

# LOFAR Data Storage and Handling

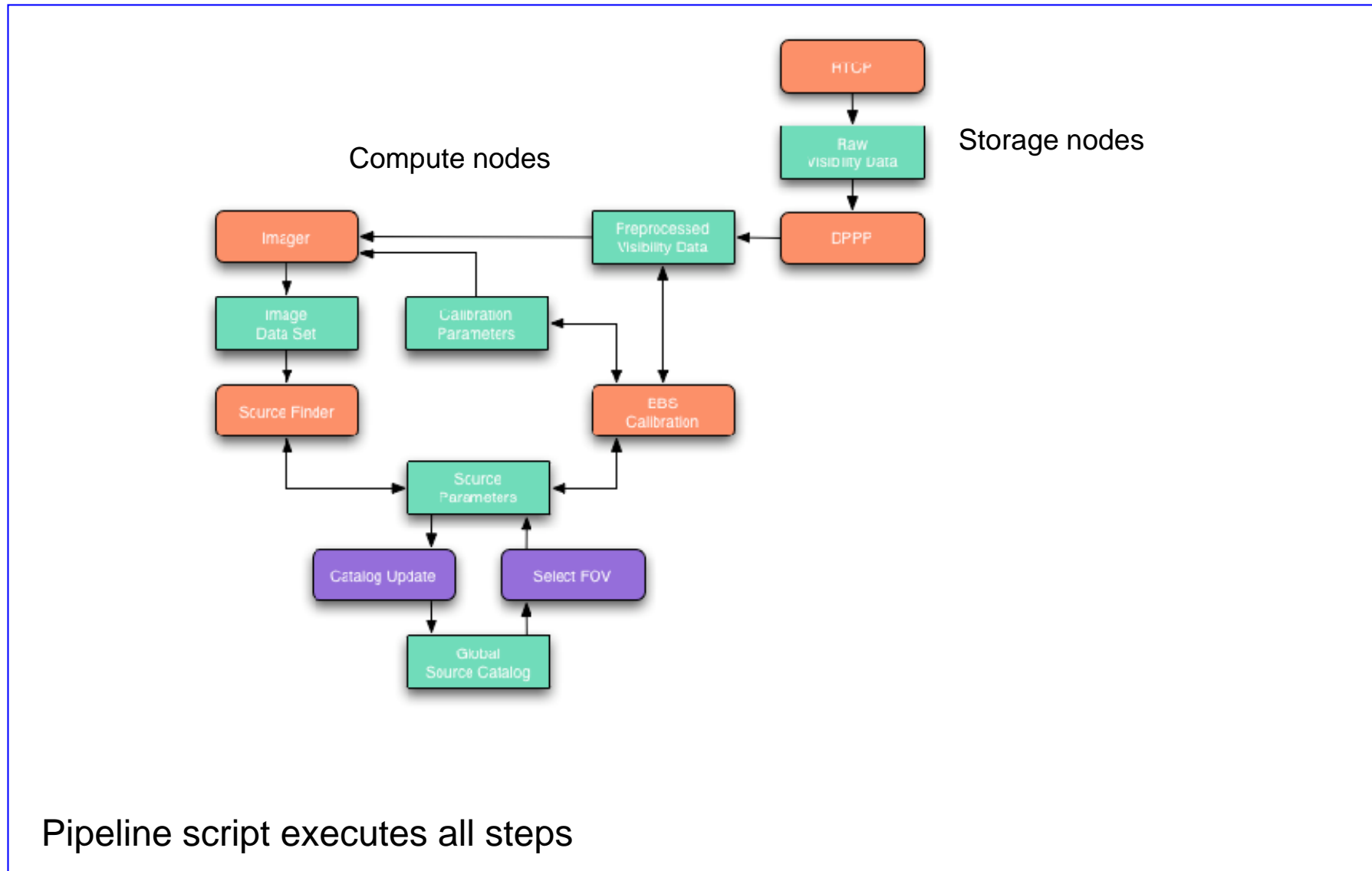
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On behalf of Imaging Pipeline Team

