



Bancos de Dados Geográficos

Sistemas de Bancos de Dados Matriciais

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Como armazenar, gerenciar e facilitar
a análise de grandes volumes de
dados de Observação da Terra?

Utilizar conjunto de arquivos
(GeoTIFF, HDF, NetCDF)?

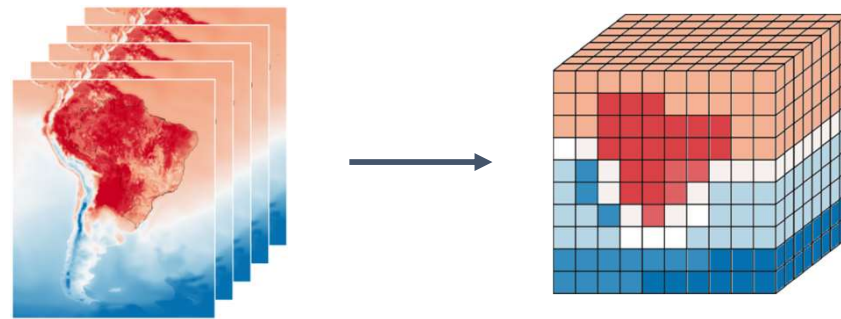
Utilizar um SGBD Relacional
(Oracle GeoRaster, PostGIS Raster)?

Utilizar um NoSQL? Qual?

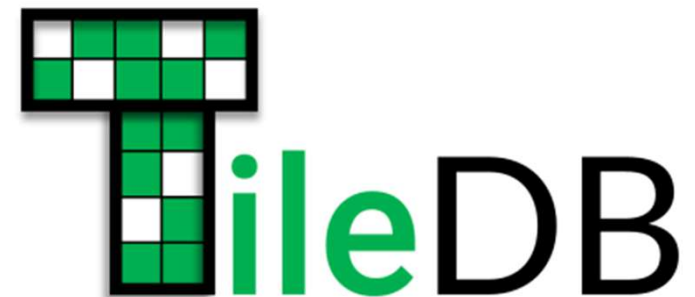
Sistemas de Bancos de Dados Matriciais

SGBD-M

- **Sistemas Gerenciadores de Banco de Dados Matriciais (SGBD-M) – *Array Databases***
- Modelo de dados trata de “*Arrays*”



Modelo mais apropriado para dados intrinsecamente ordenados de forma espacial e/ou temporal



Array Databases

SciDB

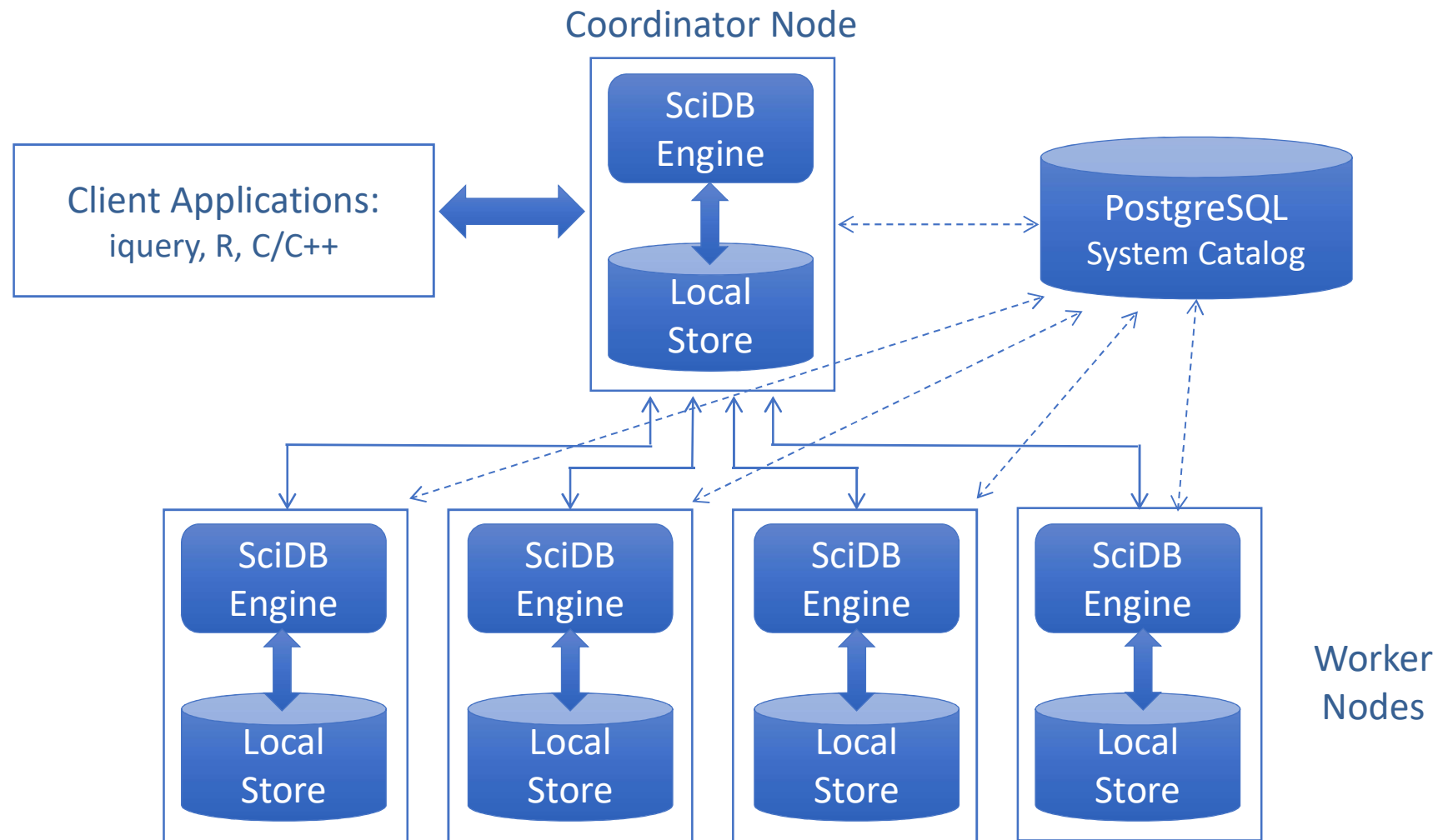


Foto: David.Monniaux, CC BY-SA 4.0

“SciDB is an open-source analytical database oriented toward the data management needs of scientists.”

