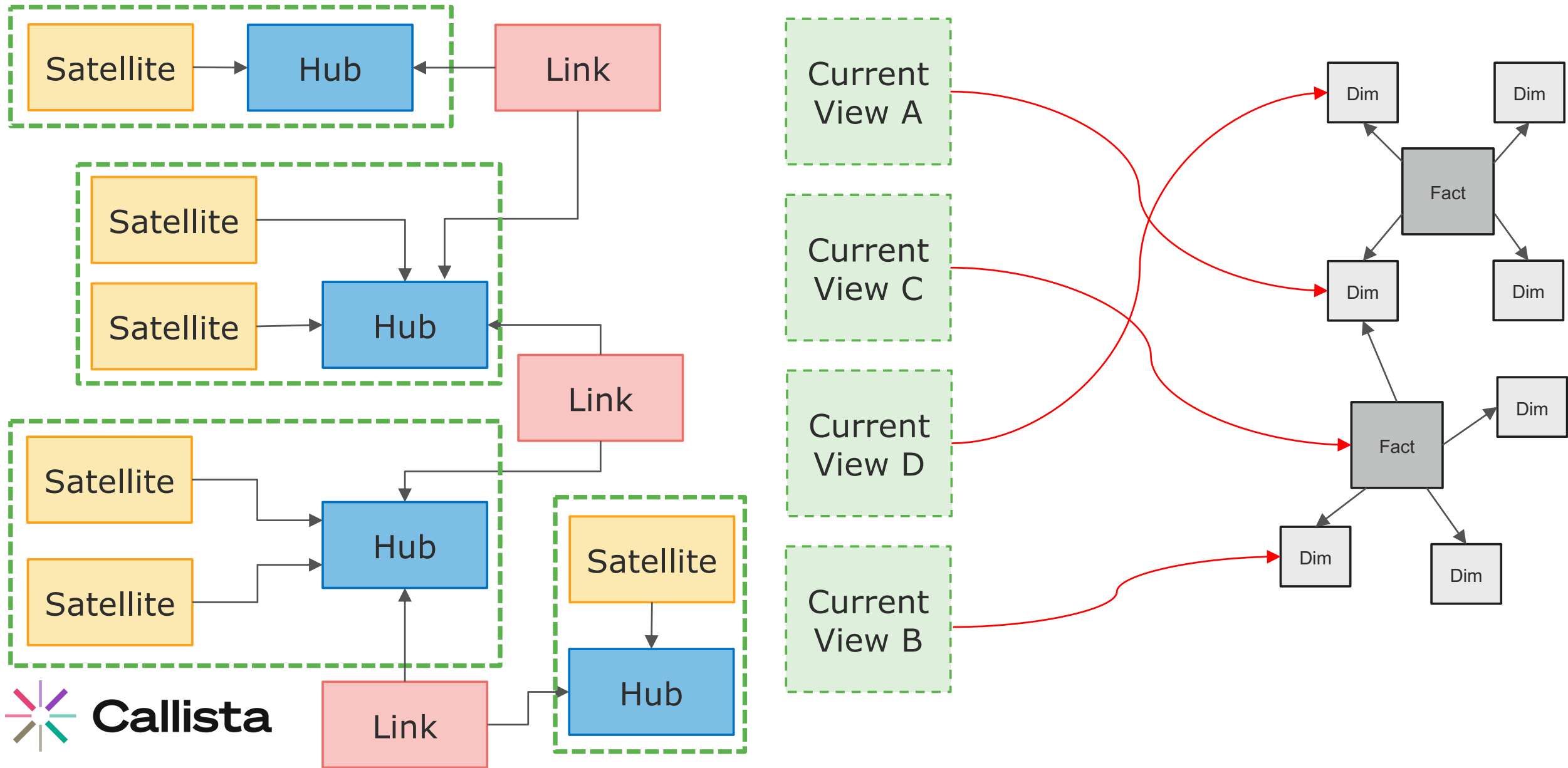
A

```
CREATE OR REPLACE VIEW example5_curr AS
WITH sat1_curr AS (...),
     sat2_curr AS (...)
, valid_dates AS (
  SELECT hash_key, begin_date AS valid_date
    FROM sat1_curr
  UNION
  SELECT hash_key, end_date+1 AS valid_date
    FROM sat1_curr
  UNION
  SELECT hash_key, begin_date AS valid_date
    FROM sat2_curr
  UNION
  SELECT hash_key, end_date+1 AS valid_date
    FROM sat2_curr
)
, pit_intervals AS (
  SELECT hash_key
        , valid_date AS begin_date
        , LEAD(valid_date-1, 1) OVER (PARTITION BY hash_key
                                      ORDER BY valid_date) AS end_date
    FROM valid_dates
)
SELECT pit.hash_key
      , pit.begin_date
      , pit.end_date
      , h.business_key
      , s1....
      , s2....
FROM pit_intervals pit
JOIN hub h
  ON h.hash_key = pit.hash_key
LEFT JOIN sat1_curr s1
  ON s1.hash_key = h.hash_key
  AND pit.begin_date BETWEEN s1.begin_date AND s1.end_date
LEFT JOIN sat2_curr s2
  ON s2.hash_key = h.hash_key
  AND pit.begin_date BETWEEN s2.begin_date AND s2.end_date
WHERE pit.end_date IS NOT NULL
```

