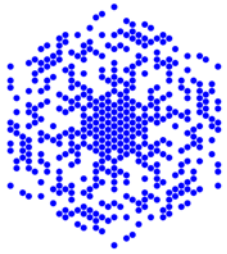


# Outline

---

- Imaging – Worth a Thousand Words?
  - Image and Model: which is which?
- Deconstructing an image
  - Fourier nuts and bolts.
- Recovering Phase
  - Closure Phase and how to handle them
- Deconvolution and Regularization
  - Mapping, a priori information, examples



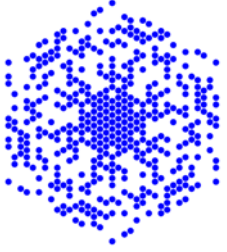
# Do I really want to make an image?

---

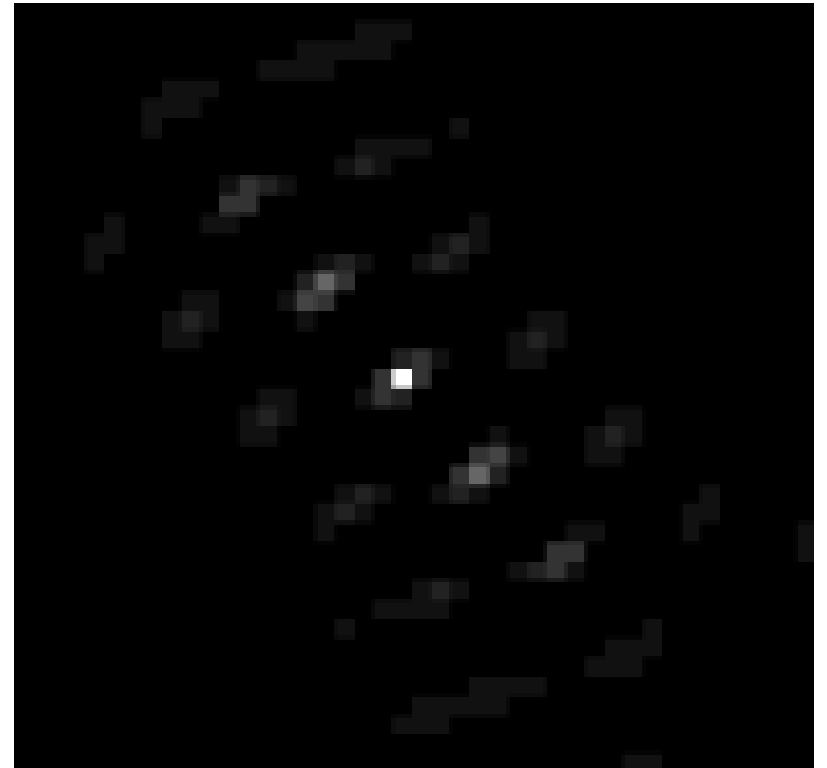
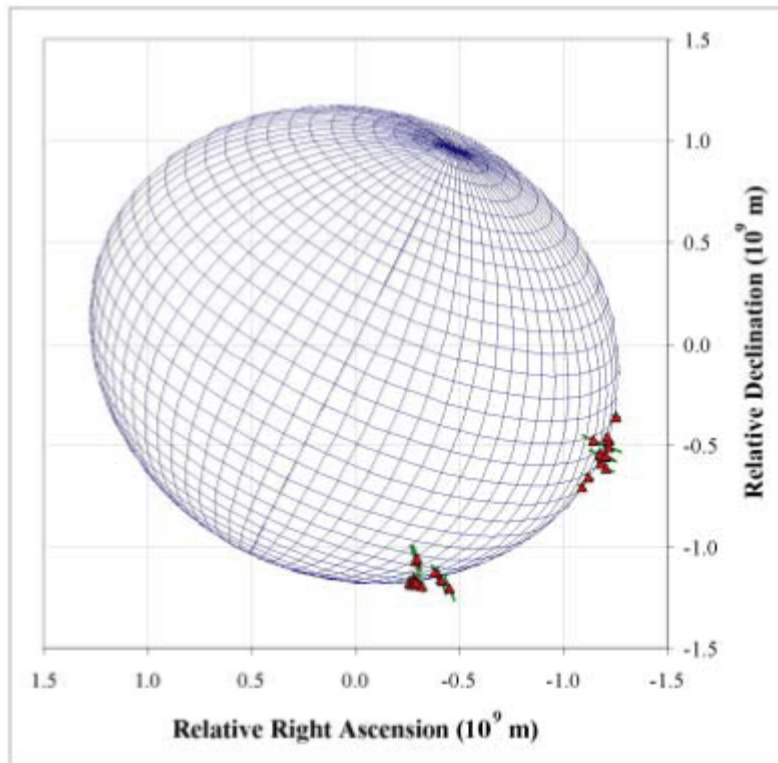
NATURE, instructions to Authors: “Letters are not to exceed 3 pages (180 word abstract plus 1500 word body)”. Converting this by the well-known picture-to-word law, we need 1.68 good images to make a Nature paper. Right?

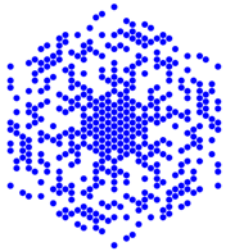
“You gotta know when to walk away;  
... know when to run” (Kenny Rogers)