# Outline

- LOFAR Imaging Pipeline data flow and data format
- Data Handling Tools

# Imaging Pipeline data flow



Pipeline script executes all steps

- Data are distributed per subband (up to 248)
  - 256 channels, 64 stations --> up to 4 GB/sec (already 24 TB observation done)
  - Meta file (.gvds file) keeps track of location of all parts
- First processing step (NDPPP):
  - auto-flagging
    - MADFlagger: median(abs(data-median)) thresholding
    - rficonsole: surface fit in time-frequency (see <http://www.astro.rug.nl/rfi-software>)
  - averages data (up to factor 10 in time and freq)
  - writes to compute nodes
- All further processing done on compute nodes
  - Calibration (BBS) solves for time/freq dependent parms; also DDE parms
  - Imaging (ASKAP's or CASA's imager)
  - Source finding
- Results written back to storage nodes to be archived
  
- All subbands are processed individually (embarrassingly parallel)
  - No real need for parallel file system
  - Map/Reduce type of processing
  - If needed (e.g. calibration over subbands) only normal equations are exchanged
  - Multi-threading where applicable

# Pipeline

- Pipeline script executes all steps (single major cycle so far)
  - no archiving step yet
  - fully distributed
    - Uses .gvds file to determine where to start processes
- Job will be automatically started by M&C (almost done)
  - Observation specs should set the pipeline parameters
- Job will be automatically scheduled (work in progress)
  - uses resources like available disk space and computer time
- Written in python
  - Uses ipython for communication
  - Extendible framework
    - Will be used for other pipelines

- Casacore Table System (MeasurementSet) or HDF5
  - HDF5 is used by other LOFAR KSPs
- Casacore MeasurementSets used because:
  - Other packages (CASA, ASKAP) use MeasurementSets
    - Do not want to convert between formats
  - Dedicated storage managers are possible (from dynamically loadable library)
    - RTCP writes visibility data directly (no overhead, robust in case of crash)
    - LofarStMan maps it as a table
    - Note: ALMA/EVLA looking at mapping SDM format to a storage manager
  - Flat data space, thus no predefined ordering (i.e. hierarchy)
    - Easier to form arbitrary subsets
  - HDF5 is slow when accessing small hyperslabs
  - Versatile query language (TaQL) to select or modify data
- Special LOFAR subtables and columns added
  - E.g. Dipole positions per station
- Images can be written in HDF5 or FITS format

casacore, pyrap, and CASA form Jan Noordam's 3rd pillar

## Data Handling

- casacore
  - C++ library
  - Arrays, Math, Tables, MeasurementSets, Measures, Images
- pyrap
  - Python interface to casacore
  - pyrap.quanta, measures, tables, images
  - uses numpy arrays
  - E.g. iterate over cross-correlation baselines in a MeasurementSet

```
t = table('my.ms')
t1 = t.query('ANTENNA1 != ANTENNA2')
for subset in t1.iter(["ANTENNA1", "ANTENNA2"]):
    visdata = subset.getcol ('DATA')
```
- TaQL
  - SQL-like
  - Select, modify, or insert table data
  - E.g. subtract background noise using median in a 51x51 box around each pixel

```
update my.img set map = map - runningmedian(map, 25, 25)
```

- **CASA tools**
  - casabrowser      view and edit a table
  - tableplot        plot one column or expression against another
  - plotms
  - casaviewer (MS and image)
- **Combining and selecting MeasurementSets**  
e.g. select band 0 from an observation split in time (say MSSS)

```
t = table(['ms1', 'ms2', 'ms3'])  
t1 = t.query ('DATA_DESC_ID==0')  
t1.copy ('sel.ms', deep=True)
```
- **Averaging in time/freq**
  - LOFAR's NDPPP
  - Tools in CASA