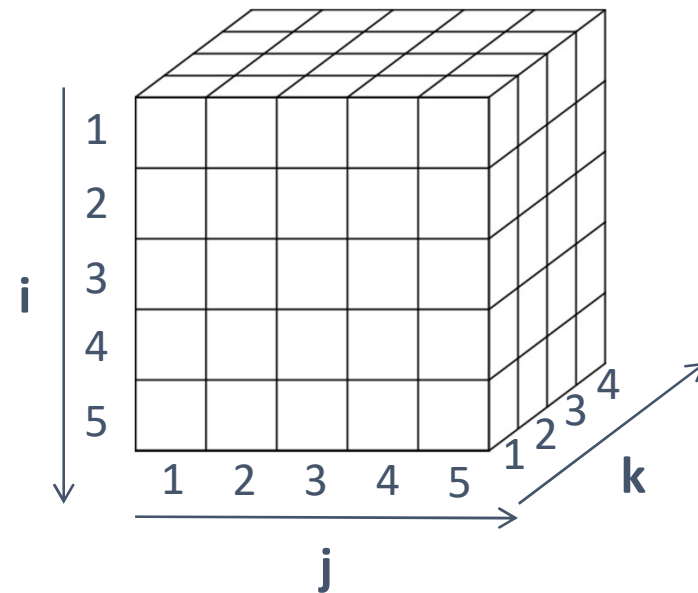
(Stonebraker et al., 2011)

SciDB: Arquitetura



Fote: Adaptado de Paradigm4 (2016)

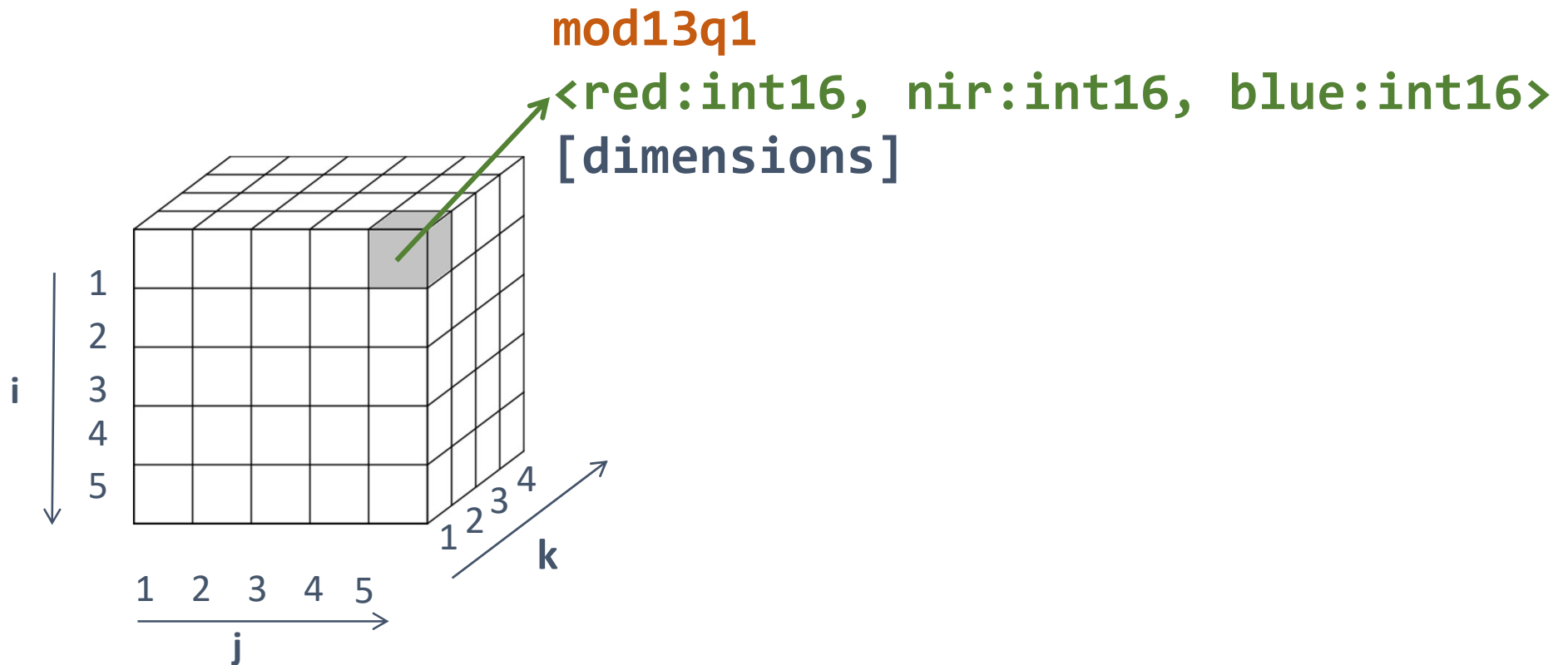
Arrays



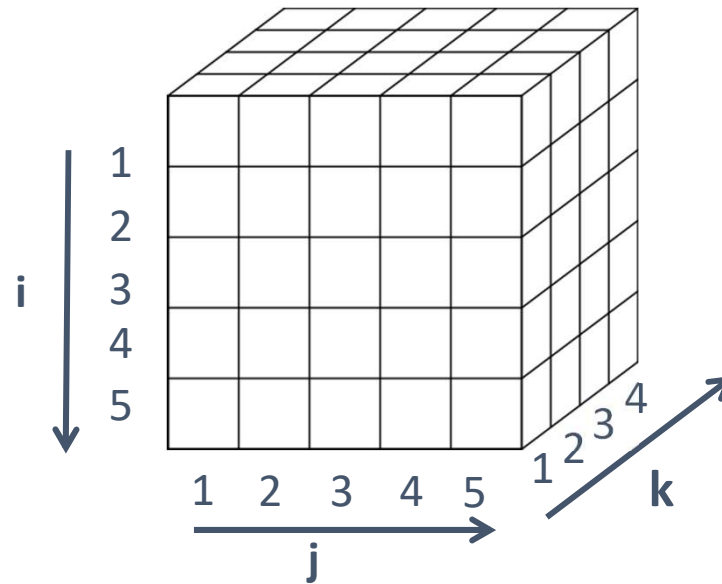
nome <atributos> [dimensões]

SciDB: Atributos

- Cada célula pode ser associada a múltiplos valores.
- Tipos de dados: bool, char, datetime, datetimestz, double, float, int8, int16, int32, int64, string, uint8, uint16, uint32, uint64

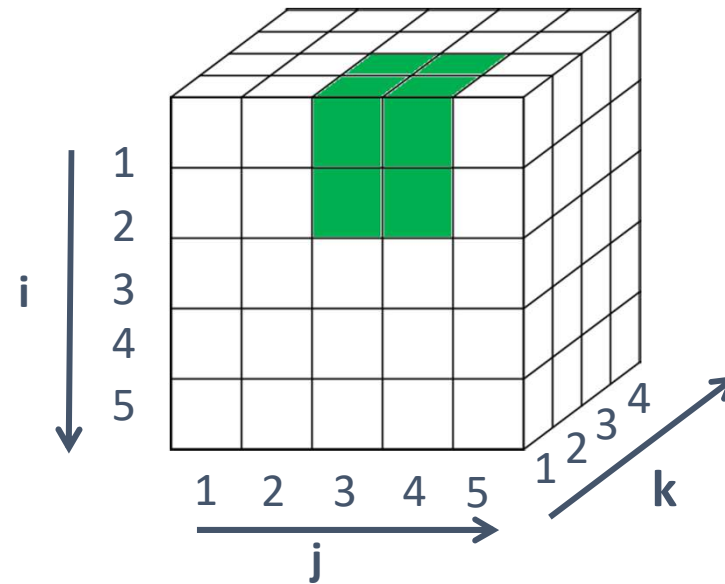


SciDB: Dimensões



```
mod13q1 <red:int16, nir:int16, blue:int16>  
[j=1:5,2,1, i=1:5,2,1, k=1:4,2,1]
```