1. Is an image the best way to view my data?
2. Where is the Physics?
3. Imaging and Modelfitting: a blurry distinction.



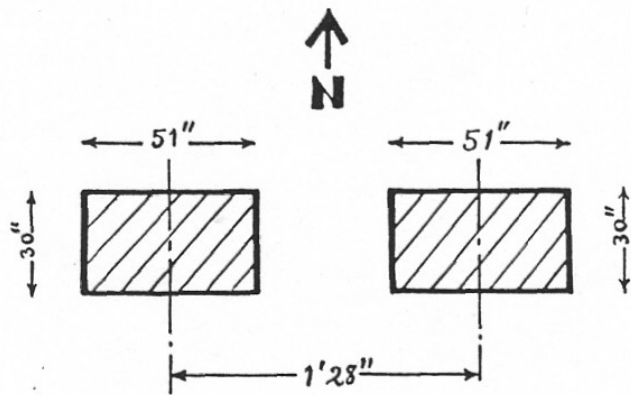
# Unchained fidelity





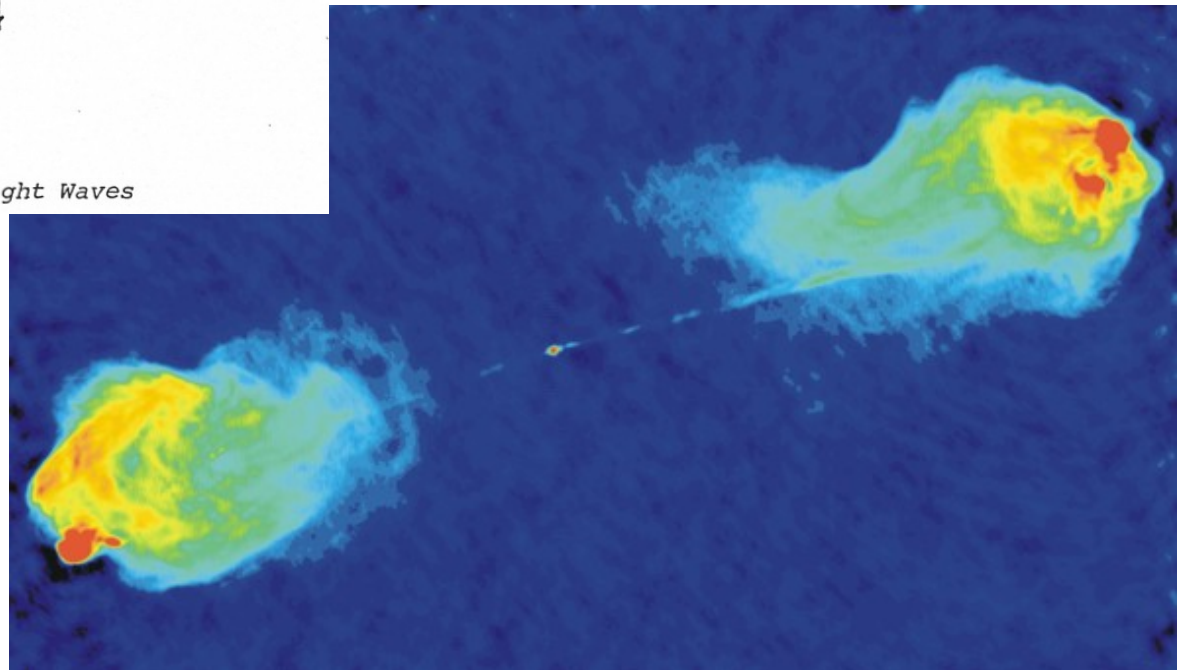
# Fine Feathers make not a Fine Fowl...

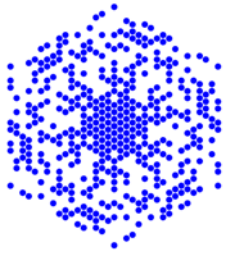
Figure 6 The approximate distribution of intensity across the radio source in Cygnus found by Jennison and Das Gupta (1953).



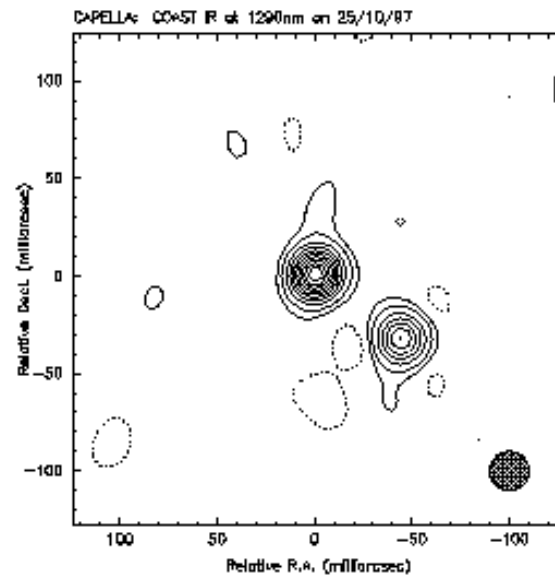
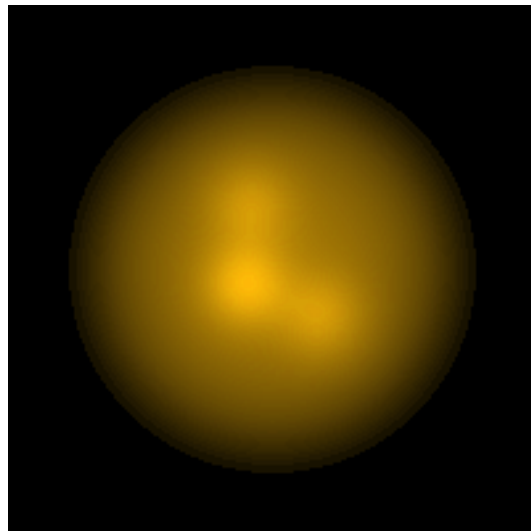
*The First Intensity Interferometer for Light Waves*

Cygnus A: VLA 6cm continuum image



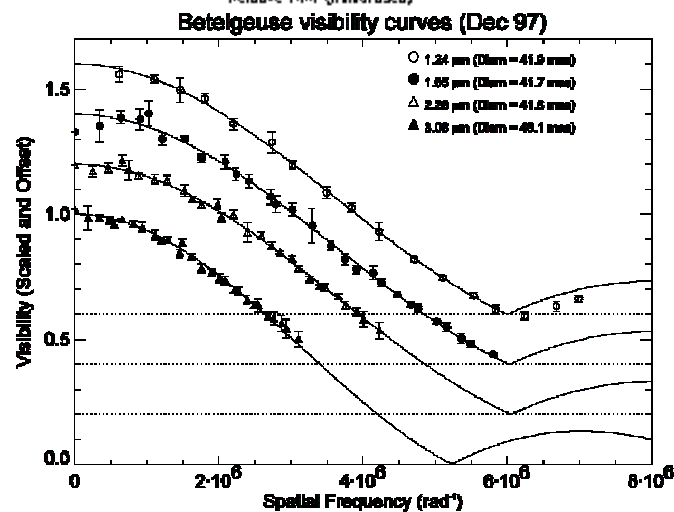
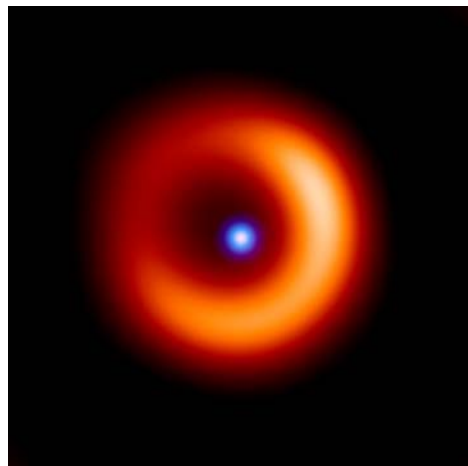


