

“RFI mitigation OTOH”

## Software RFI Mitigation for VLBI and Phased Arrays

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RFI Workshop, MPIfR Bonn, 8-12 April 2013

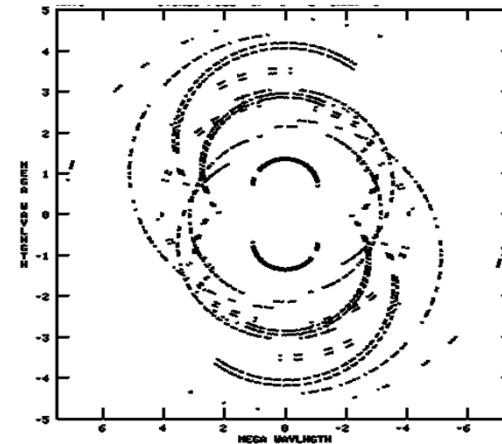
# Overview

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- ▶ VLBI: RFI suppression
  - ▶ Filtering out high fringe-rate components in raw visibilities
  - ▶ „RFI“ branch of DiFX Software Correlator
- ▶ Focal Plane and Phased Arrays: offline RFI subtraction
  - ▶ Make „RFI Template“ from time-averaged data, subtract
  - ▶ Trial library in DiFX Software Correlator
  - ▶ Applicable in future (GBT K-band FPA, EB L-band 7-beam, EB APERTIF, LOFAR?) – current digital backends lack computing power / architecture needed to form cross-correlations between ant. elements

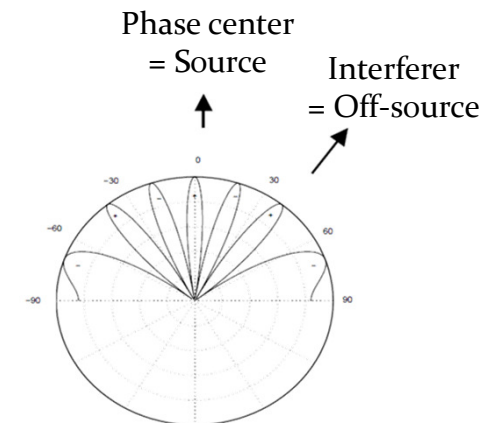
# RFI Suppression for VLBI

- ▶ VLBI: spatially sample source visibility function via Earth rotation => fill sparse spatial covariance matrix of the antenna array  $\approx C(t|u,v)$ , “gridded visibilities”



Spatial covariance matrix  $C(t|u,v)$

- ▶ Fringe stopping in VLBI: phase center tracks source while Earth rotates – done via continual re-phasing of antennas



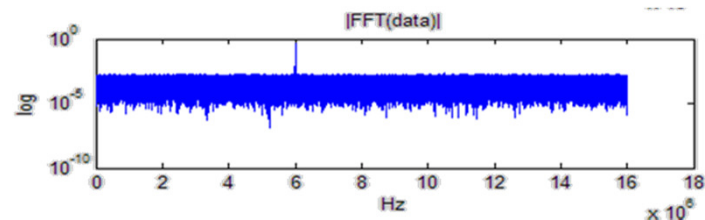
„Fringe stopping“ is re-phasing the two antennas of a baseline towards the source under Earth rotation. Figure: Roshi 2003

# RFI Suppression for VLBI

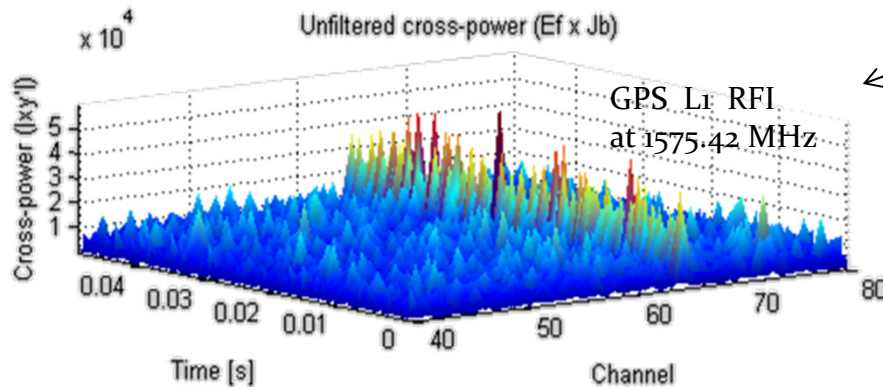
## Before fringe stopping

source : high fringe rate  $> 0$  Hz  
other : low fringe rate  $\sim 0$  Hz

Locally stationary RFI, no Doppler



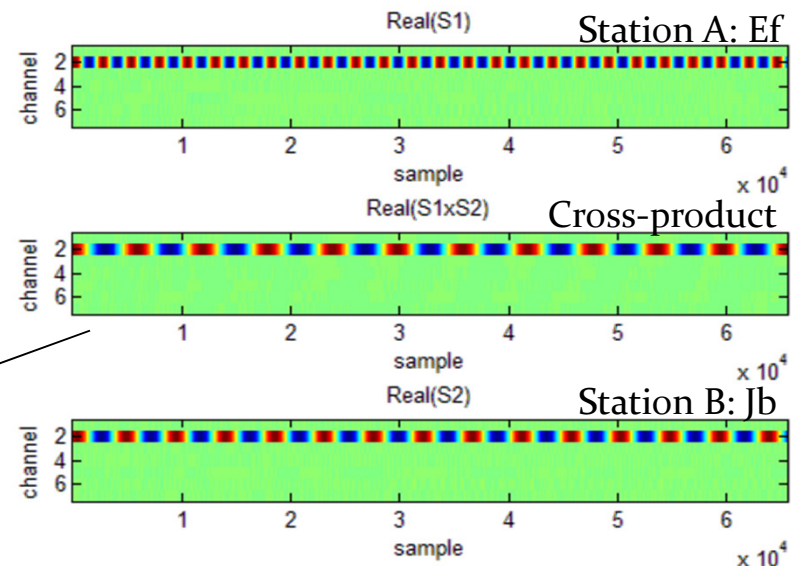
Synthetic Mark5B data with GPS ; Ef-Jb



## After fringe stopping

source : low fringe rate  $\sim 0$  Hz  
other : high fringe rate  $> 0$  Hz

Spectrogram: fringe stopping on baseline



RFI fringe frequency  $\approx$  baseline D, declination



# RFI Suppression for VLBI

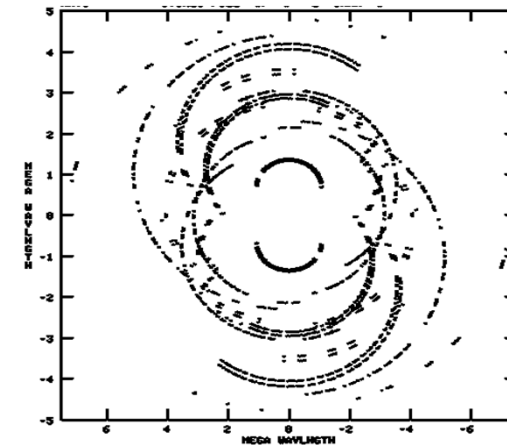
## DiFX Software Correlator

- raw data is „filtered“ during AP time
- one  $C(t|u,v)$  sample/channel/AP gets output  
== resampling, e.g. 125 kHz down to 1 Hz

Standard DiFX : time integration in APs

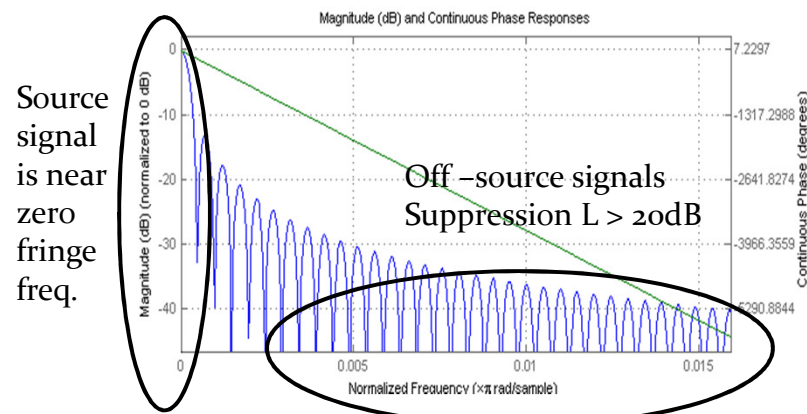
RFI DiFX : low-pass (+ integration)

„fringe rate filtering“ (first suggested by Roshie et al. 2003)  
~ tapering along UV track