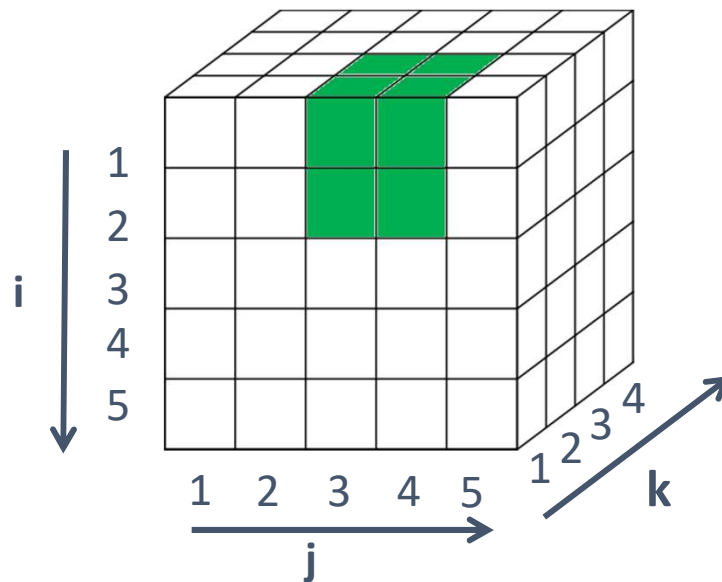
SciDB: Chunks



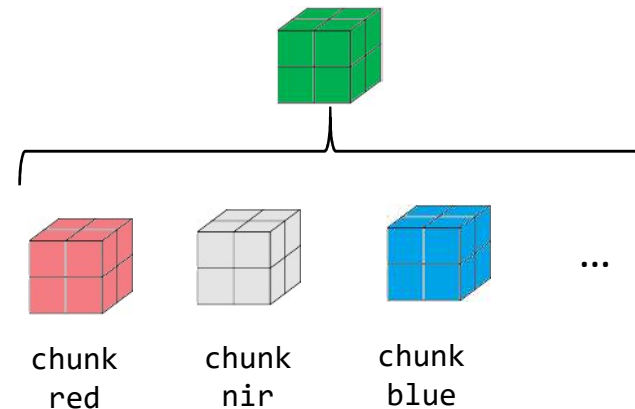
```
mod13q1 <red:int16, nir:int16, blue:int16>  
[j=1:5,2,1, i=1:5,2,1, k=1:4,2,1]
```

Chunk size: 2 x 2 x 2

SciDB: Particionamento Vertical

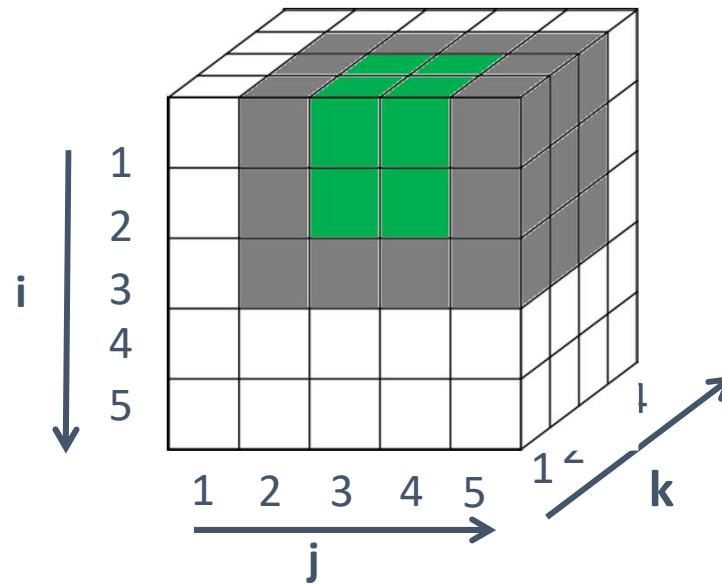


Particionamento Vertical



```
mod13q1 <red:int16, nir:int16, blue:int16>  
[j=1:5,2,1, i=1:5,2,1, k=1:4,2,1]
```


SciDB: Overlap (Replicação)



```
mod13q1 <red:int16, nir:int16, blue:int16>  
[j=1:5,2,1, i=1:5,2,1, k=1:4,2,1]
```

Chunk overlap: 1 x 1 x 1

Linguagens de Consulta

Array Query Language (AQL)

Array Functional Language (AFL)

Array Query Language: AQL

SELECT expression
[**INTO** target_array]
FROM array_expression | source_array
[**WHERE** expression]

individual attributes and dimensions, as well as constants and expressions

new or pre-existing

Array or any expression that returns an array (like sub-queries)

filter parameters on attribute values or dimension bounds

There are DML and DDL clauses

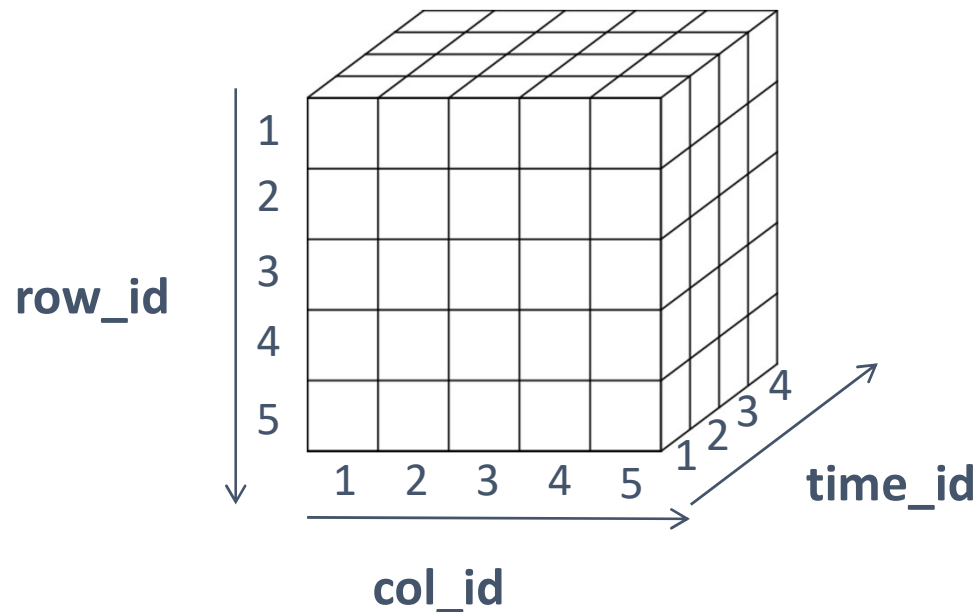
Array Functional Language (AFL)

```
store(  
  build(<num:double>  
    [x=0:8,1,0, y=0:9,1,0],  
    random()  
  ),  
  random_numbers);
```