Table Browser

GER.MS

	UWV	ANTENNA1	ANTENNA2	ARRAY_ID	PROCESSOR_ID	EXPOSURE	FEED1	FEED2	FIELD_ID	F_AG_ROW	INTERVAL
0	[183.035, 1386.46, -2337.42]	0	13	0	-1	9.9549184...	0	0	0	0	10
1	[176.584, 1337.6, -2255.05]	0	12	0	-1	9.9549184...	0	0	0	0	10
2	[172.540, 1312.07, -2214.57]	1	13	0	-1	9.9549184...	0	0	0	0	10
3	[166.128, 1263.25, -2132.17]	1	12	0	-1	9.9549184...	0	0	0	0	10
4	[164.871, 1237.6, -2091.55]	2	13	0	-1	9.9549184...	0	0	0	0	10
5	[158.372, 1188.83, -2009.12]	2	12	0	-1	9.9549184...	0	0	0	0	10
6	[153.45, 1164.71, -1967.88]	3	13	0	-1	9.9549184...	0	0	0	0	10
7	[147.022, 1115.93, -1885.46]	3	12	0	-1	9.9549184...	0	0	0	0	10
8	[145.271, 1092.64, -1843.47]	4	13	0	-1	9.9549184...	0	0	0	0	10
9	[138.778, 1043.81, -1761.08]	4	12	0	-1	9.9549184...	0	0	0	0	10
10	[132.635, 1018.26, -1720.78]	5	13	0	-1	9.9549184...	0	0	0	0	10
11	[126.28, 969.486, -1638.35]	5	12	0	-1	9.9549184...	0	0	0	0	10
12	[127.222, 944.644, -1597.08]	6	13	0	-1	9.9549184...	0	0	0	0	10
13	[120.655, 895.891, -1514.65]	6	12	0	-1	9.9549184...	0	0	0	0	10

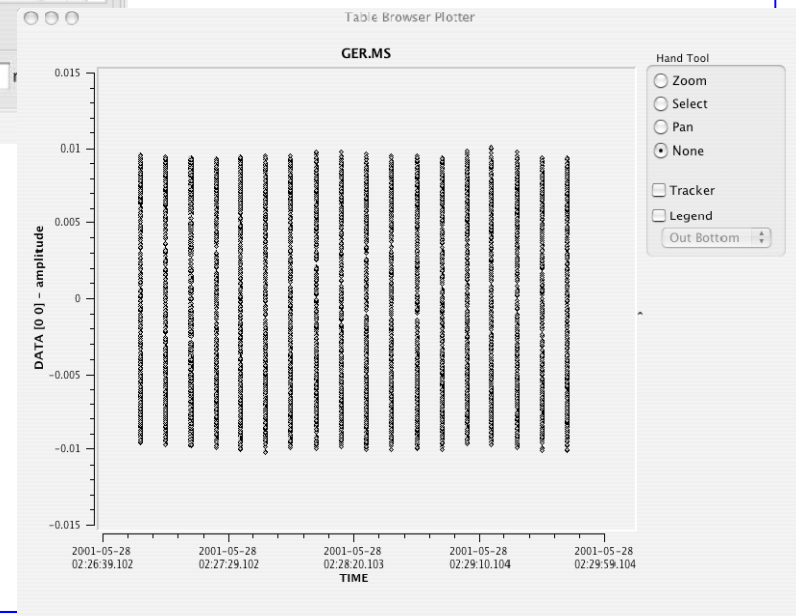
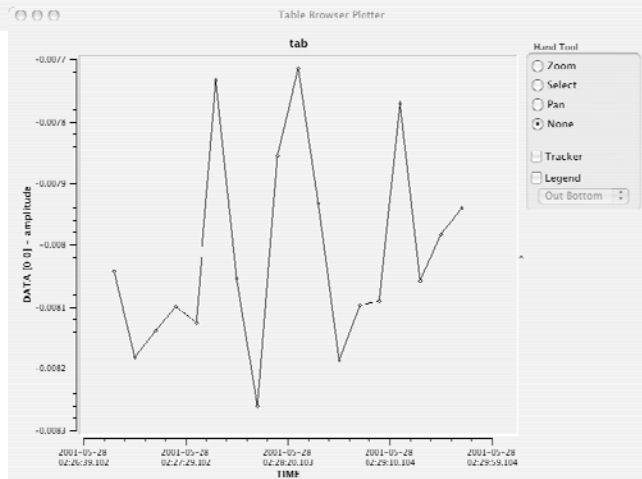
field keywords | table keywords | table data