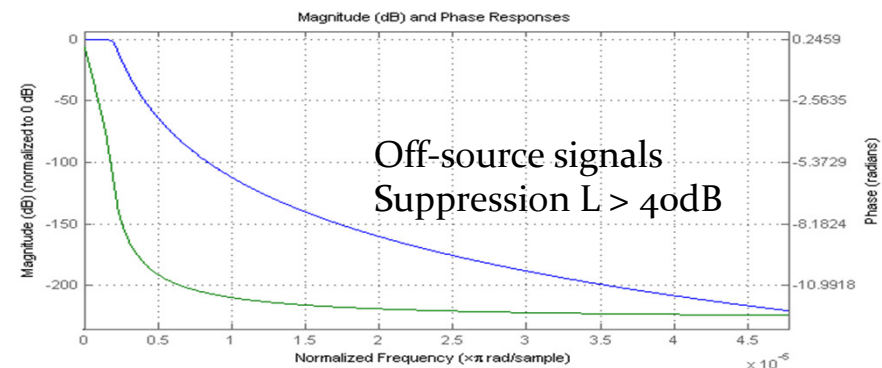


Spatial covariance matrix  $C(t|u,v)$

Time integration: low-freq response

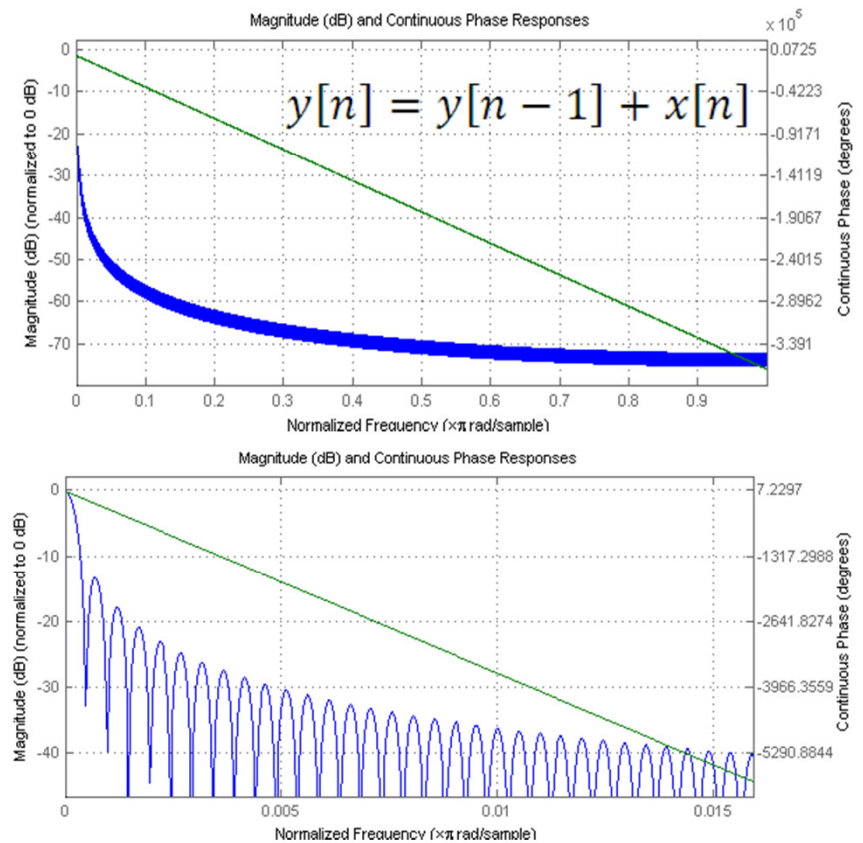
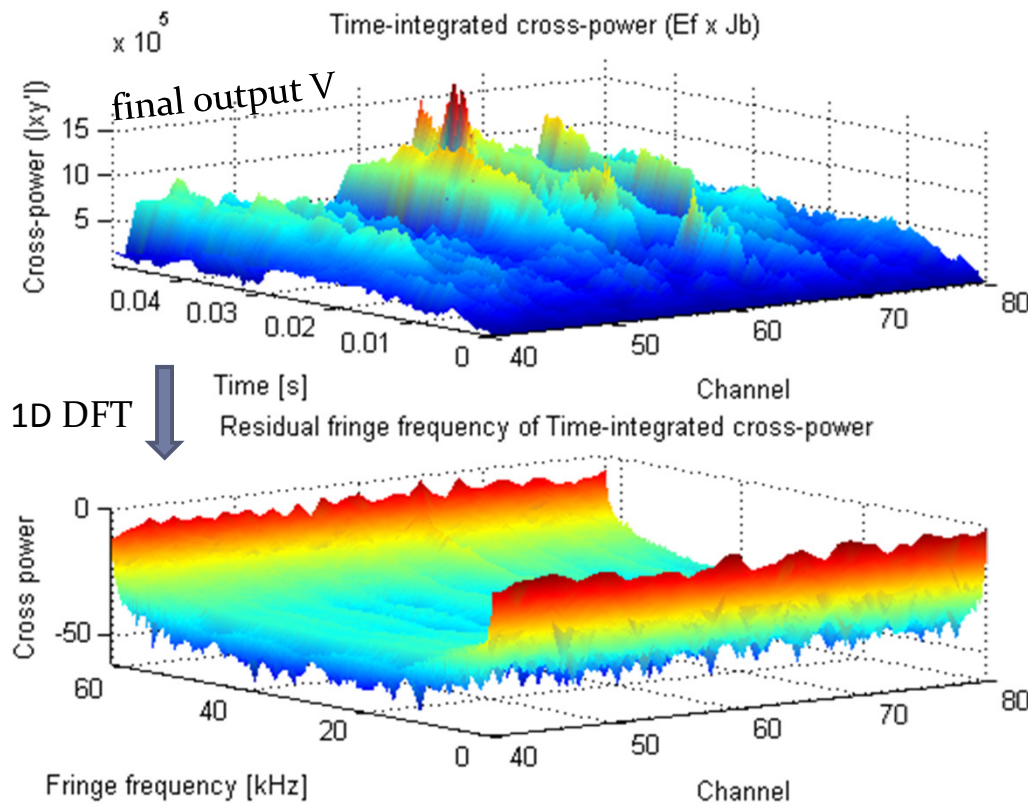


Low-pass: low-freq response, 4th order IIR



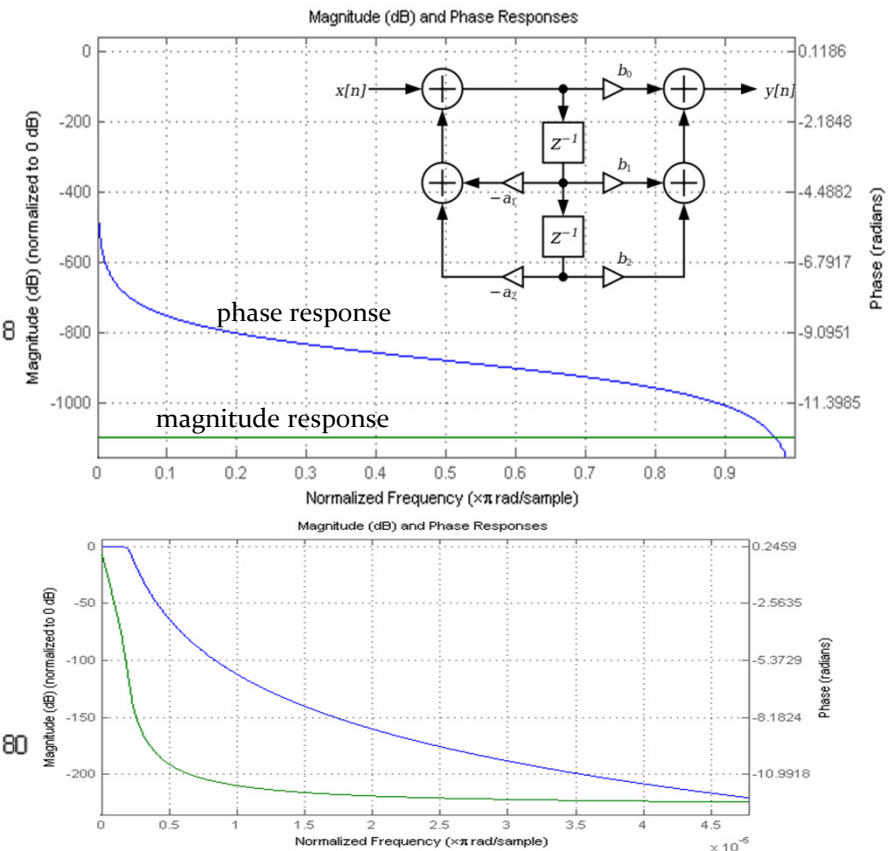
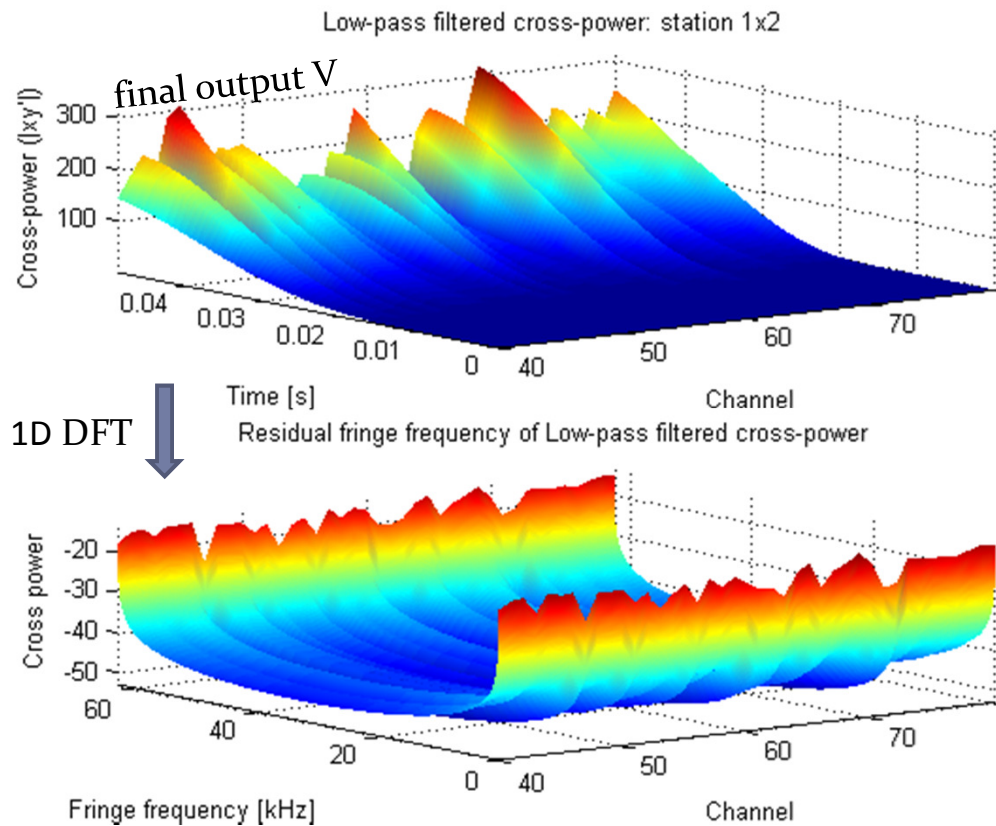
# VLBI Fringe Rate Filtering: DiFX Time Integration

$$V = \langle X_A X_B^* \rangle \cong \sum_{n=0}^{N_{int}} x_A[n] x_B^*[n] \text{ of fringe stopped data}$$