Consultas em AFL

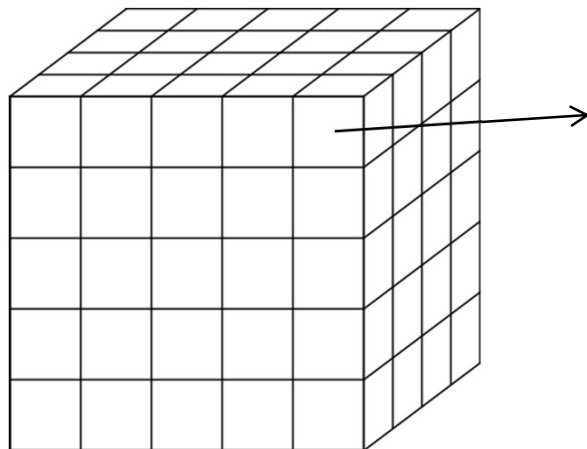
Definindo um Array: mod13q1

```
CREATE ARRAY mod13q1  
<nir:double, red:double, blue:double>  
[col_id=0:4,1,0, row_id=0:4,1,0,  
time_id=0:3,4,0]
```



Creating Array: mod13q1

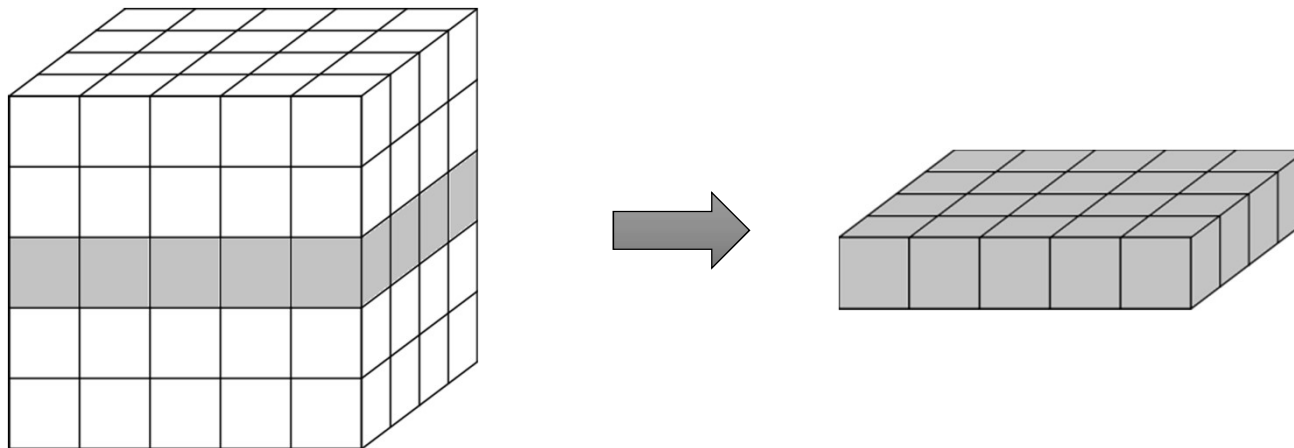
```
store(join(join(  
  build(<val:double>[col_id=0:4,1,0,row_id=0:4,1,0,time_id=0:3,4,0]  
    ,(col_id+(row_id*5)+time_id*(5*5))/1.0),  
  build(<val:double>[col_id=0:4,1,0,row_id=0:4,1,0,time_id=0:3,4,0]  
    ,(col_id+(row_id*5)+time_id*(5*5))/10.0)),  
  build(<val:double>[col_id=0:4,1,0,row_id=0:4,1,0,time_id=0:3,4,0]  
    ,(col_id+(row_id*5)+time_id*(5*5))/100.0) ), mod13q1)
```



nir = val/1.0
red = val/10.0
blue = val/100.0

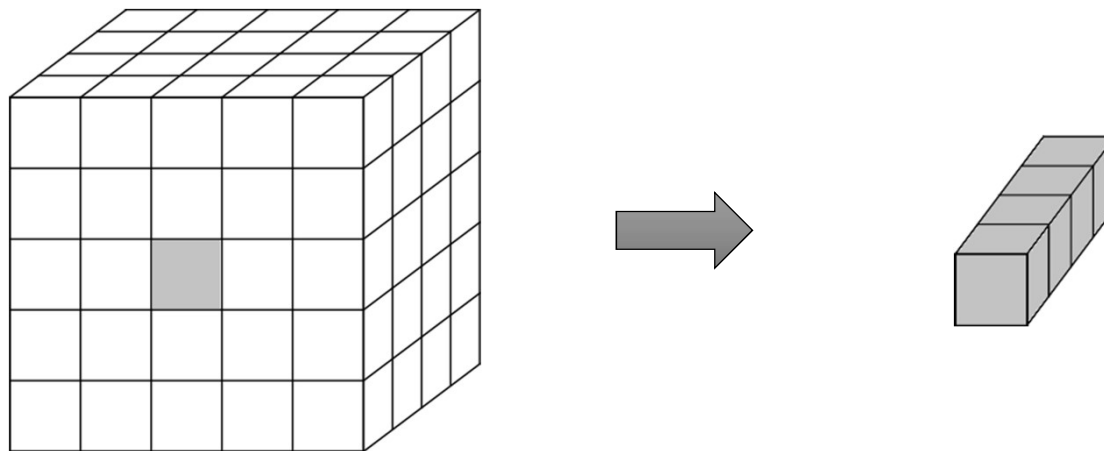
Horizontal Slice

```
subarray(mod13q1,  
         0, 2, 0,  
         4, 2, 3)
```



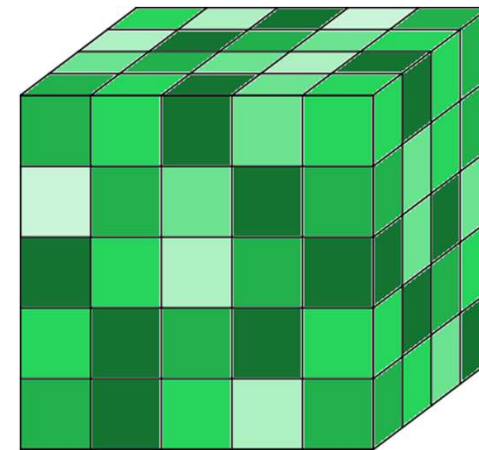
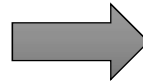
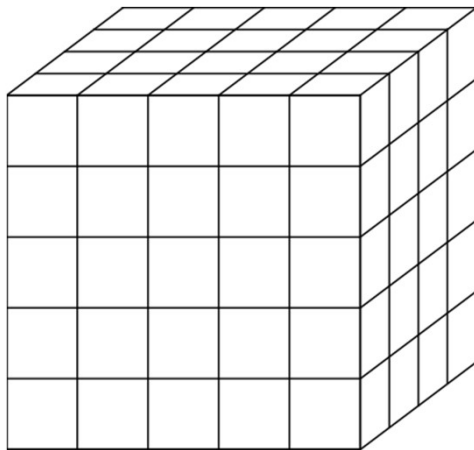
Time Series

```
subarray(mod13q1,  
         2, 2, 0,  
         2, 2, 3)
```