# Image or Model?

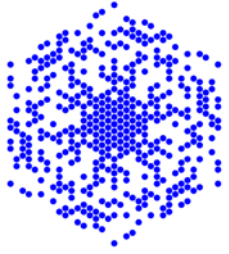


- Image and Model:
- Both
- representation of data
  - contain a priori assumptions

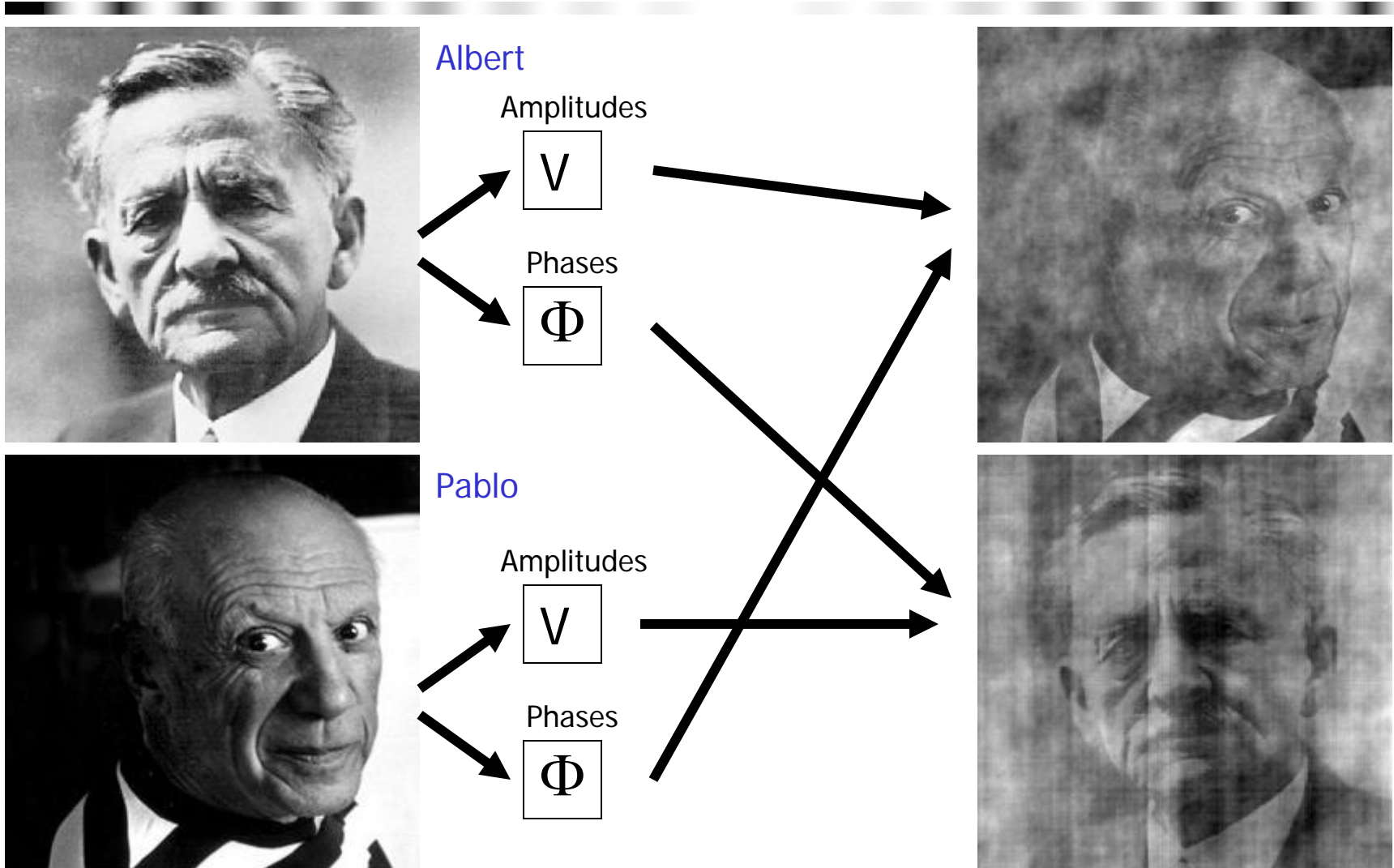
Semantic difference?

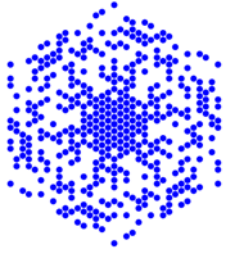


When extracting quantitative information from data, stay as close to the native data form as possible.