Normalized frequency response of integrator for 4096 samples length (top). Zoomed to lowest frequencies (bottom). Attenuation  $\sim 144$  dB for length of several million samples. Green: phase, blue: magnitude.

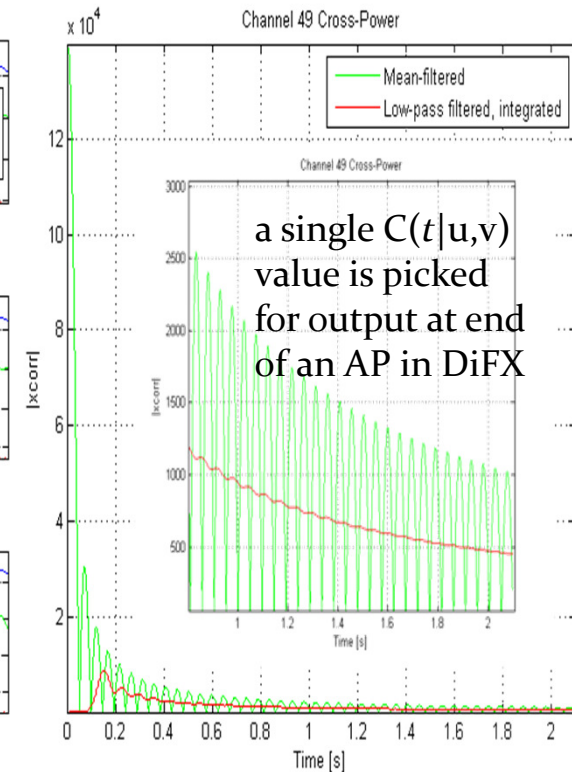
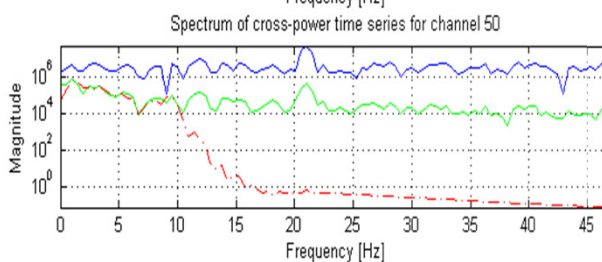
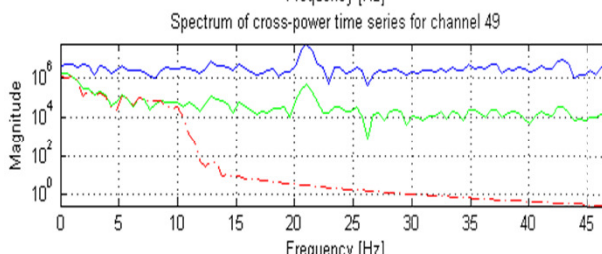
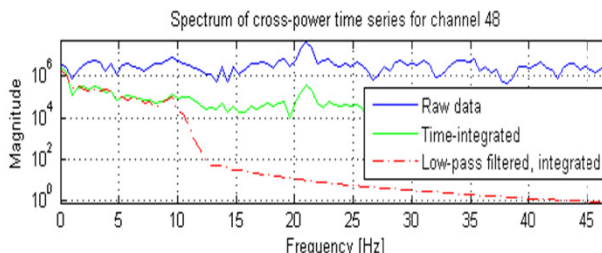
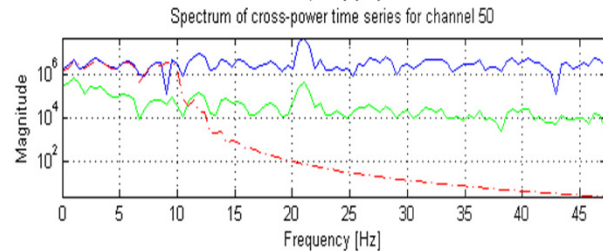
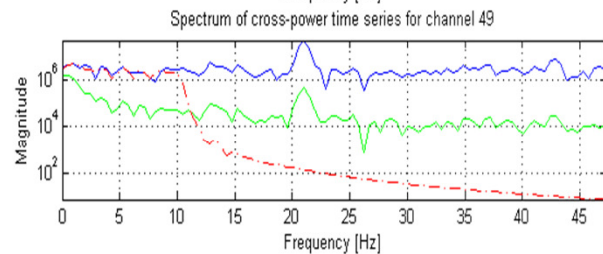
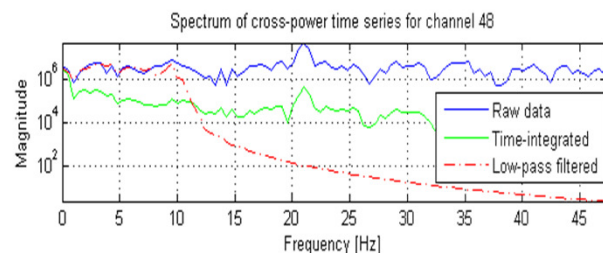
# VLBI Fringe Rate Filtering: DiFX Low-Pass Filters



Normalized frequency response of 4th order IIR lowpass (top).  
Zoomed to lowest frequencies (bottom). Green is phase and blue is magnitude response. Single precision has less atten.

# VLBI Fringe Rate Filtering

Cross-corr. with synthetic Mark5B with GPS signal, BPSK by CA sequence  
Ef-WB 330km; L-band; RA=0 DEC=+45; GPS lands at fringe freq of ~22 Hz



raw  $\rightarrow L = 0$  ; integrator  $\rightarrow L = 20$  dB  
12th IIR 10 Hz LP  $\rightarrow L = 40-50$  dB

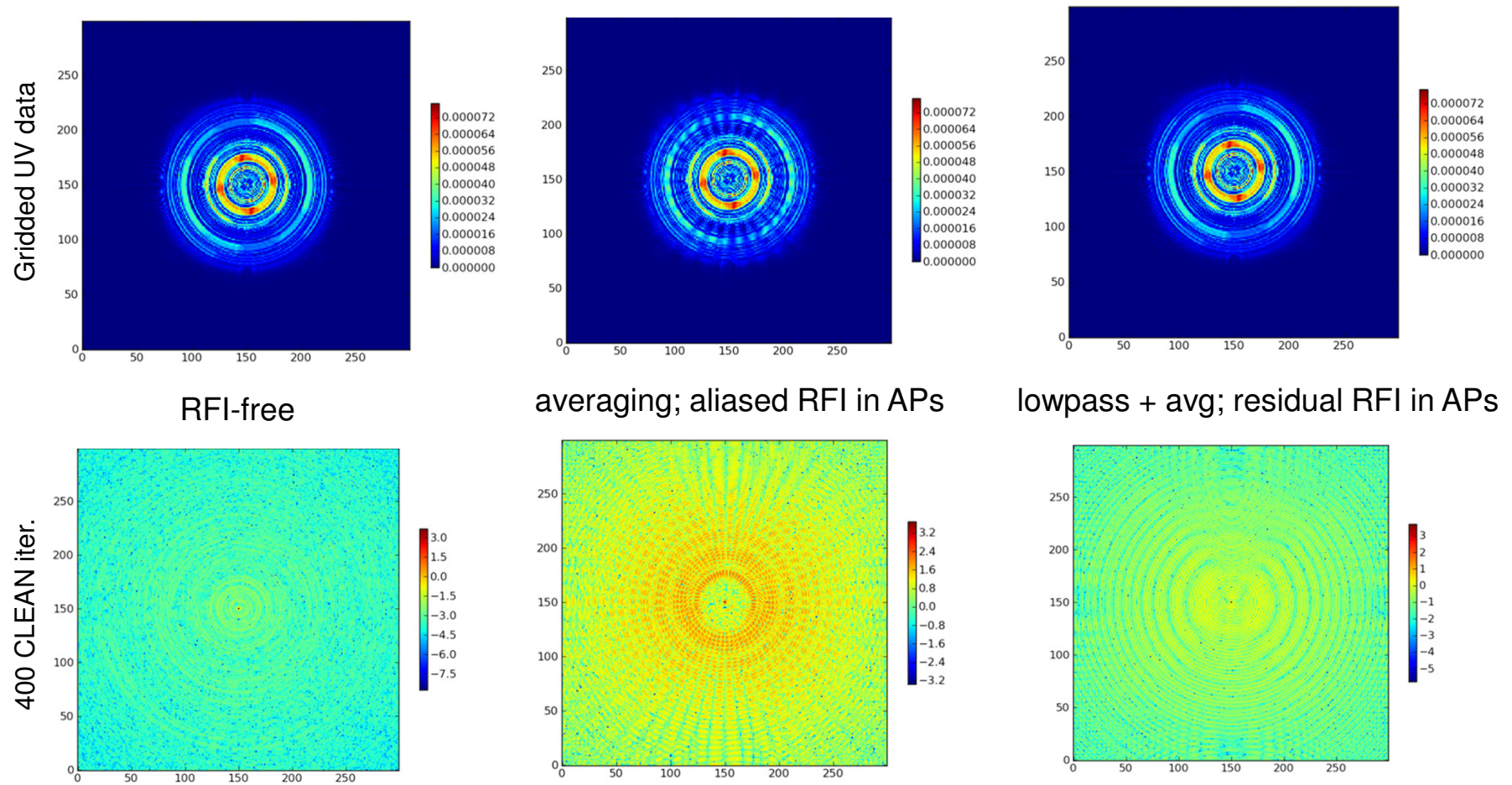
raw  $\rightarrow L = 0$  ; integrator  $\rightarrow L = 20$  dB  
12th IIR 10 Hz LP + integrator  $\rightarrow L = 60-70$  dB