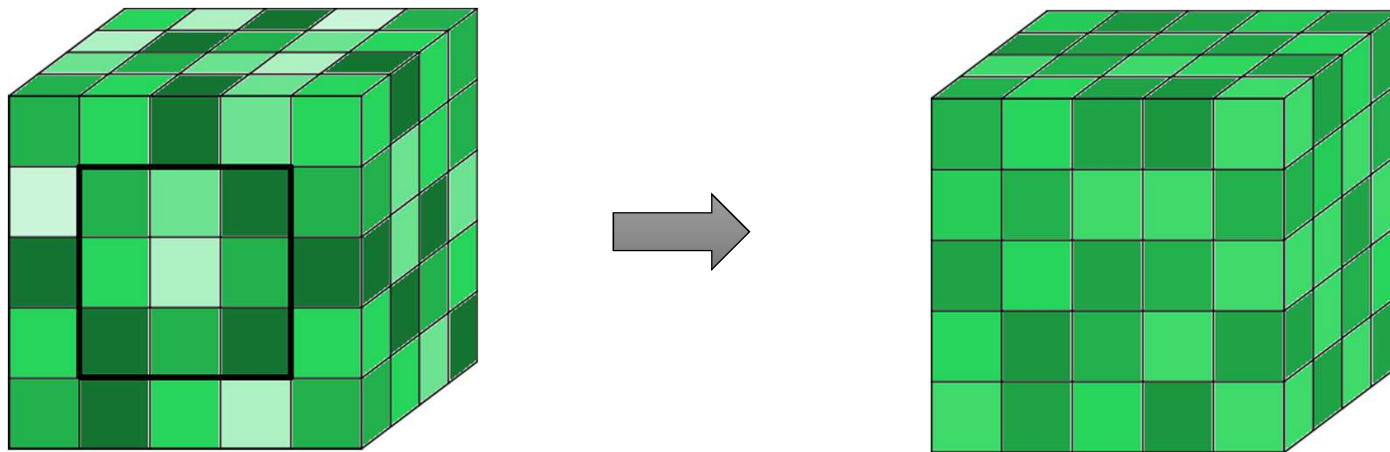
NDVI

```
store (  
  project (  
    apply (  
      mod13q1, new_evi,  
      2.5*(nir-red) /(nir+6.0*red-7.5*blue+1.)  
    ),  
    new_evi ), evi_array);
```



Window Queries

```
store(  
  window(evi_array,  
        0, 2,  
        0, 2,  
        0, 0,  
        avg(new_evi)  
  ),  
  evi_avg);
```