Restore Columns | Resize Headers

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```
python
from pyrap.tables import *
t = table('GER.MS')
t1 = t.query('DATA DESC ID=0')
t1.browse()
```

```
casabrowser ('GER.MS')
```



# casaviewer (MS)

```
python
from pyrap.tables import *
t = table('GER.MS')
t1 = t.query('DATA_DESC_ID=0')
t1.view()
```

```
casaviewer ('GER.MS')
```

Sorting... Done.

/Users/diepen/3C343.MS  
Selected MS: Time slots: 1437 Baselines (incl. gaps): 15  
Correlations: 4 Channels: 64 Spectral Windows: 1

Loading MS vis. data: 28% 47% 80% 89% Done.

Resorting MS vis. data: 38% 95% Done.

The screenshot displays the casaviewer interface for the file 3C343.MS. The main window, titled "Viewer Display Panel", features a toolbar at the top and a central plot area. The plot is a heatmap with "Time" on the vertical axis (ranging from 0 to 1400) and "Baseline (m) x10<sup>E</sup>" on the horizontal axis (ranging from 0 to 1). The plot shows a dense pattern of orange and yellow lines, indicating signal intensity across different baselines and time slots. To the right of the plot is a "Data Display Options" panel for "3C343.MS". This panel has sections for "Advanced" and "MS and Visibility Selection". Under "Display Axes", the X-axis is set to "Baseline", the Y-axis to "Time", and the Animation Axis to "Channel". There are sliders for "Correlation" and "Spectral Window", both currently set to 0. The "Baseline Sort" is set to "Baseline Length". The "Flagging Options" section includes "Show Flagged Regions..." set to "In Color", "Should new edits flag or unflag?" set to "Flag", and checkboxes for "Times", "Channels", "Spectral Windows", "Baselines", and "Correlations". There are also buttons for "Flag/Unflag All...", "Flag/Unflag Entire Antenna?" (set to "No"), and "Undo Last Unsaved Edit (if any)" (labeled "Undo One"). At the bottom of the interface is a status window for "3C343.MS" showing the following information: 2.261 Jy, 03-Aug-2000 15:00:15 (t 196) Scan 590, 3C343.1 (Field 0) 7-10 324m (b 40), Sp Win 0 (s 0) 1.175156 GHz (ch 31) XX (cor 0). Below the plot and control panels are several sliders and buttons: "Rate" set to 10 /sec. with a "Compact" button, and "Frame" with "Start" at 0, "End" at 63, and a "Step" field.

## C++ library for astronomical data handling

- Arrays templated N-dim arrays (STL-conforming)
- Tables storage mechanism with TaQL query language
- MeasurementSet visibility data storage and access (using Tables)
- Measures values in frame (direction, position, epoch, ...)
- Coordinates world coordinates for images
- Images N-dimensional image cubes with 0 or more masks  
□(also supports HDF5, FITS, Miriad, expressions (LEL))

- Used by LOFAR, ASKAP, ALMA, eVLA, MeqTrees, pyrap, pydal

- See

Download	<a href="http://casacore.googlecode.com">casacore.googlecode.com</a>
Classes	<a href="http://www.astron.nl/casacore/trunk/casacore/doc/html">www.astron.nl/casacore/trunk/casacore/doc/html</a>
TaQL	<a href="http://www.astron.nl/casacore/trunk/casacore/doc/notes/199.html">www.astron.nl/casacore/trunk/casacore/doc/notes/199.html</a>
LEL	<a href="http://www.astron.nl/casacore/trunk/casacore/doc/notes/223.html">www.astron.nl/casacore/trunk/casacore/doc/notes/223.html</a>
MS definition	<a href="http://www.astron.nl/casacore/trunk/casacore/doc/notes/229.html">www.astron.nl/casacore/trunk/casacore/doc/notes/229.html</a>

- Collection of rows and columns in a flat data space (no hierarchy)
  - scalars and N-dim arrays of basic data types (incl. complex and string)
  - keywords (headers) to define subtables and units/reference frames
- Several table types:
  - Plain table
    - contains the data columns and rows
  - Reference table
    - view of another table (result of selection, sort, or iteration)
    - only contains references to rows, columns, and subtables
  - Concat table
    - virtual concatenation of similar tables
    - subtables can be concatenated at will
- Persistent or transient
  - persistent as a directory containing various files and optional subtables
- Concurrent access (one writer, multiple readers)

# Table storage



- Various data (storage) managers
  - StandardStMan  
columnar storage; for scalars or small fixed arrays (like UVW)
  - IncrStMan  
rather constant data (gets compressed)
  - TiledStMan  
bulk data (tiling gives fast access for all axes)
  - Dynamically loadable dedicated data managers (e.g. LofarStMan)
    - can map an existing format to a table (if randomly accessible)
    - plans to implement mapping of the SDM format (ALMA/EVLA)
  - Virtual columns (calculated on the fly); e.g. PA, HA

## Collection of Tables containing visibility data

- Described in note 229 ([www.astron.nl/casacore/trunk/casacore/doc/notes/229.html](http://www.astron.nl/casacore/trunk/casacore/doc/notes/229.html))
  - Predefined structure of subtables and columns
  - Instrument-specific subtables and columns can be added
- Main table has data columns DATA and FLAG
    - Per row 2-dim array with axes frequency and polarisation
    - Indexed by columns containing baseline (antenna1 and antenna2), time, band, subarray, etc.
  - Subtables define meta data  
ANTENNA, ARRAY, FEED, FIELD, SPECTRAL\_WINDOW, ...  
Some subtables are optional
  - C++ headers in ms/MeasurementSets
  - No specific Python code; use pyrap.tables

- N-dim cube (ra, dec, freq, pol, ...) with world coordinates
- Two native formats
  - Tables, HDF5
  - Tiled storage
  - data type float, double, complex, or dcomplex
  - zero or more masks
- Two external formats (readonly)
  - FITS and Miriad
  - Non-tiled storage (FITS proposal for tiling)
  - data type float only
- Virtual concatenation of images (e.g. to combine subbands)
- Image expressions using LEL (e.g. difference of images)

See [www.astron.nl/casacore/trunk/casacore/doc/notes/223.html](http://www.astron.nl/casacore/trunk/casacore/doc/notes/223.html)

## Table Query Language

[www.astron.nl/casacore/trunk/casacore/doc/notes/199.html](http://www.astron.nl/casacore/trunk/casacore/doc/notes/199.html)

- SQL-like with support for arrays and units
- Subqueries
- SELECT, UPDATE, INSERT, DELETE, CREATE TABLE, CALC
- No join, GROUPBY/HAVING
- Uses Python style (0-based indexing, C array order, end exclusive)