Baseline output visibility over time; inset zoomed to 0.8s-2.2s



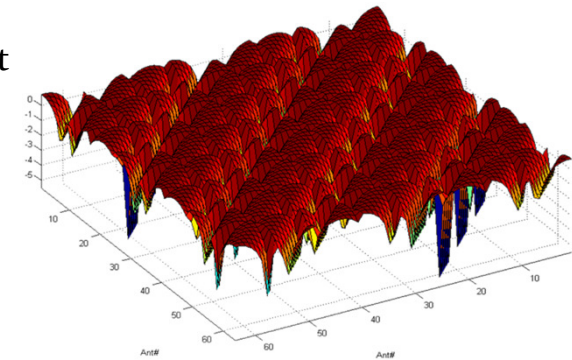
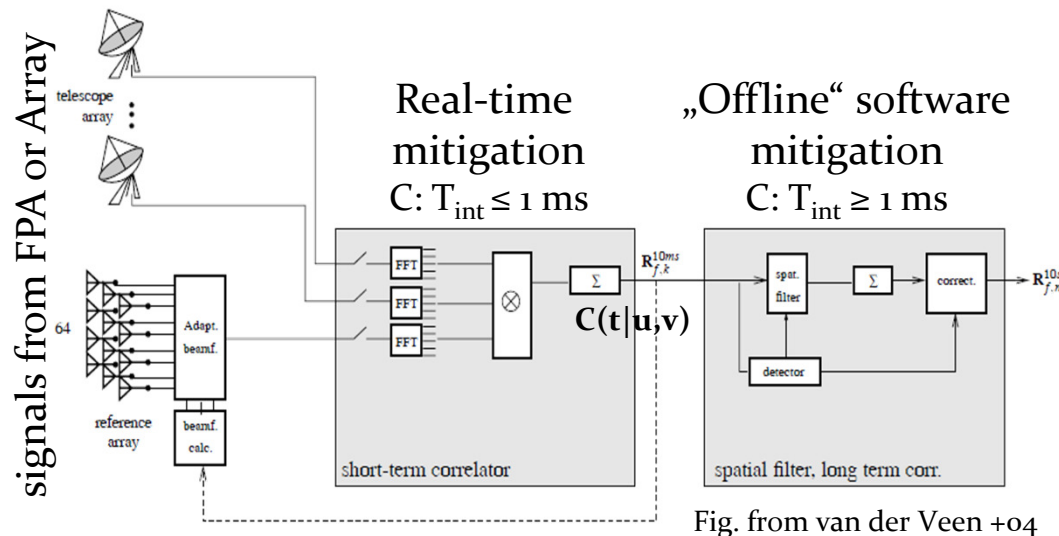
# VLBI Fringe Rate Filtering

Synthetic 4-ant. array, source near South Pole, 5 kJy, RFI on one long baseline at 1% of source flux

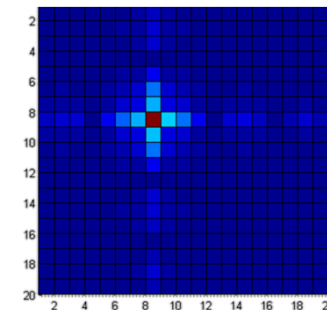


# Focal Plane and Phased Arrays: Offline Mitigation

- ▶ Input data = covariance matrix  $C(t|u,v): N_{\text{ant}} \times N_{\text{ant}}$



Example covariance matrix for  $N_{\text{ant}}=8 \times 8$  uniform grid array  
Same matrix, after imaging:

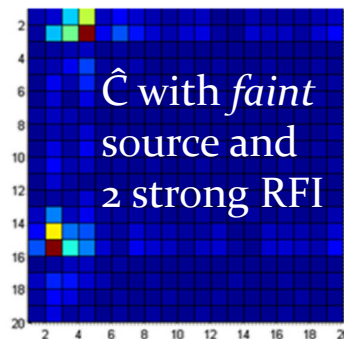


- ▶ Method 1 - RFI Subtraction : in DiFX Library
  - ▶ one or more ( $N_{\text{ref}} \geq 1$ ) reference antennas to make „RFI Template“; must have ref. antennas part of  $C(t|u,v)$  !!
- ▶ Method 2 - RFI Nulling : also in DiFX Library
  - ▶ old but very effective when  $N_{\text{ref}}=0$  and strong RFI

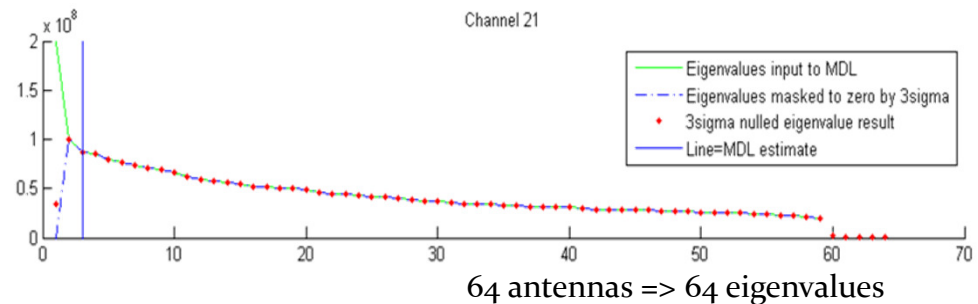
# FPA RFI Nulling

- ▶ No reference antennas -- estimate #RFI from covariance  $\hat{C}$ :  $N_{\text{ant}} \times N_{\text{ant}}$
- ▶ Take matrix eigendecomposition (SVD, EVD) of  $\hat{C}$  to get eigenvalues  $\Lambda$ :

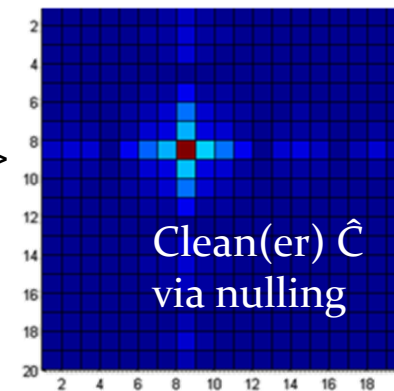
$$\hat{C} = W \Lambda W^* = W \begin{bmatrix} \Lambda_{00} & 0 \\ 0 & \Lambda_{11} \end{bmatrix} W^*$$



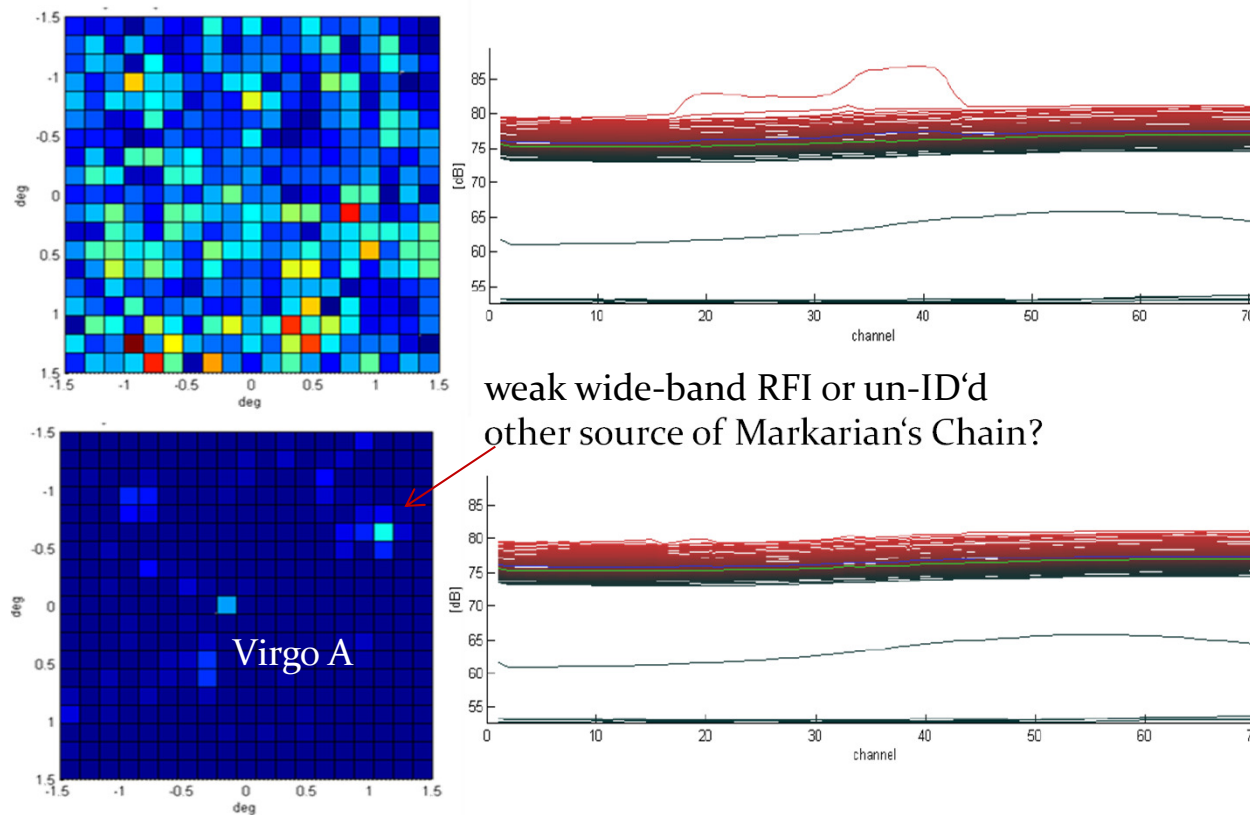
SVD of  $\hat{C} \Rightarrow \Lambda$  eigenvalues