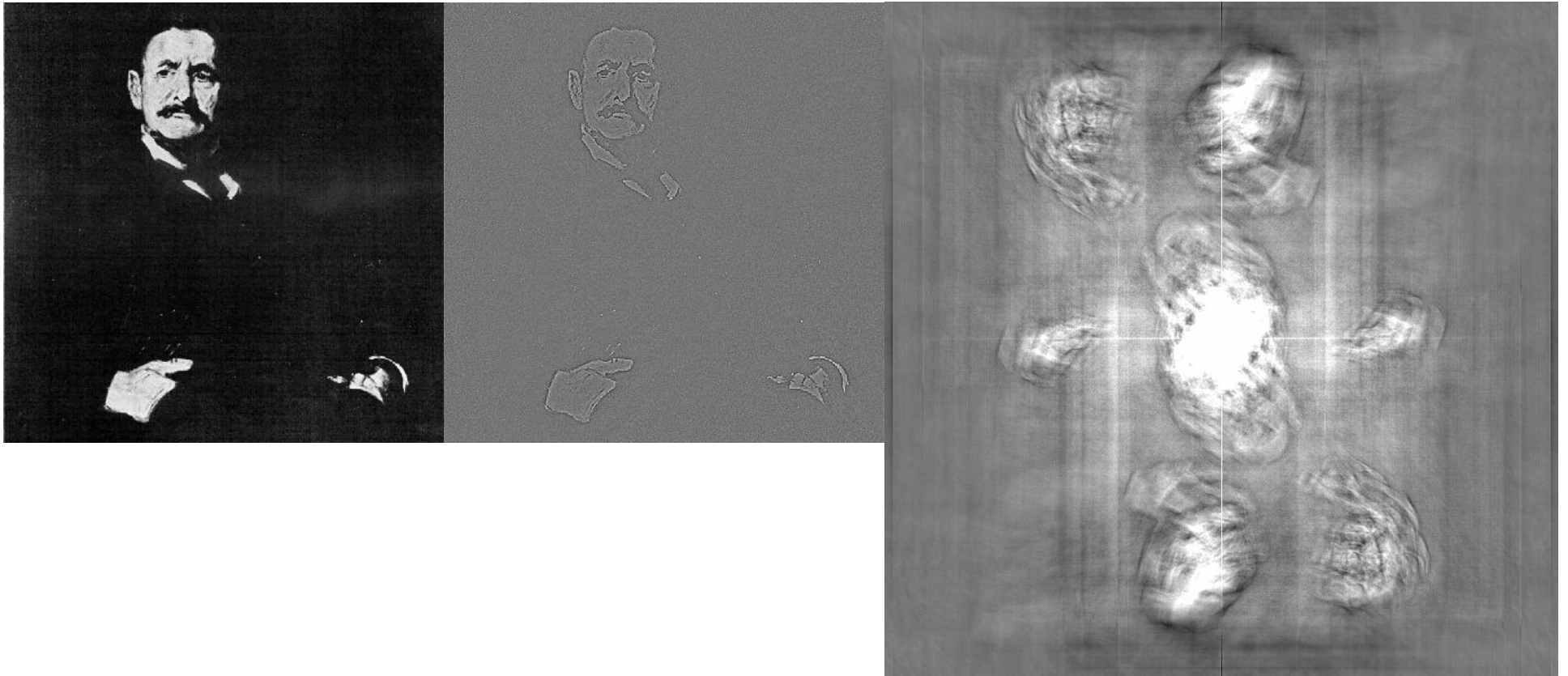


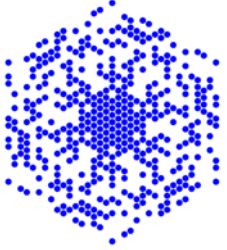
# Amplitudes and Phases





# Amplitudes and Phases II



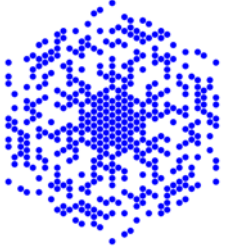


# Requirements for Imaging

---

- Complex Fourier Data (Vis + Phase)
  - Presently, require good SNR
  - Fourier Coverage is important
- Reliable errors
  - You might be held to them!
- Prior Knowledge
  - No negative flux; finite extent
  - Astrophysical constraints?





# Complex Antenna Gain

$$\begin{aligned}\tilde{E}_i^{\text{measured}} &= \tilde{G}_i \tilde{E}_i^{\text{true}} \\ &= |G_i| e^{i\Phi_i^G} \tilde{E}_i^{\text{true}}.\end{aligned}$$

Telescope Gain  
(e.g., coupling efficiency  
into single-mode fiber)

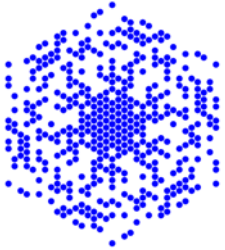
Telescope Phase Shift  
(e.g., atmospheric piston,  
bad baseline, thermal drifts)

Since  $\tilde{\mathcal{V}}_{ij} \propto \tilde{E}_i \cdot \tilde{E}_j^*$ ,

$$\tilde{\mathcal{V}}_{ij}^{\text{measured}} = \tilde{G}_i \tilde{G}_j^* \tilde{\mathcal{V}}_{ij}^{\text{true}}$$

$$= |G_i| |G_j| e^{i(\Phi_i^G - \Phi_j^G)} \tilde{\mathcal{V}}_{ij}^{\text{true}}$$

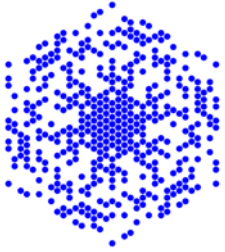
Phase shift of  
detected Fringe



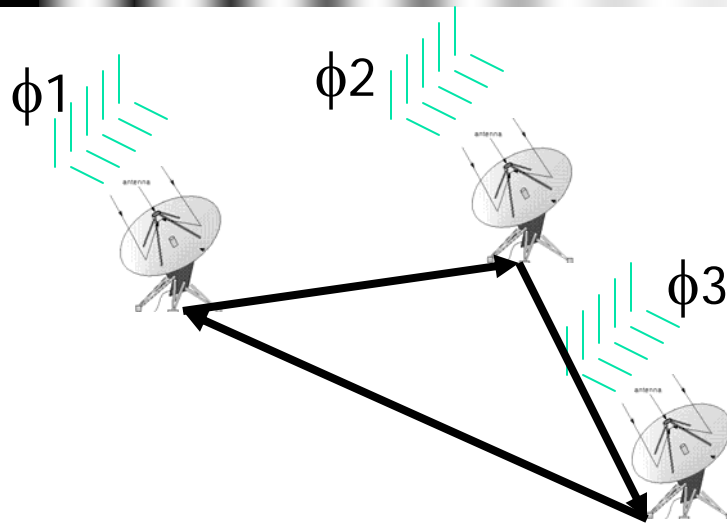
# Phase Retrieval

---

- Phase Referencing
  - Nod to a phase cal (OK if long atm coherence time)
  - Phase calibrator within Isoplanatic Patch?
  - Self-Reference (e.g. reference from different wavelength)
- Absolute estimation of  $\Delta\Phi$ 
  - Works in mm and sub-mm.
  - Perhaps possible in optical (at least to a degree)...
- Closure Phase
  - Recover most of the phase information
  - Good interferometric observable



# Closure Phase

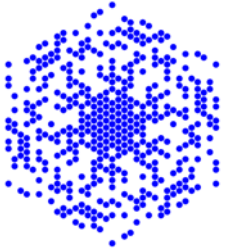


Observed	Intrinsic	Atmosphere
$\Phi(1-2)$	$= \Phi_n(1-2)$	$+ [\phi(2)-\phi(1)]$
$\Phi(2-3)$	$= \Phi_n(2-3)$	$+ [\phi(3)-\phi(2)]$
$\Phi(3-1)$	$= \Phi_n(3-1)$	$+ [\phi(1)-\phi(3)]$

Closure Phase (1-2-3)	$= \Phi_o(1-2) + \Phi_o(2-3) + \Phi_o(3-1)$
-----------------------	---------------------------------------------