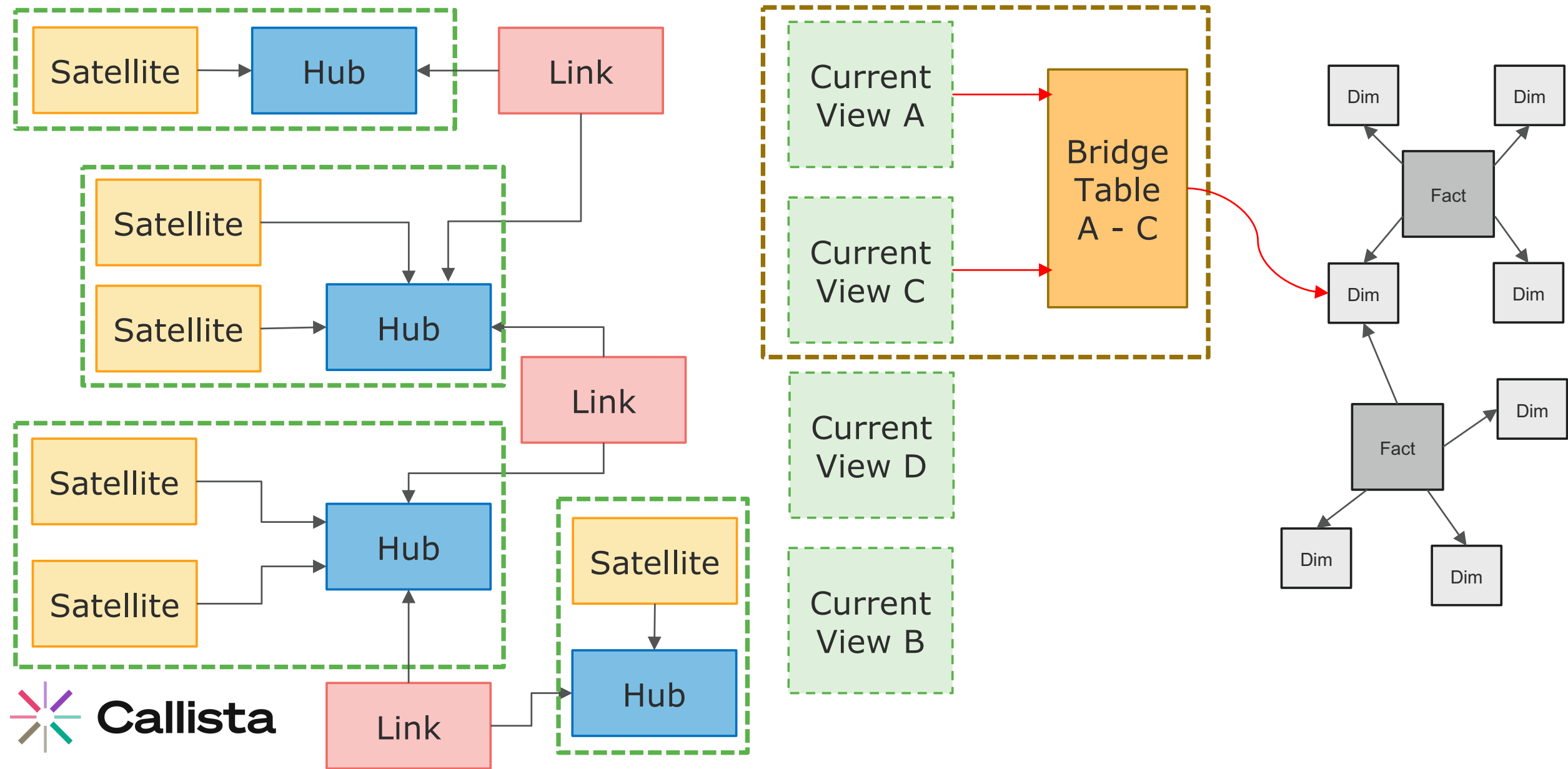
B

C

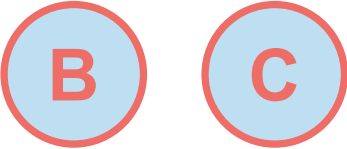
Data Vault + Current Views + Data Marts



Data Vault + Current Views + Bridge Tables



Bridge Table



 BEGIN_DATE	 END_DATE	 CUSTOMER_KEY	 CUSTOMER_BEGIN_DATE	 ADDRESS_KEY	 ADDRESS_BEGIN_DATE
1900-01-01	2010-01-14	3AB7651AF0093FOA	1900-01-01	736B17EC37DE422A	1900-01-01
2010-01-15	2015-09-11	3AB7651AF0093FOA	2010-01-15	736B17EC37DE422A	1900-01-01
2015-09-12	2019-07-30	3AB7651AF0093FOA	2010-01-15	736B17EC37DE422A	1900-01-01
2019-07-31	2019-07-31	3AB7651AF0093FOA	2010-01-15	736B17EC37DE422A	1900-01-01
2019-08-01	2024-08-12	3AB7651AF0093FOA	2010-01-15	736B17EC37DE422A	2019-08-01
2024-08-13	2099-12-31	3AB7651AF0093FOA	2024-08-13	736B17EC37DE422A	2019-08-01