- ▶ Robustly estimate #RFI  $q$  via  $q = \arg \min_{k \in [0, N_{\text{ant}} - 1]} L(\Lambda|k)$ 
  - ▶ Minimum Description Length (Occam's razor)
  - ▶  $3\sigma$  threshold, MAD threshold, ...
- ▶ Replace  $q$  peak eigenvalues by non-RFI median  $\Rightarrow$  or by zero (=nulling)
- ▶ Old but quite effective offline mitigation!



# FPA RFI Nulling – APERTIF on Virgo A



weak wide-band RFI or un-ID'd  
other source of Markarian's Chain?

Raw  $\hat{C}$  :1-sec averaged On  
(Virgo A) and Off (sky)  
pointings with Wb APERTIF,  
provided by W.v.Cappellen

APERTIF :121 array  
elements, 71 channels,  
1.4830 to 1.4967 GHz

Strong RFI from AfriStar  
No reference antennas

Images: On-Off deltas  
averaged over 71 channels,  
before and after Nulling.

Top image: original On-Off delta covariances, rms  $\sigma=3.99$ . Bottom image:  
“nulled” covariances, rms  $\sigma=1.11$ . Image FOV=1.5°. WSRT main dish  $f/D=0.35$ ,  
 $D=25\text{m}$  subtends 55°. Nulled data enhances Virgo A at  $(0^\circ, 0^\circ)$ . Point source  
at  $(-0.7^\circ, 1.1^\circ)$  either wide-band RFI in WSRT spillover or an unidentified other  
source in Markarian's Chain.



# FPA RFI Subtraction

- ▶ RFI Subtraction : form template RFI footprint & subtract from data
- ▶ Need time-integrated covariance matrix  $\hat{C}(f)$  incl. reference antennas:

$$\hat{C} = \begin{bmatrix} C_{rr} & C_{ra} \\ C_{ar} & C_{aa} \end{bmatrix} \quad (C_{ra} = \text{Reference} \times \text{Array}, C_{aa} = \text{Array} \times \text{Array}, C_{rr} = \text{Ref} \times \text{Ref})$$

- ▶ Closure Phase method (Kesteven, Briggs, 2000): perfect subtraction

$$\tilde{C}(i, j) = \hat{C}_{aa}(i, j) - \frac{C_{ar}(i, a_1) C_{ra}(a_2, j) C_{rr}^*(a_1, a_2)}{\alpha(f) + C_{rr}(a_1, a_2) C_{rr}^*(a_1, a_2)} \quad \text{for } N_{\text{ref}} = 2 \text{ and } N_{\text{rfi}} \leq 1$$

- ▶ Generic method (van der Veen, 2004): good to mediocre subtraction

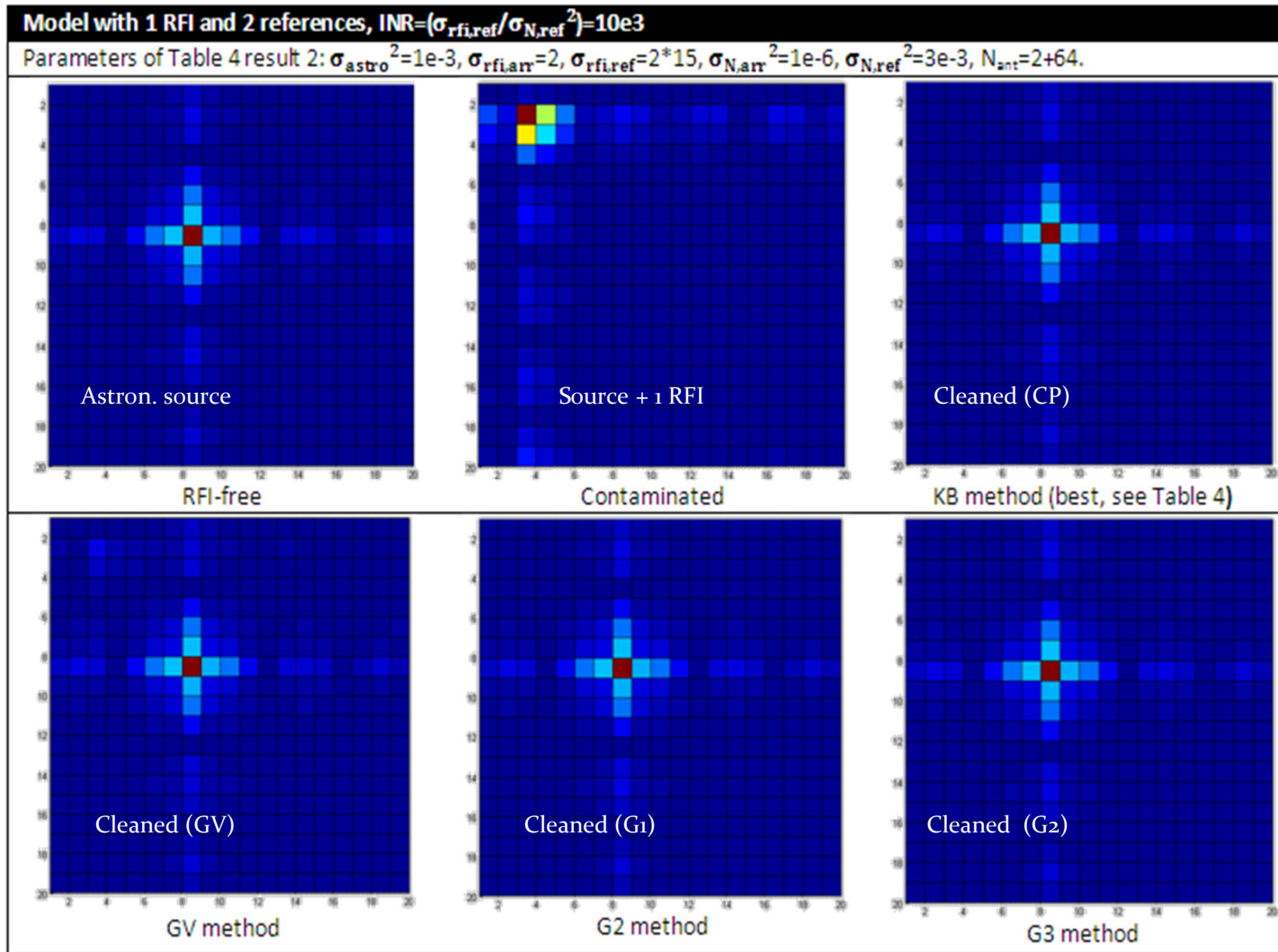
$$\tilde{C} = C_{aa} - (C_{ar} C_{rr}^{-1} C_{ra}). \quad \text{for } N_{\text{rfi}} \leq N_{\text{ref}} \text{ at high INR}$$

- ▶ Generic robust method (own): good subtraction, two alternate ways

$$\begin{aligned} \tilde{C} &= C_{aa} - C_{ar} (C_{ra} C_{aa}^{-1} C_{ar})^{\dagger} C_{ar} \\ \tilde{C} &= C_{aa} - (C_{ar} C_{ar}^{\dagger}) C_{aa} (C_{ar} C_{ar}^{\dagger})^* \end{aligned} \quad \text{for } 1 \leq N_{\text{ref}} \leq N_{\text{rfi}} \text{ down to low INR}$$

Details at: <http://www.radionet-eu.org/fp7wiki/doku.php?id=jra:albius:processing>