Related to the Bispectrum,  $B_{ijk}$ :

$$\begin{aligned}
 \tilde{B}_{ijk} &= \tilde{v}_{ij}^{\text{measured}} \tilde{v}_{jk}^{\text{measured}} \tilde{v}_{ki}^{\text{measured}} \\
 &= |G_i| |G_j| e^{i(\Phi_i^G - \Phi_j^G)} \tilde{v}_{ij}^{\text{true}} \cdot |G_j| |G_k| e^{i(\Phi_j^G - \Phi_k^G)} \tilde{v}_{jk}^{\text{true}} \cdot |G_k| |G_i| e^{i(\Phi_k^G - \Phi_i^G)} \tilde{v}_{ki}^{\text{true}} \\
 &= |G_i|^2 |G_j|^2 |G_k|^2 \tilde{v}_{ij}^{\text{true}} \cdot \tilde{v}_{jk}^{\text{true}} \cdot \tilde{v}_{ki}^{\text{true}} .
 \end{aligned}$$



# How much phase information?

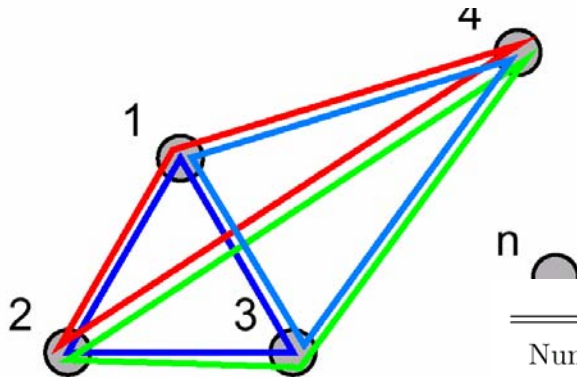
Closure Phases are not all independent from each other.

Number of Closure Phases

$$\binom{N}{3} = \frac{(N)(N-1)(N-2)}{(3)(2)},$$

Number of Fourier Phases

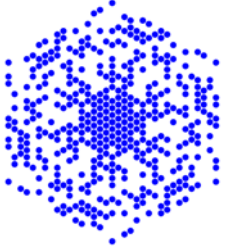
$$\binom{N}{2} = \frac{(N)(N-1)}{2}$$



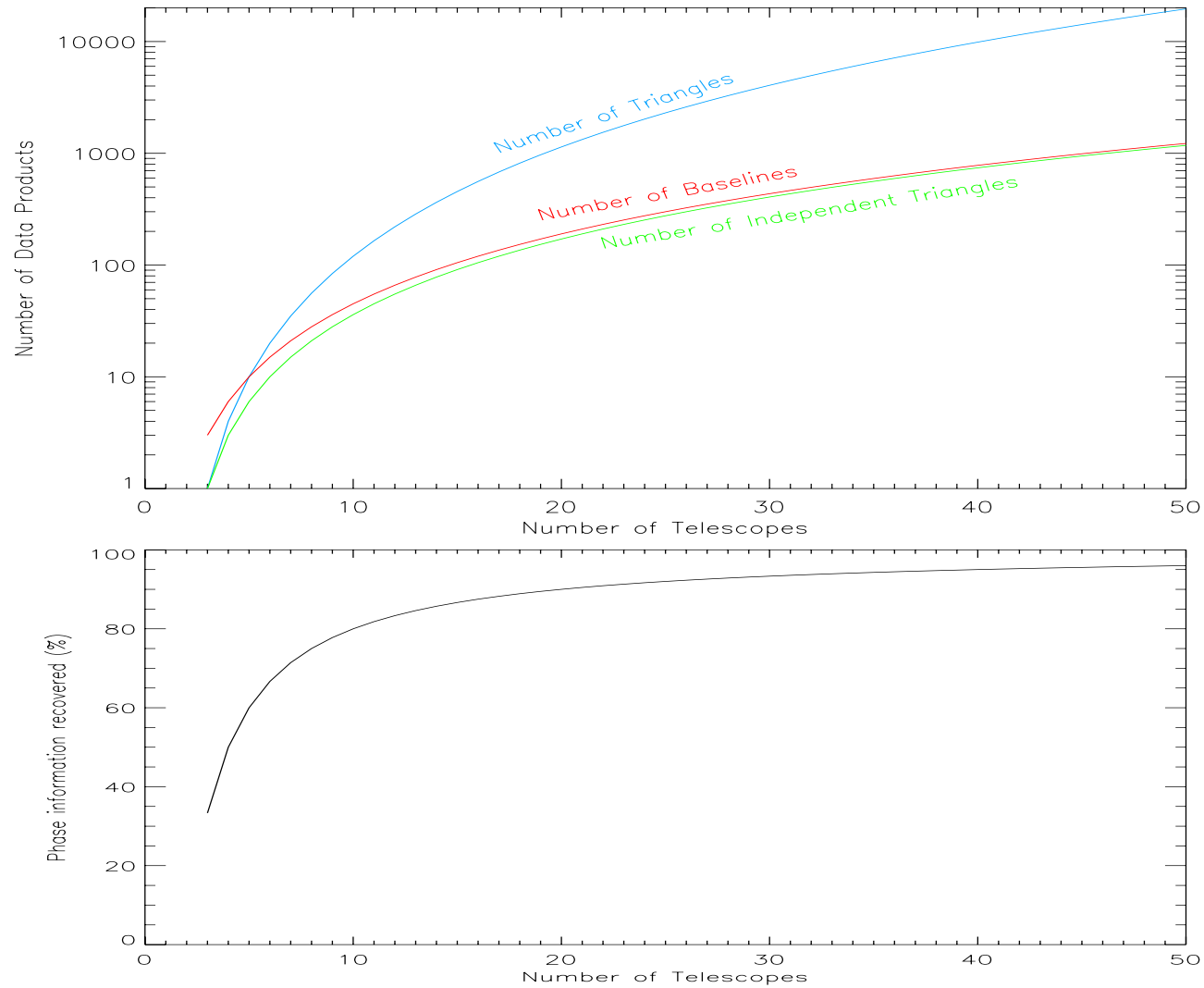
Number of Independent Closure Phases

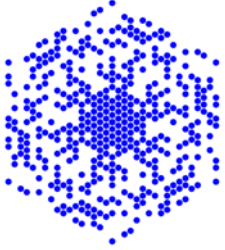
$$\binom{N-1}{2} = \frac{(N-1)(N-2)}{2}$$

Number of Telescopes	Number of Fourier Phases	Number of Closing Triangles	Number of Independent Closure Phases	Percentage of Phase Information
3	3	1	1	33%
7	21	35	15	71%
21	210	1330	190	90%
27	351	2925	325	93%
50	1225	19600	1176	96%