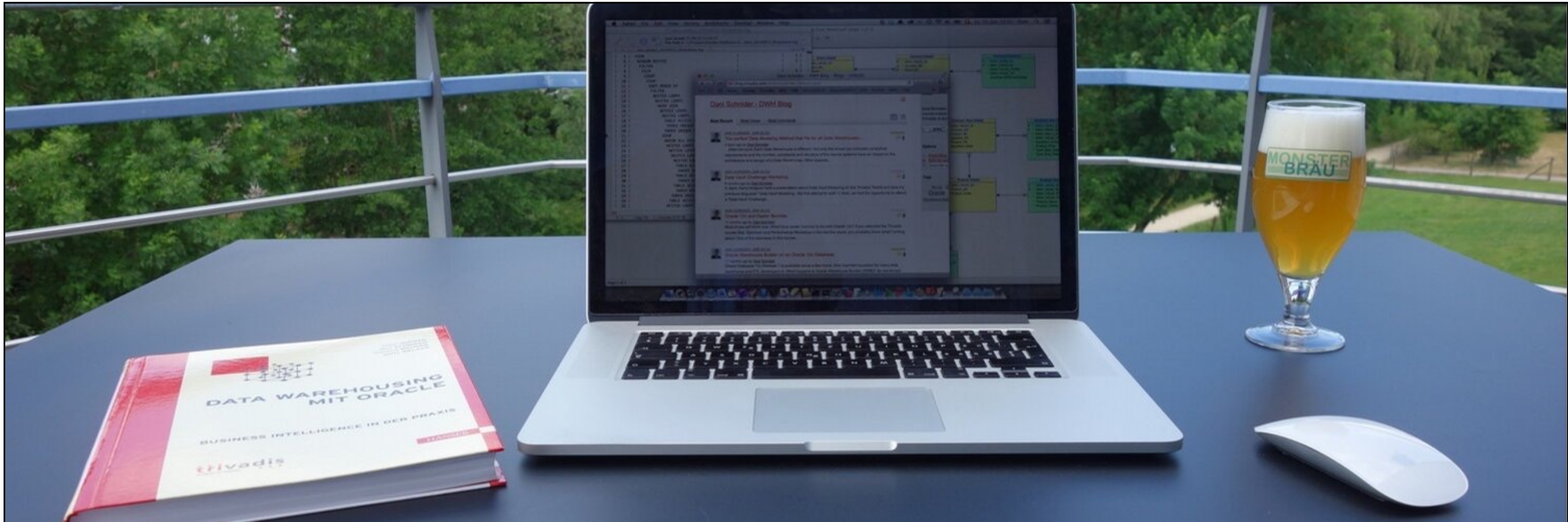
Source: [Golden gate bridge icons created by Freepik - Flaticon](#)

```
CREATE TABLE customer_address_bridge AS
WITH cust_adr_lnk AS (
    SELECT lnk.customer_key
        , cal.address_key
        , cal.begin_date
        , cal.end_date
    FROM address_curr adr
    JOIN customer_address_lnk lnk
    ON cal.address_key = lnk.address_key
)
, valid_dates AS (
    SELECT cus.customer_key AS customer_key
        , cus.begin_date AS valid_date
    FROM customer_curr par
    UNION
    SELECT cus.customer_key AS customer_key
        , cus.end_date+1 AS valid_date
    FROM customer_curr par
    UNION
    SELECT cal.customer_key AS customer_key
        , cal.begin_date AS valid_date
    FROM cust_adr_lnk cal
    UNION
    SELECT cal.customer_key AS customer_key
        , cal.end_date+1 AS valid_date
    FROM cust_adr_lnk cal
)
, pit_intervals AS (
    SELECT customer_key
        , valid_date AS begin_date
        , LEAD(valid_date-1, 1)
            OVER (PARTITION BY customer_key
                ORDER BY valid_date) AS end_date
    FROM valid_dates
)
SELECT pit.begin_date AS begin_date
    , pit.end_date AS end_date
    , cus.customer_key AS customer_key
    , cus.begin_date AS customer_begin_date
    , cal.address_key AS address_key
    , cal.begin_date AS address_begin_date
FROM pit_intervals pit
LEFT JOIN customer_curr cus
    ON pit.customer_key = cus.customer_key
AND pit.begin_date BETWEEN cus.begin_date AND cus.end_date
LEFT JOIN cust_adr_lnk cal
    ON pit.customer_key = cal.customer_key
AND pit.begin_date BETWEEN cal.begin_date AND cal.end_date
WHERE pit.end_date IS NOT NULL
```

Lessons Learned

- Multi-temporale Historisierung ist komplex
- Data Vault für Anforderung gut geeignet
 - Laden ist einfach 😊
 - Lesen komplexer, aber mit Standard-Patterns möglich
- Beschränkung auf eine Zeitachse für Auswertungen
 - Für die meisten BI-User nur fachliche Historisierung relevant
 - Für Spezialanwendungen Zugriff auf Raw Data Vault möglich
- Knowhow-Transfer wichtig!
- Historisierung in Quellsystemen muss stimmen!!!