```
Select from my.ms orderby unique TIME
Select unique TIME from my.ms
    get unique times
```

```
Select from my.ms where ntrue(FLAG) == 0
Select from my.ms where not any(FLAG)      # faster way
    find rows without flagged data
```

```
Update my.ms set FLAG[,0]=FLAG[,0] || amplitude(DATA[,0]) > 3*median(amplitude(DATA[,0]))
    flag XX data based on a simple median filter (per row)
```

```
Update my.img set map = map - runningmedian(map, 25, 25)
    subtract background noise from image using median in a 51x51 box around each pixel
```

```
Insert into my.ms/HISTORY (TIME,MESSAGE) values (mjd(), "historystring")
    add a line to the HISTORY table of a MeasurementSet (converts automatically to sec)
```

```
Calc date()-"1Jan2000"
    how many days since 1-1-2000
```



Can be used from:

- C++

```
#include <tables/Tables/TableParse.h>
Table tab = tableCommand ('command');
```

- Python

```
import pyrap.tables as pt
t1 = pt.taql ('select col1, col2 from sometable where col1=1
              orderby col1,col2 giving outname')
```

or

```
t = pt.table('sometable')
t1 = t.query ('col1=1', sortlist='col1, col2', columns='col1, col2',
              name='outname')
```

- shell