# Most of the phase is recovered



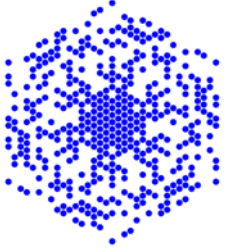


# Closure Amplitudes

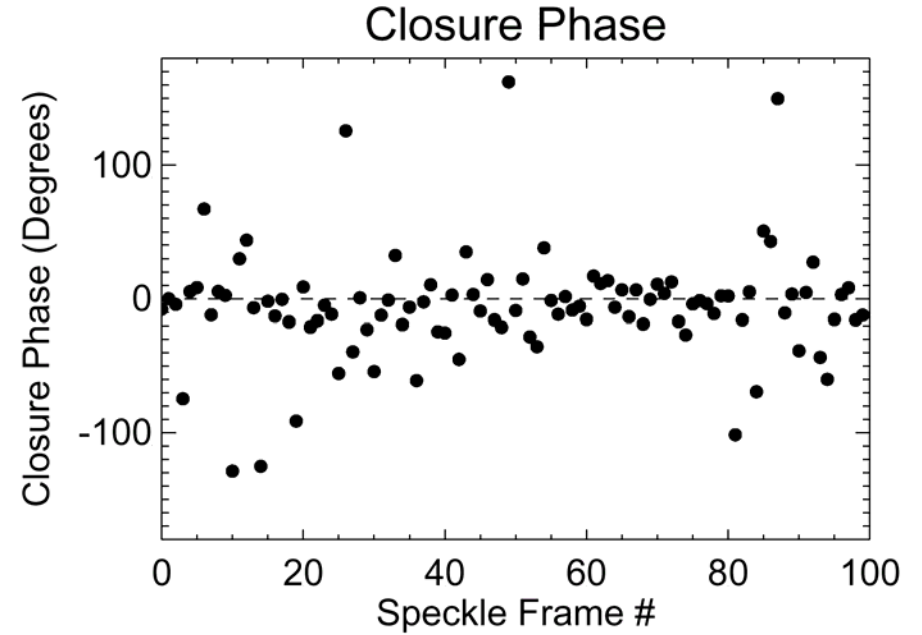
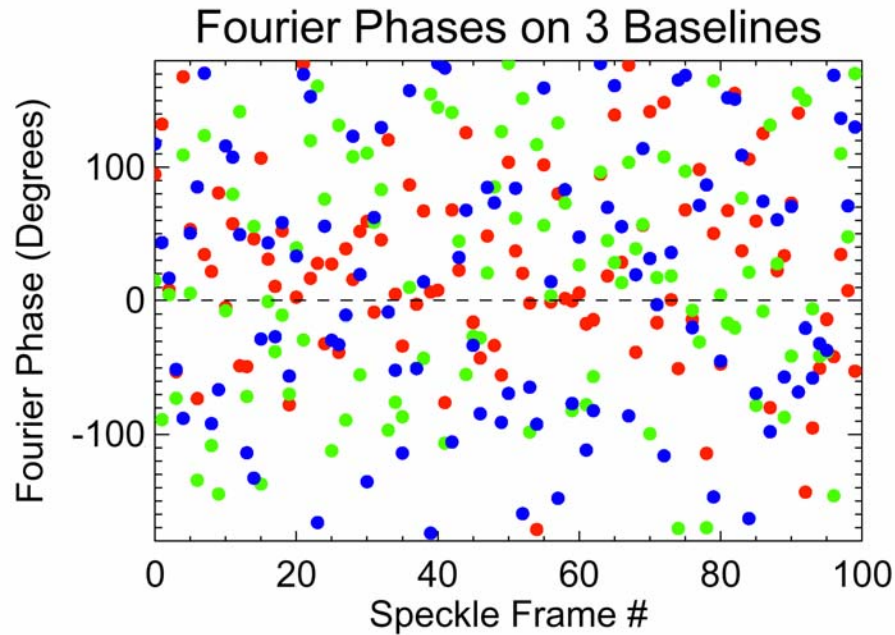
$$\begin{aligned} A_{ijkl} &= \frac{|\tilde{\mathcal{V}}_{ij}^{\text{measured}}| |\tilde{\mathcal{V}}_{kl}^{\text{measured}}|}{|\tilde{\mathcal{V}}_{ik}^{\text{measured}}| |\tilde{\mathcal{V}}_{jl}^{\text{measured}}|} \\ &= \frac{|\tilde{G}_i| |\tilde{G}_j| |\tilde{\mathcal{V}}_{ij}^{\text{true}}| |\tilde{G}_k| |\tilde{G}_l| |\tilde{\mathcal{V}}_{kl}^{\text{true}}|}{|\tilde{G}_i| |\tilde{G}_k| |\tilde{\mathcal{V}}_{ik}^{\text{true}}| |\tilde{G}_j| |\tilde{G}_l| |\tilde{\mathcal{V}}_{jl}^{\text{true}}|} \\ &= \frac{|\tilde{\mathcal{V}}_{ij}^{\text{true}}| |\tilde{\mathcal{V}}_{kl}^{\text{true}}|}{|\tilde{\mathcal{V}}_{ik}^{\text{true}}| |\tilde{\mathcal{V}}_{jl}^{\text{true}}|} \end{aligned}$$

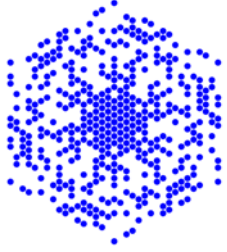
Closure amplitudes have not been used effectively in optical interferometry because fringe amplitude fluctuations are mostly caused by variable atmospheric coherence (and because there are few 4-telescope arrays).

However, closure amplitudes should be useful for interferometers using spatial filters such as single-mode fibers.