 <https://danischnider.wordpress.com>

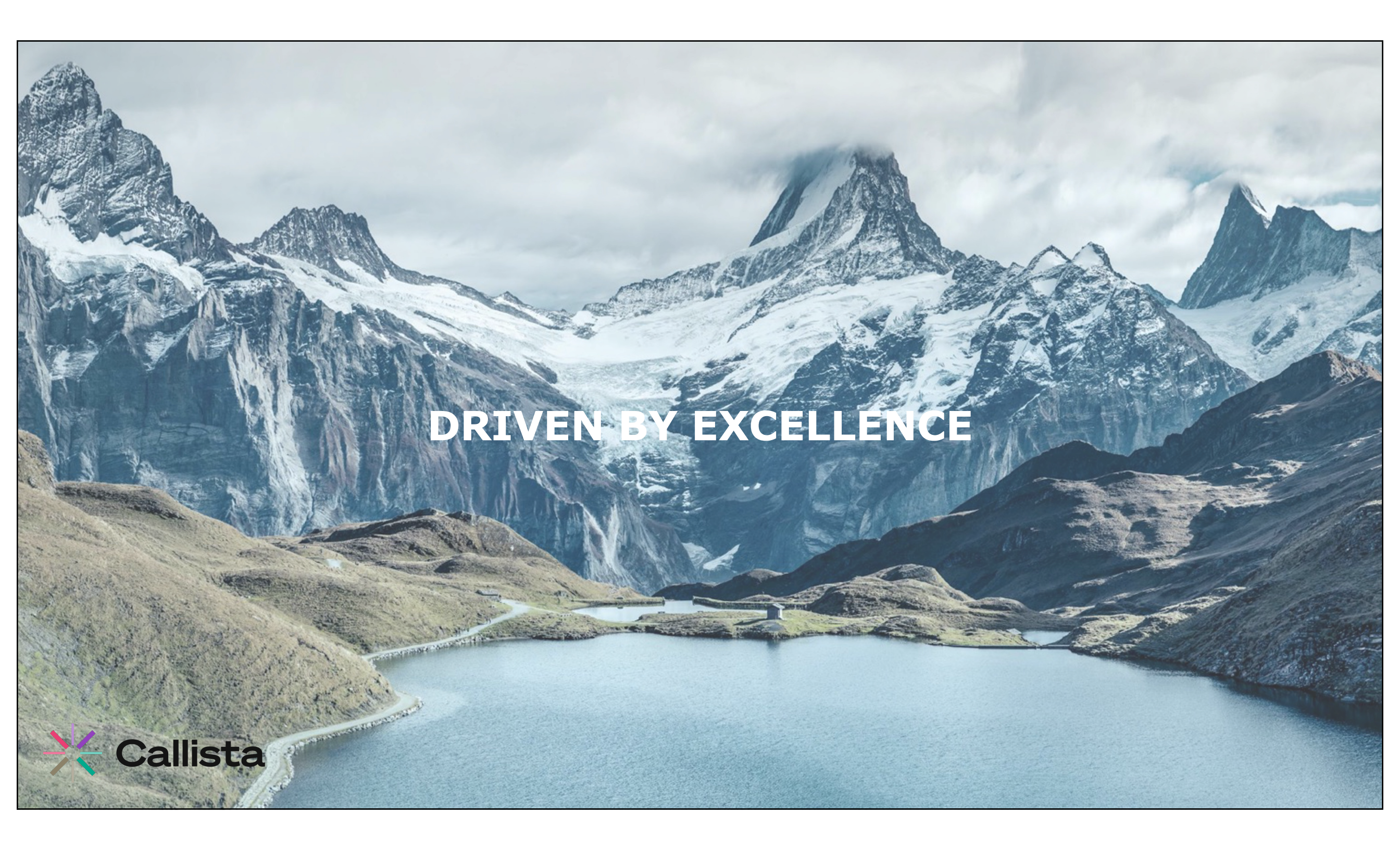
 <https://bsky.app/profile/danischnider.bsky.social>

 <https://www.linkedin.com/in/danischnider/>

Q&A

Feedback



A wide-angle landscape photograph of a mountain range. In the foreground, a calm, blue lake reflects the sky. The middle ground shows rolling hills with sparse, dry vegetation. In the background, towering, rugged mountains with significant snow cover rise against a cloudy sky. The overall tone is serene and majestic.

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Callista