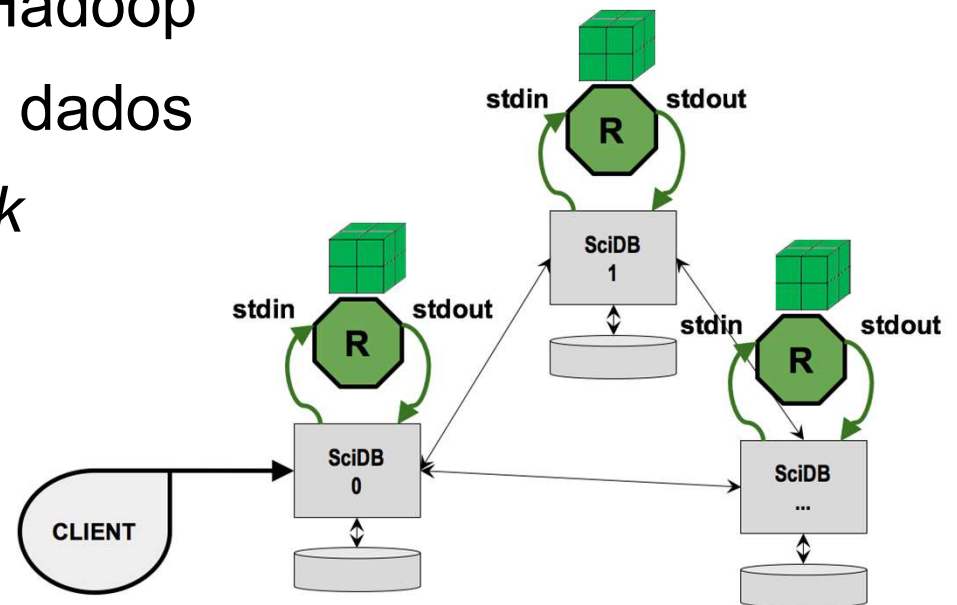
Stream

SciDB: Stream

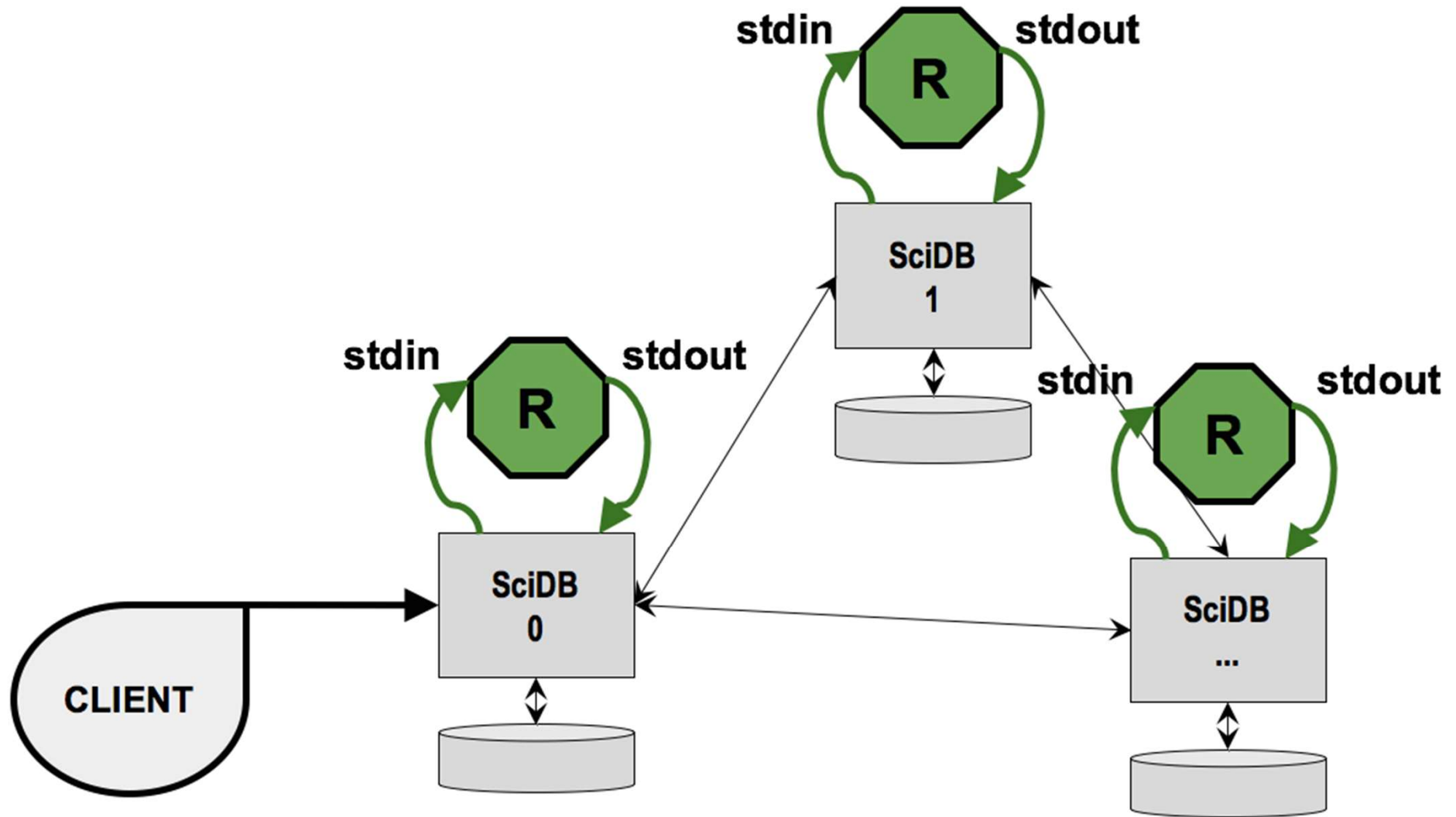


- Plugin Stream
- Abordagem equivalente Hadoop
- Processamento junto aos dados
- Processamento por *chunk*

```
stream(array, '/path/to/app');
```



Fonte: Paradigm4 (2018)