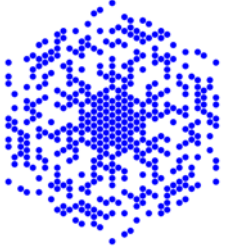


# Example: Phase and Closure Phase from Keck data



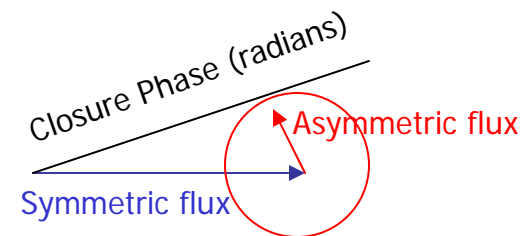


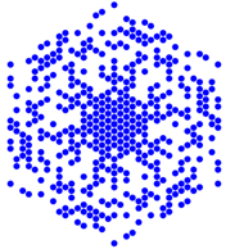




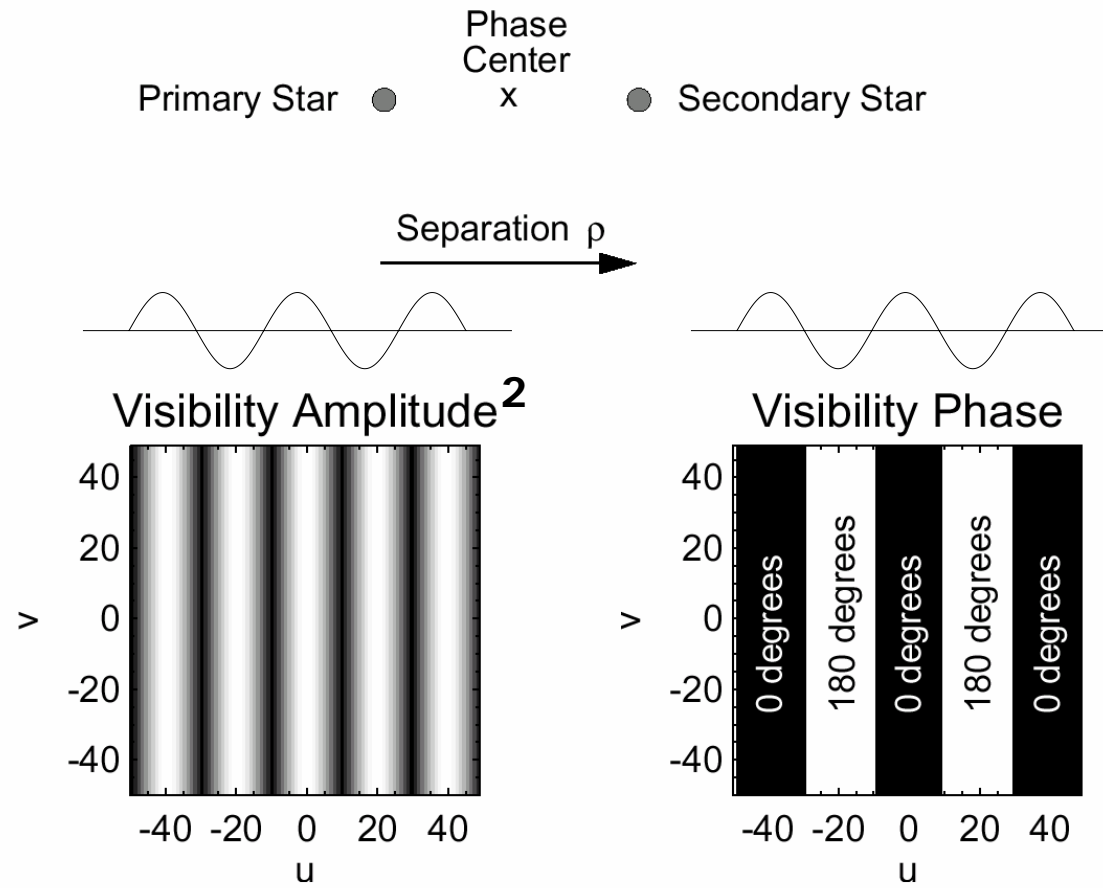
# Properties of Closure Phase

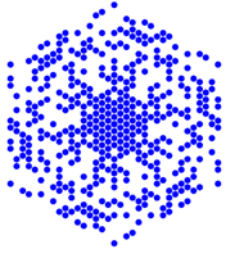
- Robust to *telescope-specific* calibration errors
  - Atmospheric turbulence generally does not bias phase measurements (unlike  $\text{Visibility}^2$ ). But biases (e.g. photon noise) and errors (e.g. from pairwise beam combination) can exist.
  - Hope to beat down measurement error as  $\sqrt{N}$
- Sensitive to asymmetries in brightness distribution
  - The Bispectrum is REAL for point-symmetry ( $\Phi_{CP} = 0$  or  $180$  degs)
  - Magnitude of CLP signal given by the ratio of symmetric to asymmetric flux at that resolution



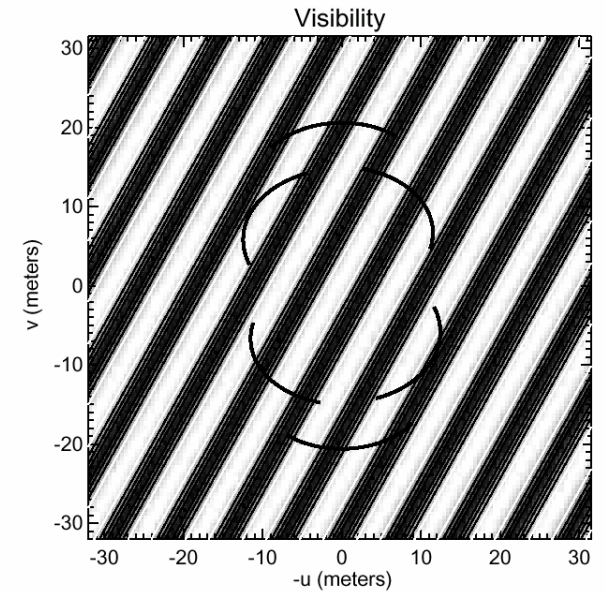
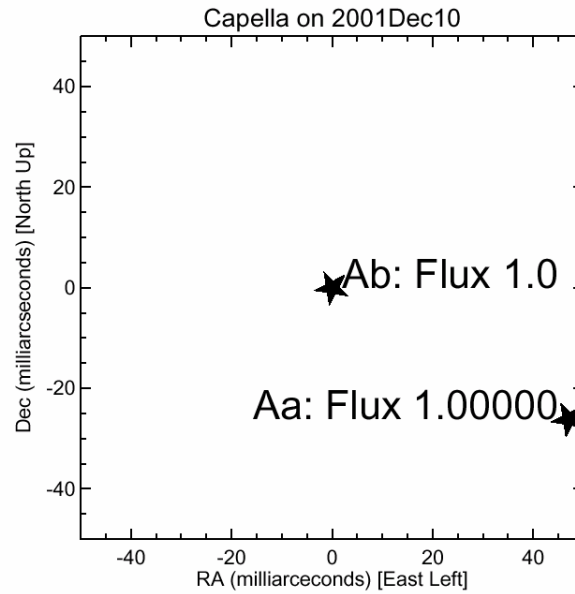
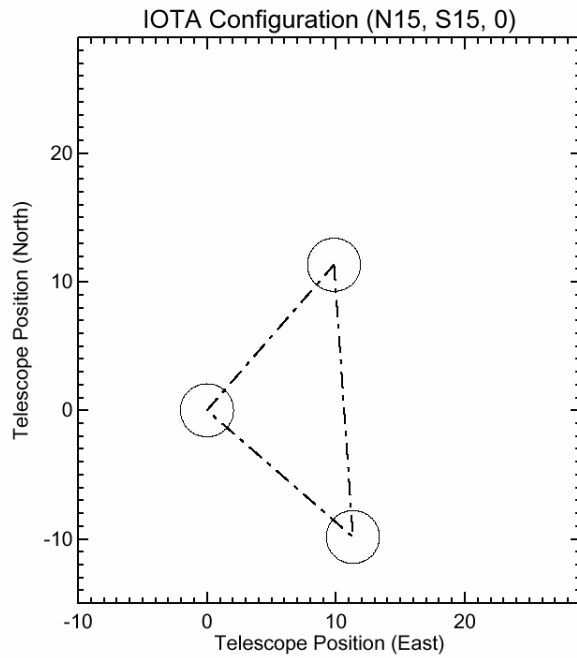