```
taql 'select col1, col2 from sometable where col1=1 ...'
```

In C++ also

```
#include <tables/Tables/ExprNode.h>
Table t('sometable')
Table t1 = t(t.col('col1') == 1);
```

## python interface to casacore

- Manipulate tables, images from python
- data as numpy arrays in row major order (reverses axes!)  
pyfits does the same

## pyrap.tables

create, read, write, selection, sort, iteration, display

## pyrap.images

LEL, read, write, tofits, statistics, regrid, display

## pyrap.quanta and pyrap.measures

measures and frames conversions

## pyrap.functionals and pyrap.fitting

fitting of data to function parameters (1-dim or more)

## See

Download  
Modules

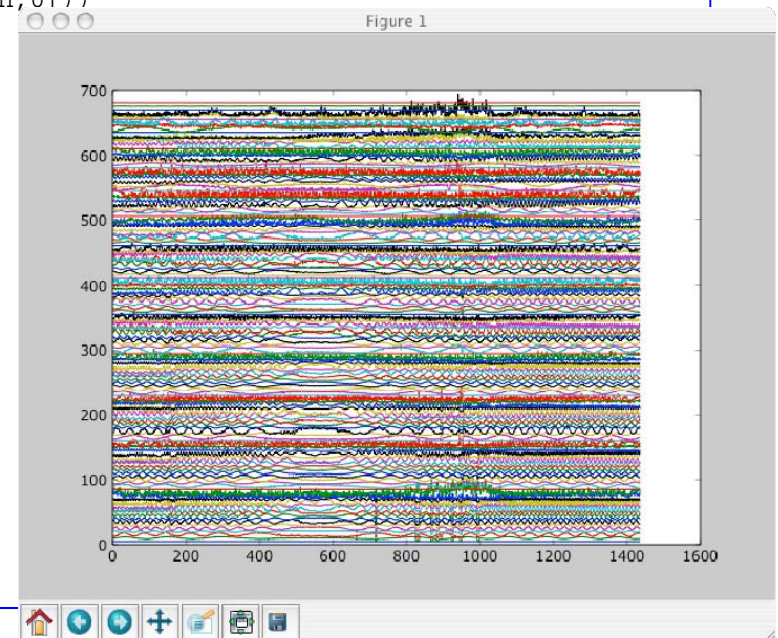
[pyrap.googlecode.com](http://pyrap.googlecode.com)

[www.astron.nl/casacore/trunk/pyrap/docs](http://www.astron.nl/casacore/trunk/pyrap/docs)

# pyrap.tables

```
import numpy
import pylab
import pyrap.tables as pt

def plottbl (ms, band=0, ch=0, sep=5.0, fig=None):
    t = pt.table(ms);
    t1 = t.query ('DATA_DESC_ID=%d' % band)
    pylab.figure(fig)
    pylab.clf()
    offset = 0.0
    for t2 in t1.iter(["ANTENNA1", "ANTENNA2"]):
        # Get XX data of given channel
        ampl = numpy.absolute (t2.getcolslice("DATA", [ch,0], [ch,0]))
        sc = sep/numpy.mean(ampl)
        ampl = ampl.reshape(ampl.shape[0])
        pylab.plot(sc*ampl + offset)
        offset += sep
    pylab.show()
```



# table manipulation



```
# select a spectral band from an MS

# in python
from pyrap.tables import *
t=table('3C343.MS')
t1 = table.query('DATA_DESC_ID=0', name='3C343_SPW0.MS') # results in ref table
t1.copy ('3C343_SPW0.MS', deep=True) # results in plain table

Or

# in shell
taql 'select from 3C343.MS where DATA_DESC_ID=0 giving 3C343_SPW0.MS as plain'

# Concatenate MSSS observations of same field
t=table(['MSSS_p0.MS', 'MSSS_p1.MS', 'MSSS_p2.MS'], concatsubimage='SYSCAL')
t.copy ('MSSS.MS')
```

Uses numpy masked arrays

- for image mask=True means bad pixel; numpy opposite
- hence, getmask and putmask negate mask automatically

```
import pyrap.images as pim
im = pim.image('my.img')
print im.statistics()
npmaskedarray = im.get()
nparray = im.getdata()
im.tofits ('fitsfile')
im.view()