# RFI Mitigation for Phased Arrays – Synthetic Results



UV images 64-  
Antenna Array

1 RFI, *high* INR

Top 1: Clean  
Top 2: Added RFI

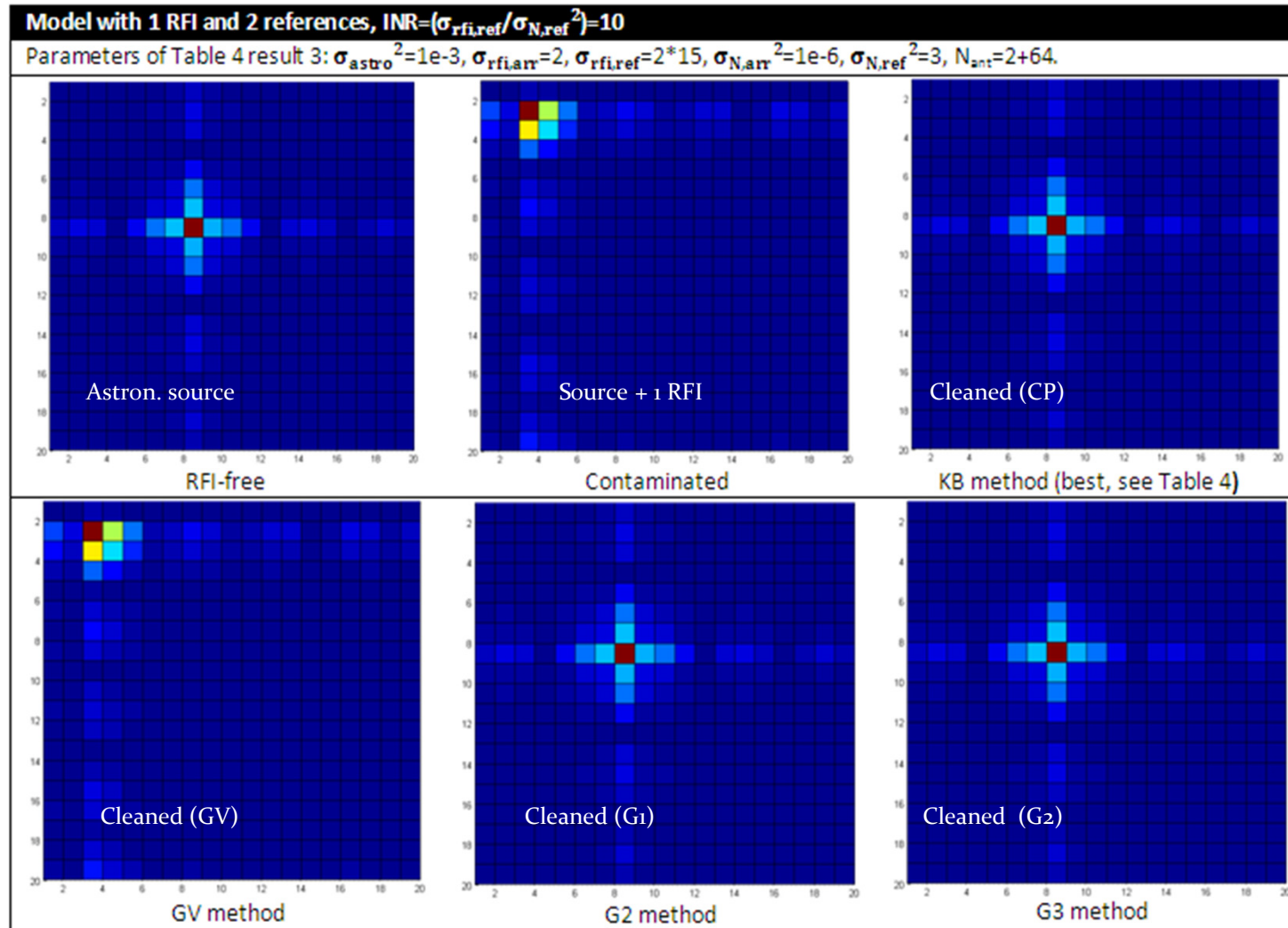
Top 3, Bottom 1-3:  
different cleaning  
methods

CP/KB = Closure  
phase, Kesteven

GV = Generic,  
Van der Veen

G1,G2 = Generic, own

# RFI Mitigation for Phased Arrays – Synthetic Results



UV images 64-  
Antenna Array

**1 RFI, low INR**

Top 1: Clean  
Top 2: Added RFI

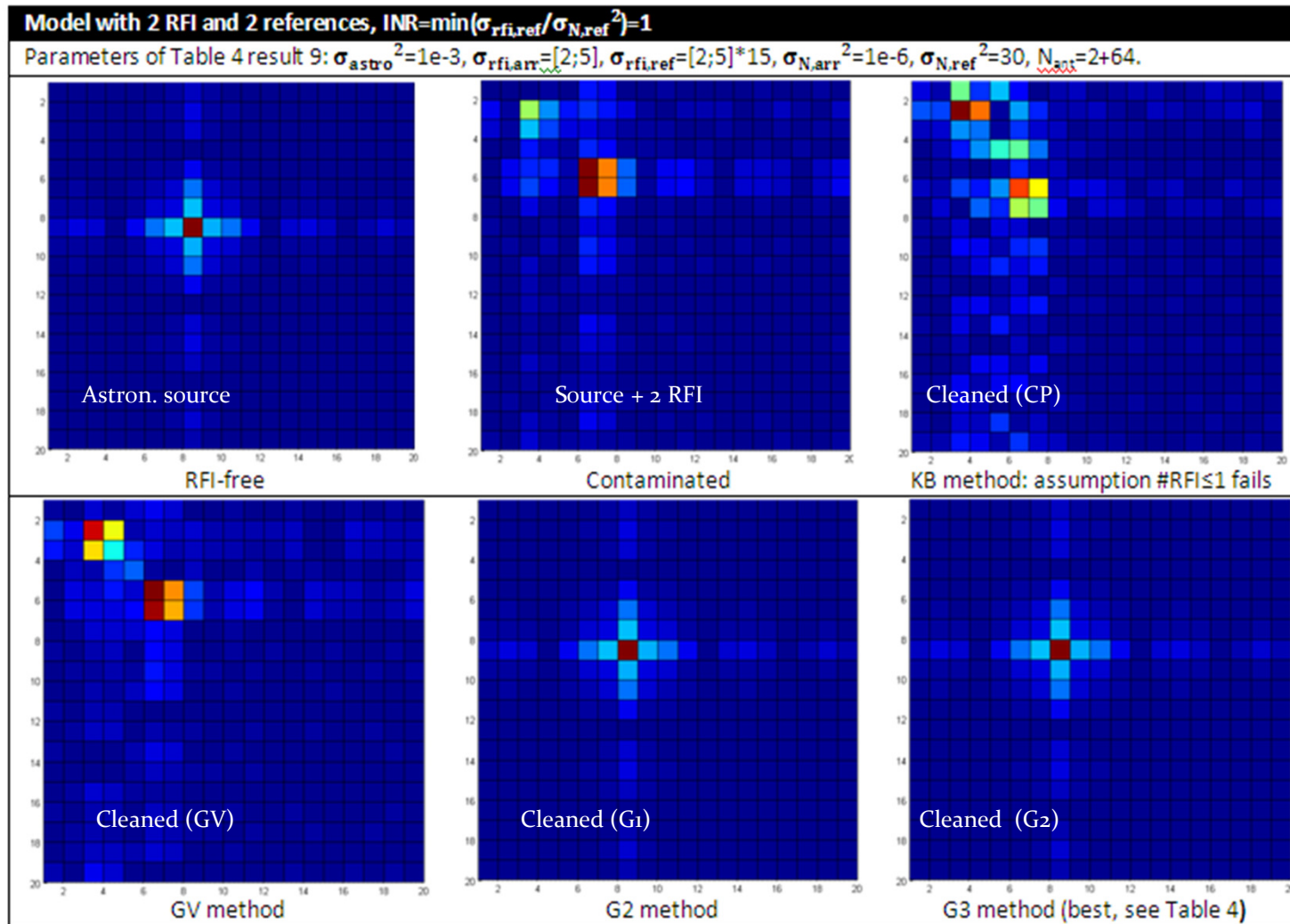
Top 3, Bottom 1-3:  
different cleaning  
methods

