

# Zarr vs. HDF5

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Joe Jevnik

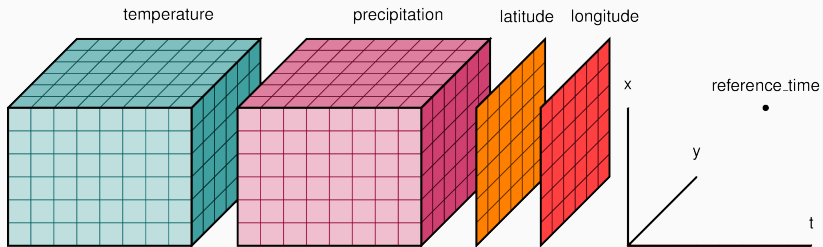
November 4th, 2019

Boston Python

# Core Concepts

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# Multidimensional Data



# Multidimensional Data

|    |    |    |
|----|----|----|
| 00 | 01 | 02 |
| 10 | 11 | 12 |
| 20 | 21 | 22 |
| 30 | 31 | 32 |
| 40 | 41 | 42 |
| 50 | 51 | 52 |

|    |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |   |    |
|----|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|----|
| .. | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | ? | .. |
|----|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|----|

# Row Order

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|----|----|----|
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| 10 | 11 | 12 |
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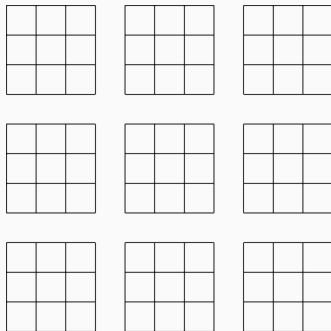
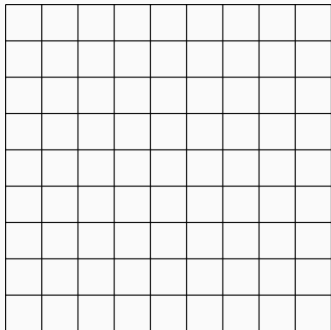
|    |   |   |    |    |    |    |    |    |    |    |    |    |    |    |    |    |    |    |    |    |   |   |    |
|----|---|---|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|---|---|----|
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# Column Order

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|----|---|---|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|----|---|---|----|

# Chunks



reduce io



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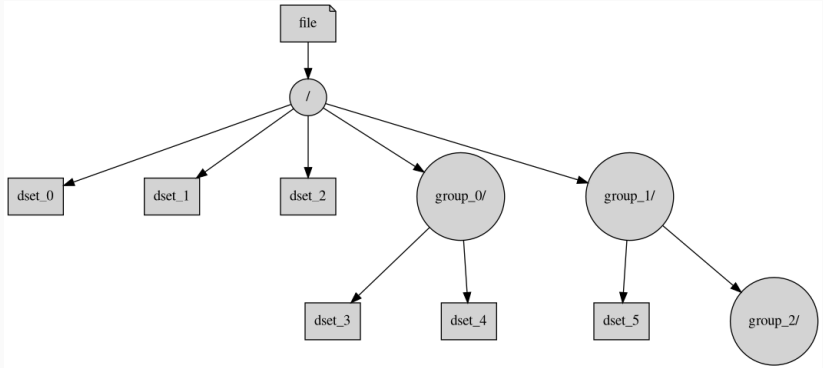
facilitate caching

reduce io

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allow extending the shape of the dataset

# Hierarchy



## **Definition (Dataset)**

a multidimensional array

leaves of a Zarr or HDF5 tree

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## Definition (Node)

either a **dataset** or **group**

## Definition (Attributes)

key-value data

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property of each **node**



# Python Interface

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nested dictionaries

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leaves are *array-like*

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supports numpy-style indexing

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leaves are *array-like*

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NOTE: describes h5py, not pytables

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`Dataset.read_direct` to read into existing buffers

# Making a Decision

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filters and compressors

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# Filters

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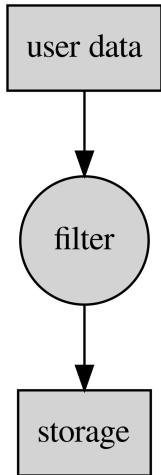
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act on one chunk at a time  
composable  
compressors

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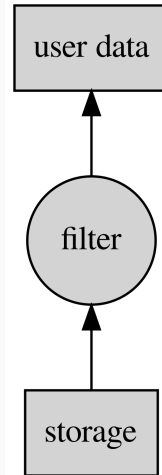
a function that sits between the raw data and the storage  
converts data on read and write  
act on one chunk at a time  
composable  
compressors  
checksumming

# Filters

write



read



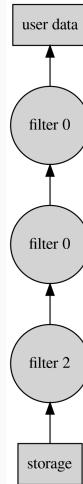


# Filter Pipelines

write



read



## Writing an HDF5 Filter

```
size_t dod_filter(unsigned int flags,  
                  size_t cd_nelmts,  
                  const unsigned int cd_values[],  
                  size_t nbytes,  
                  size_t *buf_size,  
                  void **buf);
```