# image expression
im = pim.image("(image1 + image2 + image3) / 3")
im.saveas ('avgimage')

# image concatenation
im = pim.image(['image1', 'image2', 'image3'])
im.saveas ('concimage')
```

- ALMA and EVLA data processing package
  - Based on casacore
- Has some useful tools:
  - casabrowser
    - view data in tabular way
    - editing, plotting, querying
  - casaviewer
    - viewing images (also FITS, Miriad, HDF5, expressions)
    - viewing and flagging MeasurementSets
  - plotms, tableplot
- Can be used from command line:

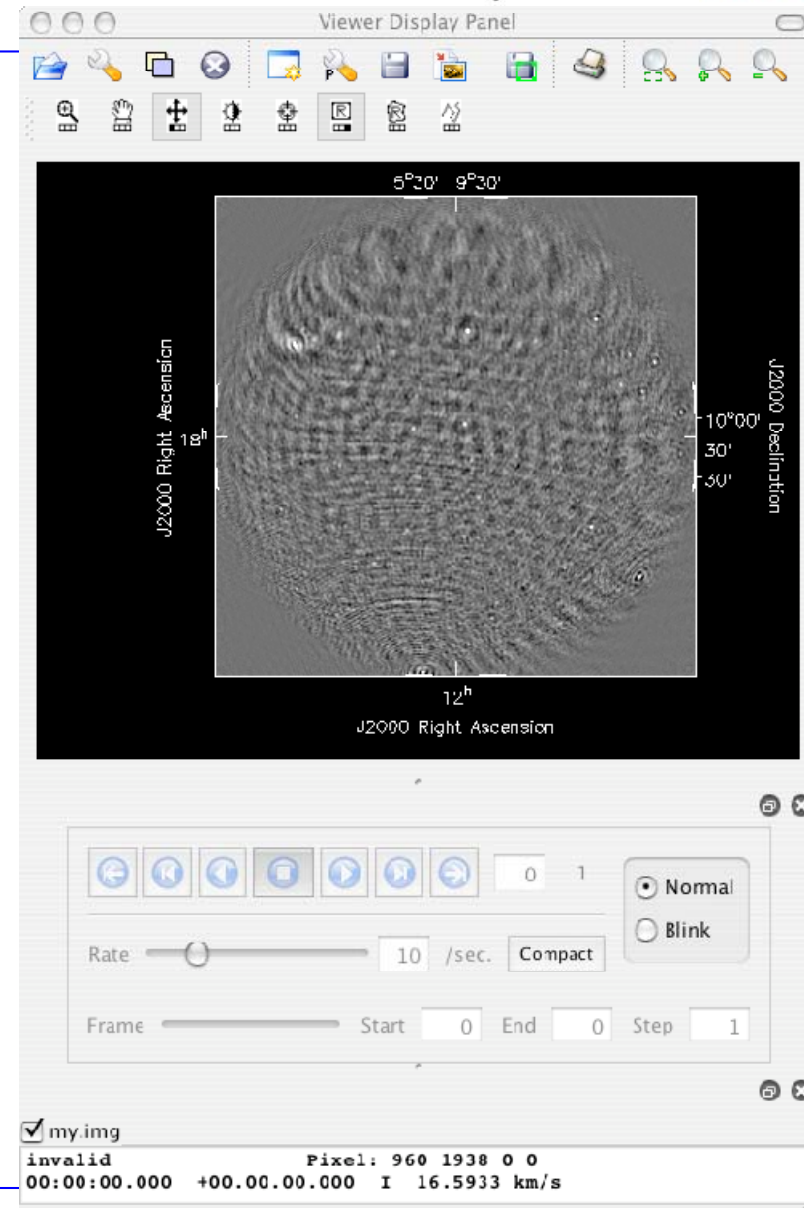
```
casaviewer ('my.img')
```
- Can be used from python (pyrap):

```
im = image('my.img')  
im.view()
```

# casaviewer (image)

```
python
from pyrap.images import *
im = image('my.img')
im.view()
```

```
casaviewer ('my.img')
```



Thank you