CP/KB = Closure  
phase, Kesteven

GV = Generic,  
Van der Veen

G1, G2 = Generic, own

# RFI Mitigation for Phased Arrays – Synthetic Results



UV images 64-  
Antenna Array

2 RFI, *low* INR

Top 1: Clean  
Top 2: Added RFI

Top 3, Bottom 1-3:  
different cleaning  
methods

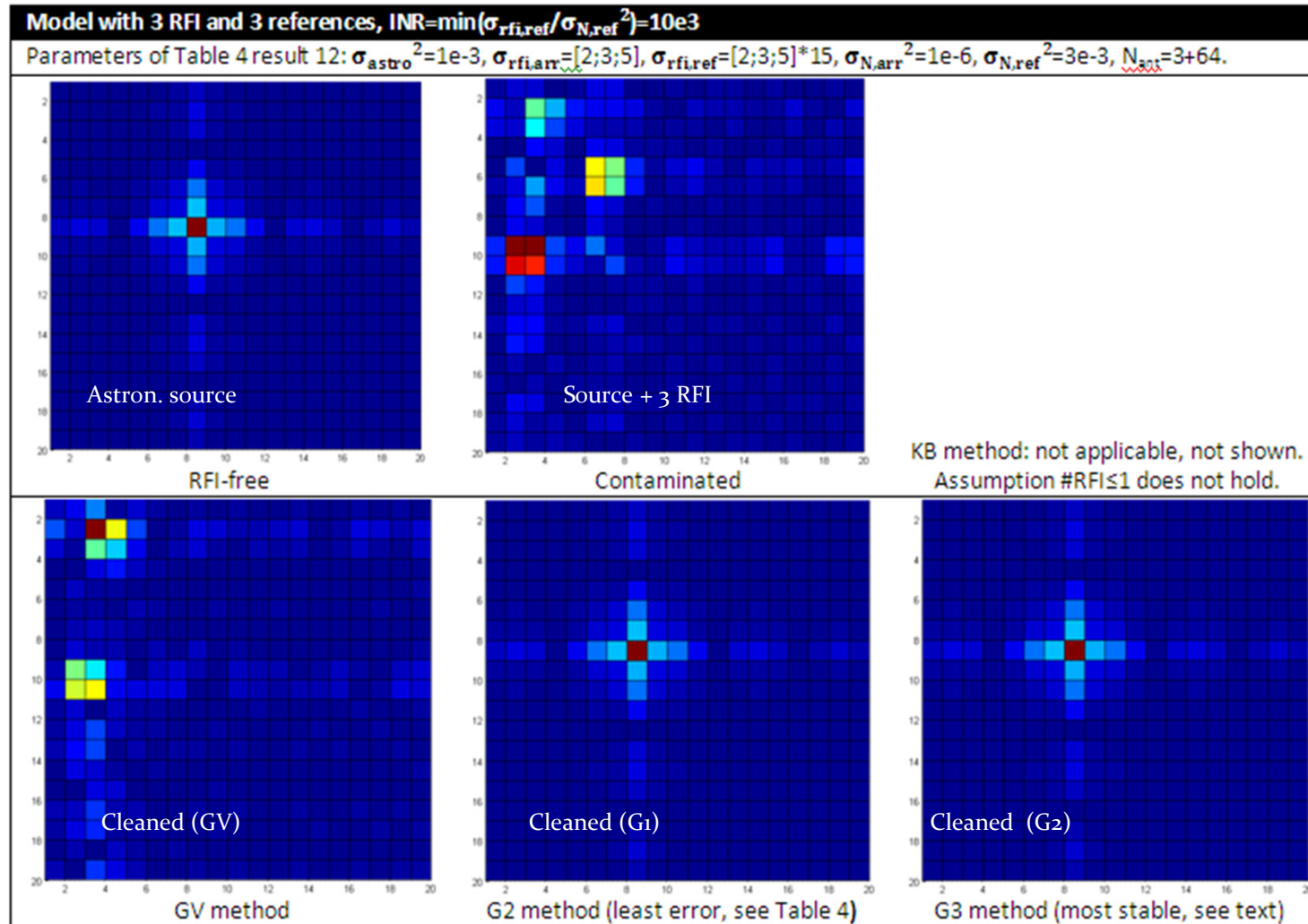
CP/KB = Closure  
phase, Kesteven

GV = Generic,  
Van der Veen

G1, G2 = Generic, own



# RFI Mitigation for Phased Arrays – Synthetic Results



UV images 64-Antenna Array

3 RFI, high INR

Top 1: Clean  
 Top 2: Added RFI

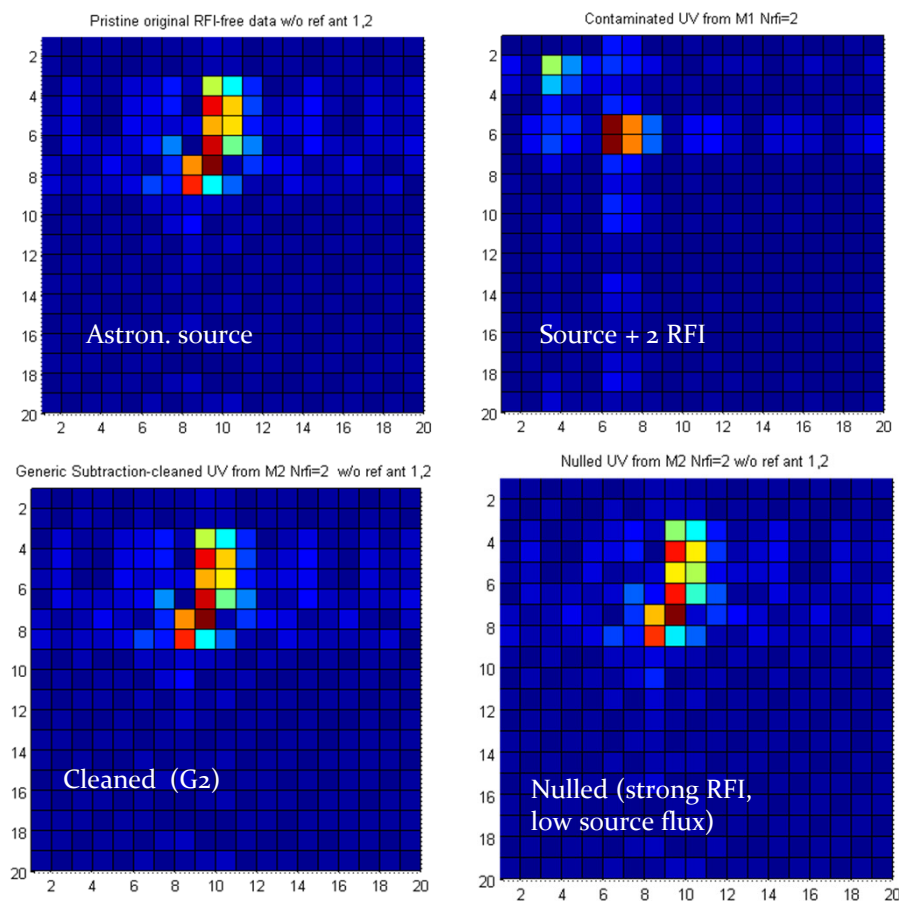
Top 3, Bottom 1-3:  
 different cleaning  
 methods

CP/KB = Closure  
 phase, Kesteven

GV = Generic,  
 Van der Veen

G1, G2 = Generic,  
 own

# RFI Mitigation for Phased Arrays – Synthetic Results



**UV images 64-Antenna Array**

**2 RFI, high INR**

**Extended source**

Top 1: Clean

Top 2: Added RFI

Bottom 1: Generic 2

Bottom 2: Nulled

# Summary

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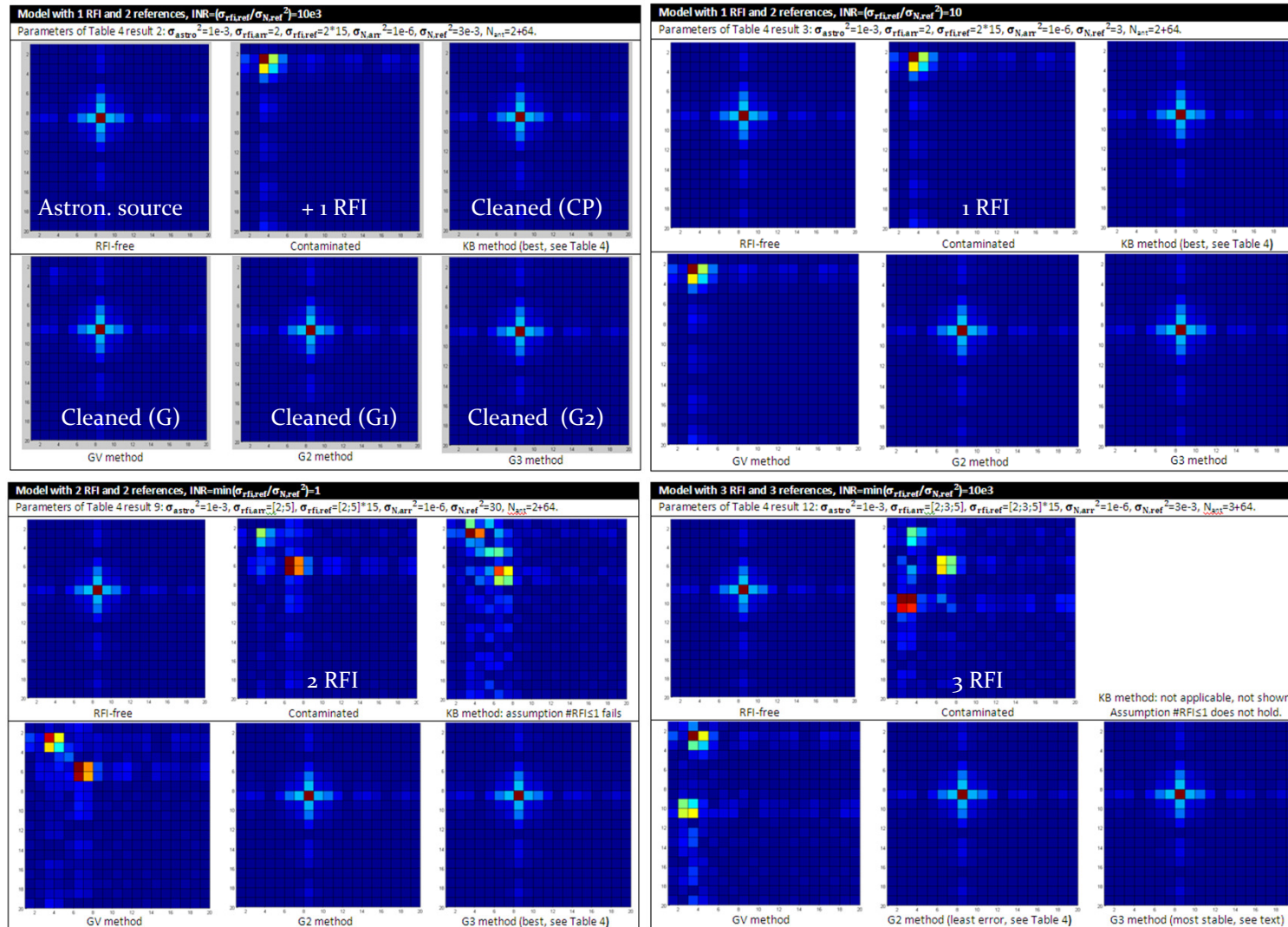
- ▶ **VLBI: RFI suppression**
  - ▶ In the „RFI“ branch of DiFX Software Correlator
  - ▶ In principle working, but leaves residual RFI „power“ in channels, not so interesting for spectral line VLBI!
  