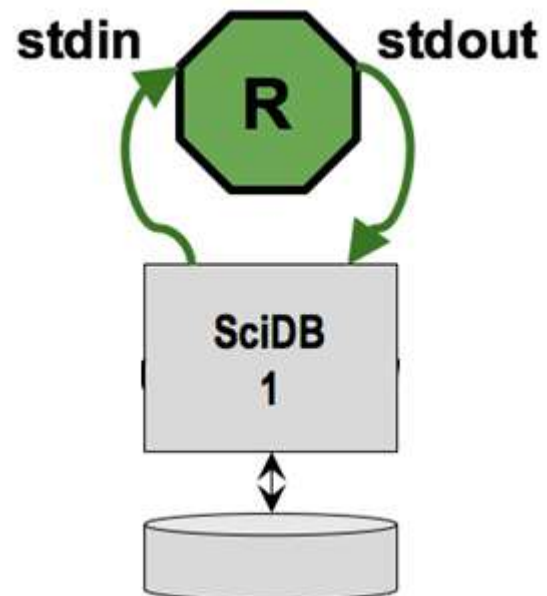


SciDB – Stream

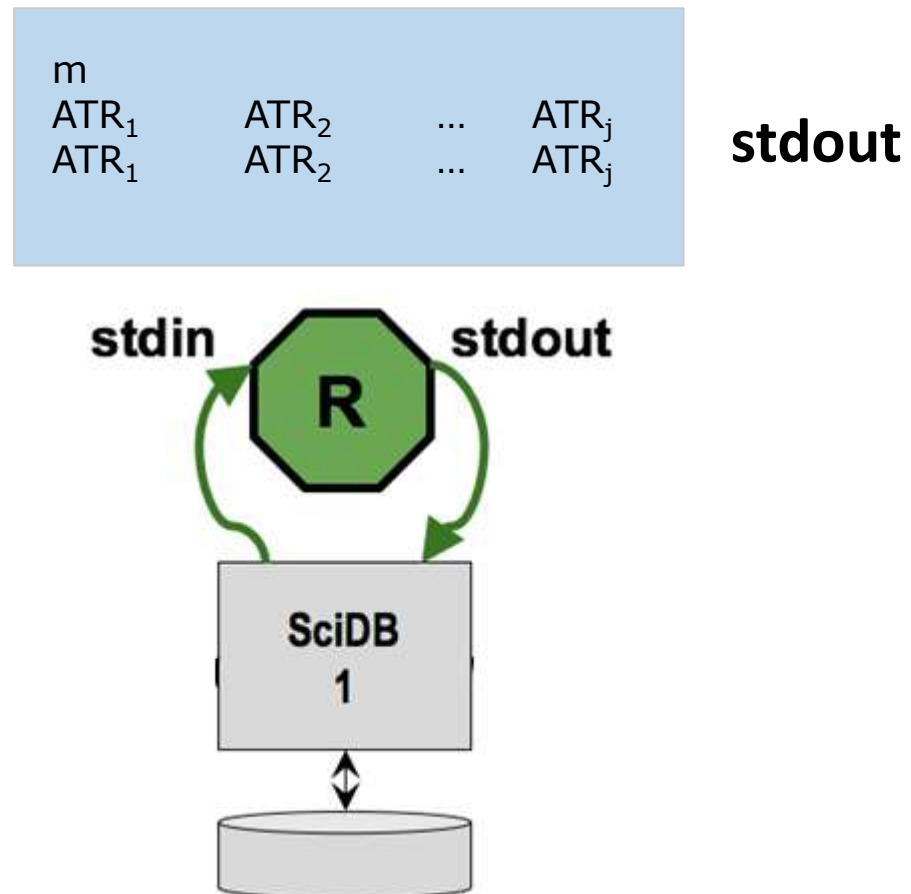
SciDB -> Application

stdin

n			
ATR ₁	ATR ₂	...	ATR _k
ATR ₁	ATR ₂	...	ATR _k
ATR ₁	ATR ₂	...	ATR _k



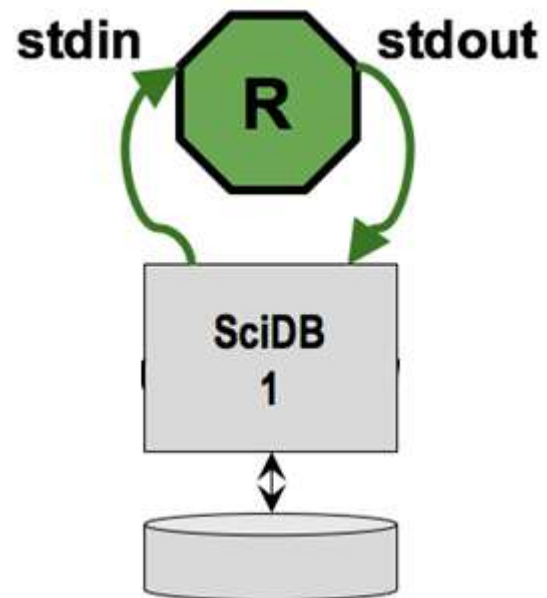
Application -> SciDB



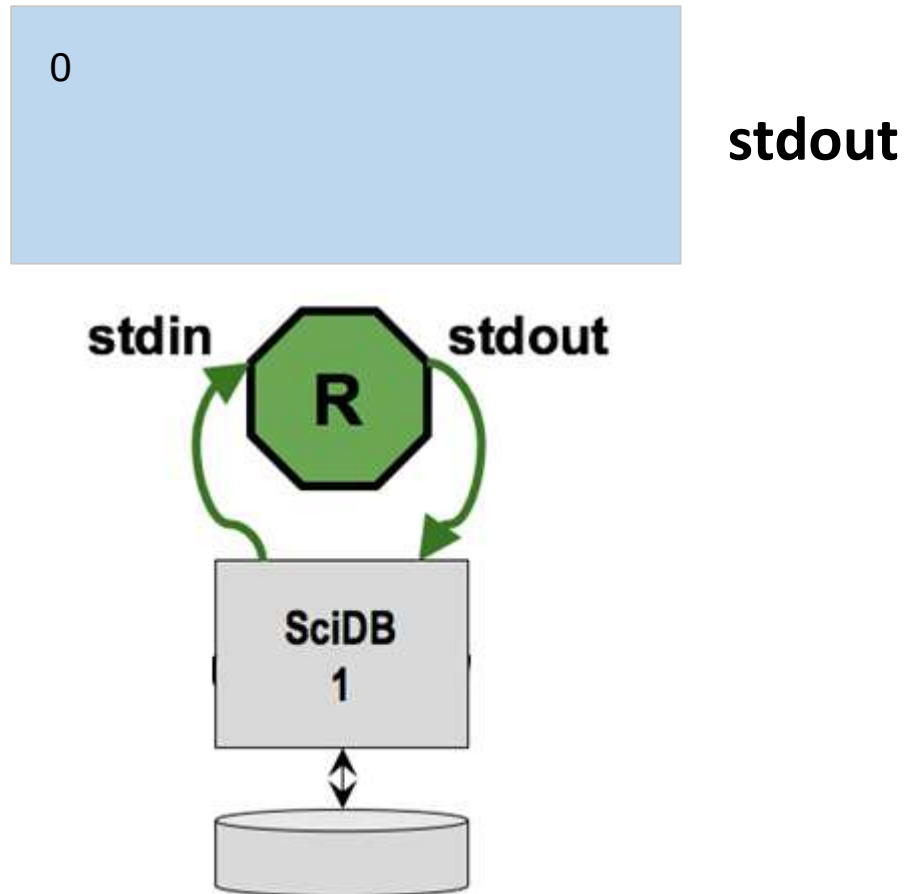
SciDB: Finished

stdin

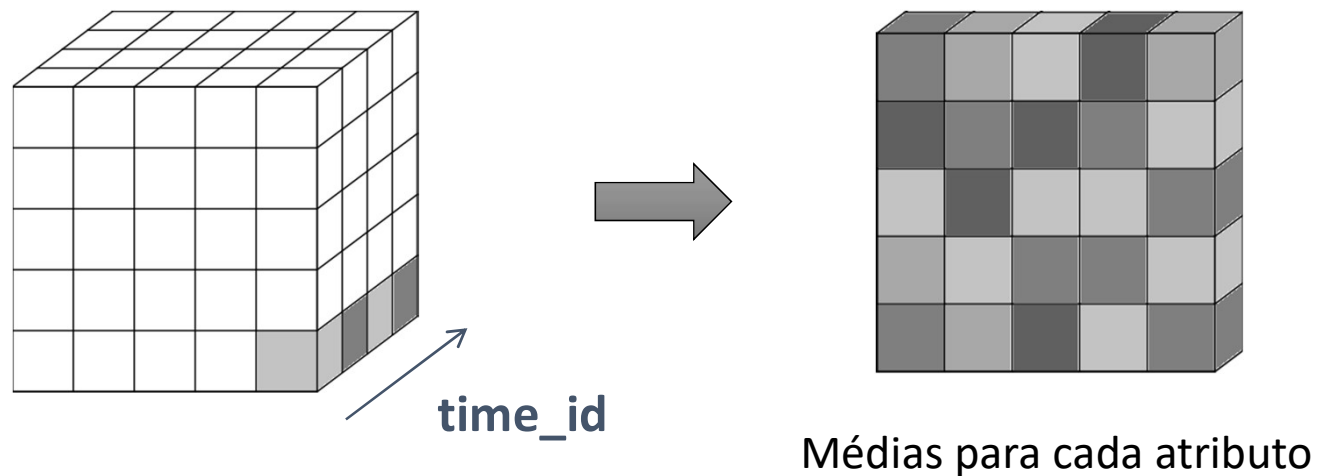
0



Application: Finished



Computing the Average of Time Series



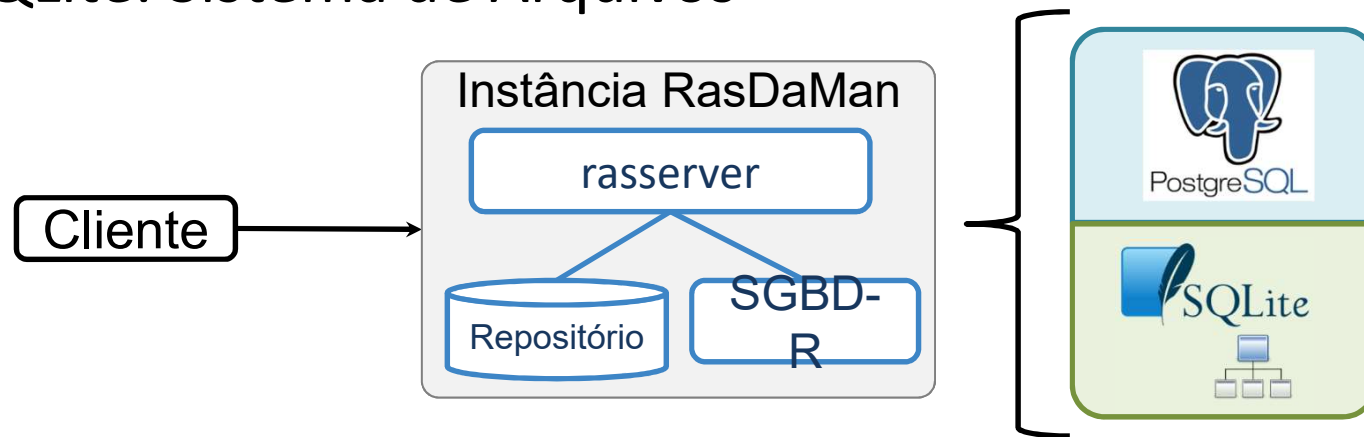
```
stream(mod13q1, '/GeoData/aqua/scidb/avg_time.py')
```

Considerações Finais

RasDaMan



- **Raster Data Manager**
- Clientes: R, Python, Java, C++
- PostgreSQL: campos *blob*
- SQLite: Sistema de Arquivos