- ▶ **Focal Plane and Phased Arrays: offline RFI subtraction**
  - ▶ Test library in „RFI“ branch of DiFX Software Correlator
  - ▶ Even basic „Nulling“ quite powerful
  - ▶ Reference antenna methods similarly powerful, plus carry much reduced risk of harming astronomical signal
  - ▶ But: fresher back-end hardware required to employ in real, running observations (HI surveys etc)!

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Thanks!



# RFI Mitigation for Phased Arrays – Synthetic Results – Overview



UV images of  
Covariance  
Data from  
64-Antenna  
Array

Panels 1-4:

Increasing RFI,  
different interferer  
to noise ratios

Images (cw):

Top 1: Clean  
Top 2: Added RFI  
Top 3, Bottom 1-3:  
different cleaning  
methods

CP/KB = Closure  
phase, Kesteven  
GV = Generic,  
Van der Veen  
G1, G2 = Generic,  
own

# Error Comparison

	$\sigma_{astro}^2$	$\sigma_{rfi,arr}^2$	$\sigma_{rfi,ref}^2$	$\sigma_{N,arr}^2$	$\sigma_{N,ref}^2$	$N_{ant}$	$ \varepsilon(C) $	INR	$\varepsilon(KB)$	$\varepsilon(GV)$	$\varepsilon(G2)$	$\varepsilon(G3)$
single RFI								2 refs				
1)	1e-3	2	x15	1e-6	1e-6	2+64	1e-9	30e6	2.2e-11	3.8e-8	1.5e-8	5.5e-8
2)	1e-3	2	x15	1e-6	3e-3	2+64	1e-9	10e3	2.2e-11	1.0e-4	1.8e-8	5.5e-8
3)	1e-3	2	x15	1e-6	3	2+64	1e-9	10	2.2e-11	9.5e-2	2.0e-8	5.5e-8
4)	1e-3	2	x15	1e-6	3	2+64	1e-6	10	4.1e-11	9.5e-2	1.5e-1	2.1e-5
dual RFI								≥2 refs				
5)	1e-3	[2 ; 5]	x15	1e-6	1e-6	2+64	1e-9	30e6	7.0	2.8e-7	1.5e-7	7.6e-8
6)	1e-3	[2 ; 5]	x15	1e-6	3	2+64	1e-9	10	7.0	0.72	1.5e-7	7.6e-8
7)	1e-3	[2 ; 5]	x15	1e-6	3	3+64	1e-9	10	---	0.41	1.5e-7	7.6e-8
8)	1e-3	[2 ; 5]	x15	1e-6	3	4+64	1e-9	10	---	0.19	1.5e-7	7.6e-8
9)	1e-3	[2 ; 5]	x15	1e-6	30	2+64	1e-9	1	7.0	3.44	1.5e-7	7.6e-8
10)	1e-3	[2 ; 5]	x3e-3	1e-6	30	2+64	1e-9	1e-4	7.0	6.99	1.5e-7	7.6e-8
triple RFI								≥3 refs				
11)	1e-3	[2 ; 3 ; 5]	x15	1e-6	1e-6	3+64	1e-9	30e6	---	2.8e-5	2.2e-6	4.1e-6
12)	1e-3	[2 ; 3 ; 5]	x15	1e-6	3e-3	3+64	1e-9	10e3	---	8.4e-2	2.2e-6	4.1e-6
13)	1e-3	[2 ; 3 ; 5]	x15	1e-6	3	3+64	1e-9	10	---	6.02	2.2e-6	4.1e-6
14)	1e-3	[2 ; 3 ; 5]	x15	1e-6	1e-6	4+64	1e-9	30e3	---	4.6e-6	8.0e-7	4.1e-6
15)	1e-3	[2 ; 3 ; 5]	x15	1e-6	1e-6	5+64	1e-9	30e3	---	1.3e-6	5.5e-7	4.1e-6

Table 4 – Performance comparison of all four subtraction methods for the same 64-element antenna array. Rows show signal power level inputs and the emulated covariance estimation error, number of antennas (reference + array), the derived smallest interference to noise ratio (INR) in the references and the resulting max. abs. errors  $\varepsilon$  of each method relative to the RFI-free model. Not all cases are physical. Changed input values and lowest errors are indicated by bold type.

# DiFX / RFI Library Performance

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Single-core throughput on Xeon E5430 ; 64 antennas  
One channel == one covariance matrix

\$ # Armadillo with ATLAS, Beamformer compiled '-g -O3 -Wall -DUSE_SINGLE_PRECISION=1' \$ numactl --physcpubind=0 ./benchmark	
Integrate 64-elem vector into Covariance	156000 channels/sec (better use FPGA or GPU!)
Decomposition -> recomposition (average)	270 channels/sec
SVD -> RFI detect -> null -> recomposition	190 channels/sec
EVD -> RFI detect -> null -> recomposition	310 channels/sec
1-RFI/ch, 2-reference Template subtraction	8700 channels/sec
2-RFI/ch, 2-reference Template subtraction	21900 channels/sec
64-beam classical beamformer	5850 channels/sec
64-beam MVDR (Cox b=1.0)	390 channels/sec
64-beam RB-MVDR (Cox b=1.0+1e-4)	360 channels/sec



# DiFX Configuration File Changes: \*.v2d

## Example vex2difx \*.v2d descriptor file with RFI-related parameter highlighted

```
# Template v2d file for DiFX correlation of W3OH
vex = w3oh.vex.clocks
antennas = EF, JB, WB
singleScan = True

# The nChan should never be less than 128.
# For numbers of channels < 128, set specAvg so nChan/specAvg
# gives the desired number of channels
SETUP default
{
    tInt = 2.048
    nChan = 2048
    nFFTChan = 2048
    xmacLength = 2048 # to prevent FFT division into 16 x 128-channel pieces
    doPolar = True

    # enable RFI filters (if unspecified, defaults to False/off)
    doRFI = True

    # RFI filtering is only applied inside sub-integration time intervals.
    # Final summation of the sub-integration outputs does not use a filter.
    # To reduce aliasing you may increase the sub-integration time (at cost of RAM).
    # Subint of 0.512s will produce 4 subints for the full 2.0s Tint.
    subintNS = 512000000 # optional
}

# This, along with SETUP default above, should always be done
RULE default
{
    setup = default
}
```



# DiFX Configuration File Changes: \*.input

---

## Extra fields in RFI DiFX \*.input file compared to trunk DiFX

```
# COMMON SETTINGS ##!  
CALC FILENAME:      /Exps/w3oh/w3oh_01.calc  
CORE CONF FILENAME: /Exps/w3oh/w3oh_01.threads  
EXECUTE TIME (SEC): 120  
START MJD:          55638  
START SECONDS:      59651  
ACTIVE DATASTREAMS: 3  
ACTIVE BASELINES:   3  
VIS BUFFER LENGTH:  80  
OUTPUT FORMAT:      SWIN  
OUTPUT FILENAME:    /Exps/w3oh/w3oh_01.difx  
RFI FILT TYPE:      CHAIN  
RFI FILT COEFFS:    /Exps/w3oh/w3oh_01.coeff  
  
# CONFIGURATIONS ###!  
NUM CONFIGURATIONS: 1  
CONFIG NAME:        W3OH_default  
INT TIME (SEC):     2.048000  
SUBINT NANOSECONDS: 512000000  
...
```

# DiFX Configuration File Additon: \*.coeff

---

```
# ----- Example filter configuration file
# Filter types: 0 = Integrator, 1 = Integer Decimator, 2 = IIR biquad, 3 = FIR,
# 4 = Digital State Variable Filter (DSVF), 5 = Moving Average

5 # Number of filters in series, with type and settings in the order below:

# ----- Integrator
0 # type: 0=integrator, has no coefficients

# ----- Integer factor Decimator
1 # type: 1=decimator
3 # decimation ratio

# ----- Biquad IIR Filter
2 # type: 2=IIR-SOS/biquad
4 # filter order, order 4 requires two 2nd order section
9.99831172521226110e-006 # input prescaling gain
# filter coefficients, b0(1) b1(1) b2(1) a0(1) a1(1) a2(1); etc
1.0 -1.99999451637268070 1.0 1.0 -1.99986529350280760 0.99986535310745239
1.0 -1.99999928474426270 1.0 1.0 -1.99989640712738040 0.99989646673202515

# ----- Digital state variable filter
4 # type: 4=DSVF
1.0 # input prescaling gain
0.000773 # tuning  $f = 2 \cdot \sin(\pi \cdot (1024 \cdot (1/0.52)) / 16e6)$ 
0.5 # quality  $q = 1/Q = 1/2.0$ 
# ----- Moving average filter
5 # type: 5=MAvg
16 # length L of window
0.0625 # input prescaling gain, thus if gain=1/L then output is a moving average
```

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