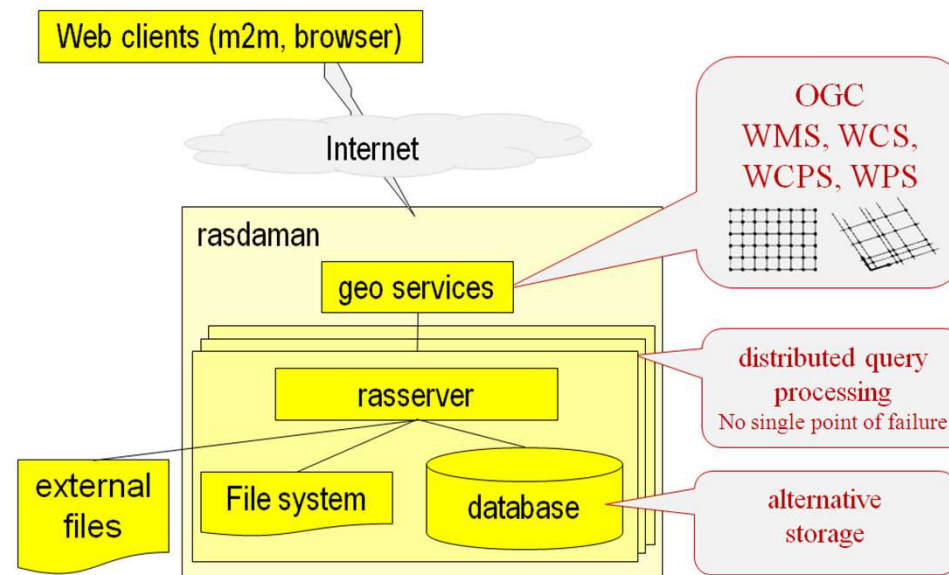


Cluster de computadores somente na versão Enterprise

RasDaMan



- Projeto EarthServer
- Acesso aos dados através de WMS, WCS, WCPS, WPS

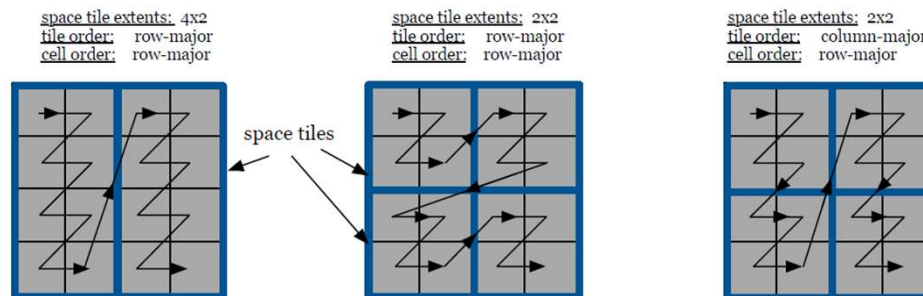


Fonte: [RasDaMan](#) (2018)

TileDB



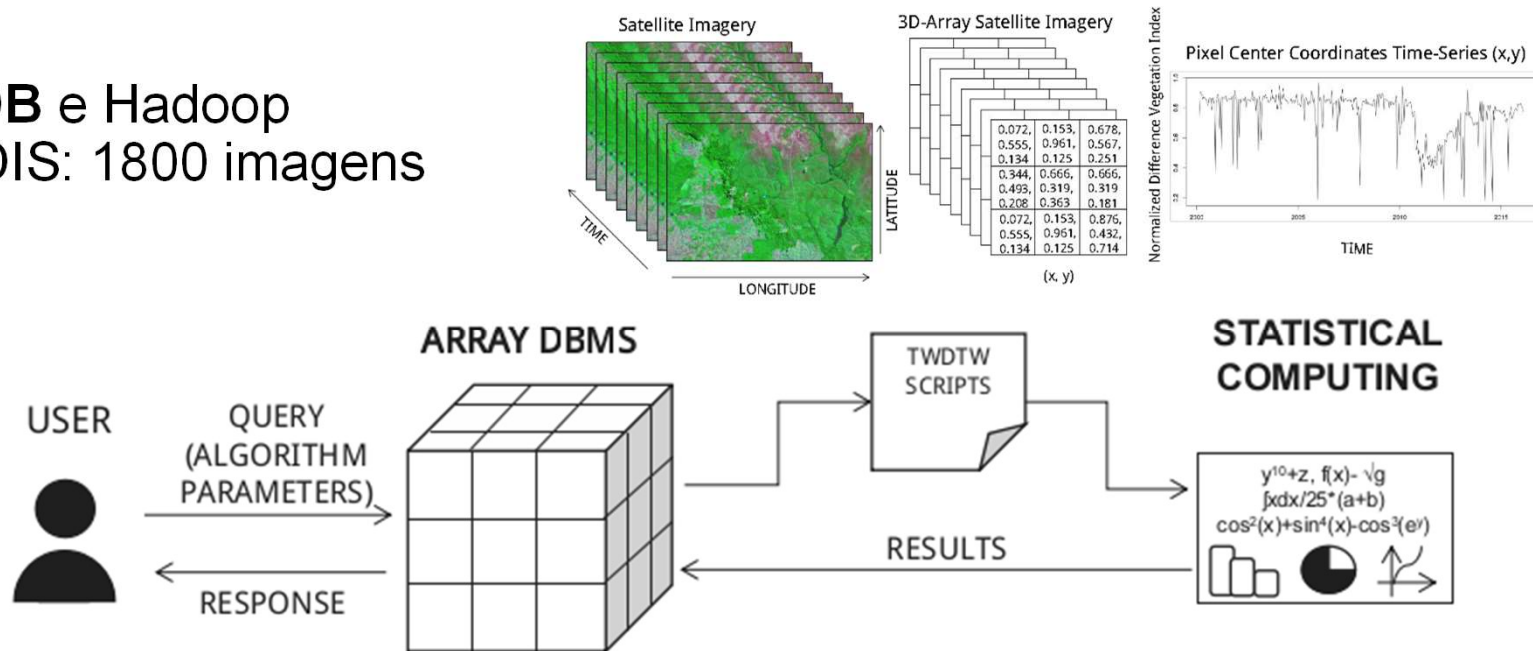
- Biblioteca em C
- Sem distribuição de dados
- Pasta representa o *Array* no Sist. Arq.
- Baixa abstração para acesso aos dados



Architecture for Big EO Data Analytics

Avaliação da arquitetura: análise de série temporal

- **SciDB** e Hadoop
- MODIS: 1800 imagens



Fonte: Câmara et al. (2016)

Considerações Finais

- Nesta aula apresentamos uma classe de sistemas de bancos de dados baseado em um modelo orientado a arrays.
- Álgebra + Linguagem de Consulta matricial.
- Particionamento de Dados e Replicação.
- Escalabilidade.

Referências Bibliográficas

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- Stonebraker, M.; Brown, P.; Poliakov, A.; Raman, S. **The Architecture of SciDB**. Proceedings of the 23rd International Conference on Scientific and Statistical Database Management, SSDBM'11, 2011.
- Paradigm4. [SciDB Documentation](#). Acesso: Agosto de 2016.

Exercícios