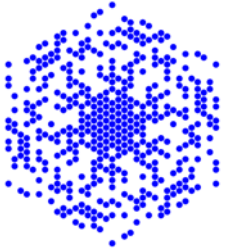
# Simple Example: equal binary



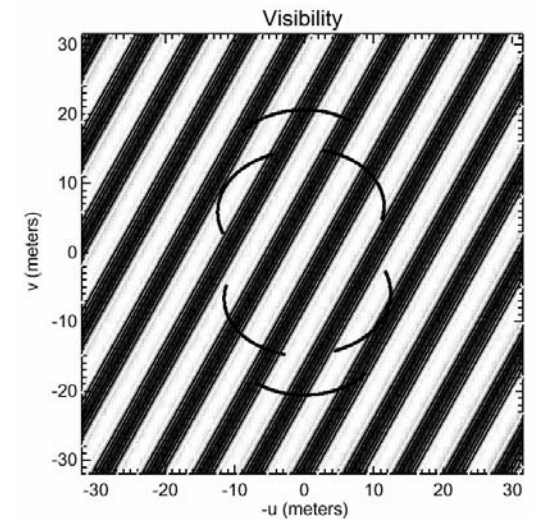
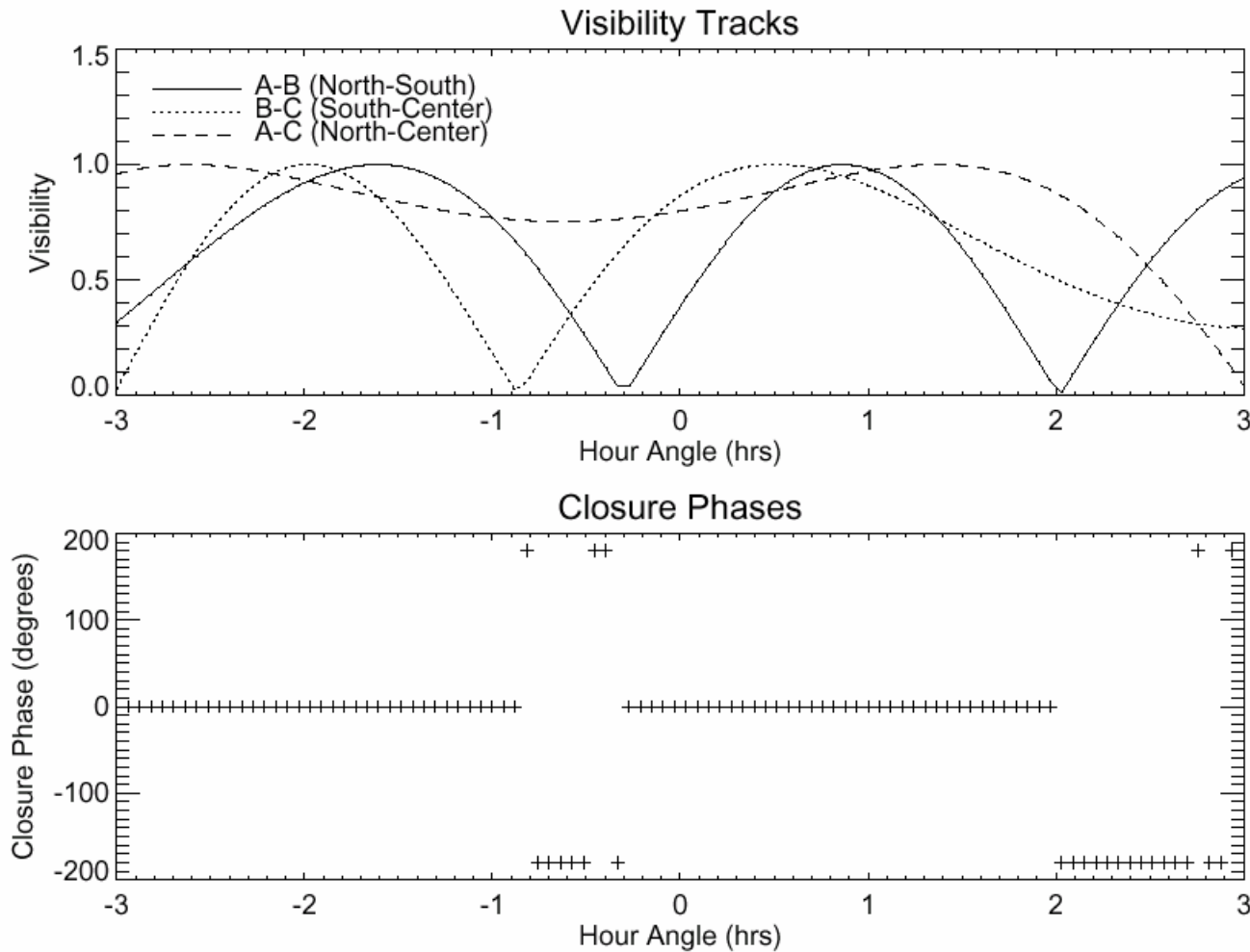


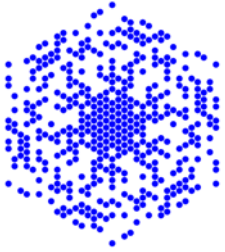
# Equal Binary: Simulation with 3 telescope synthesis





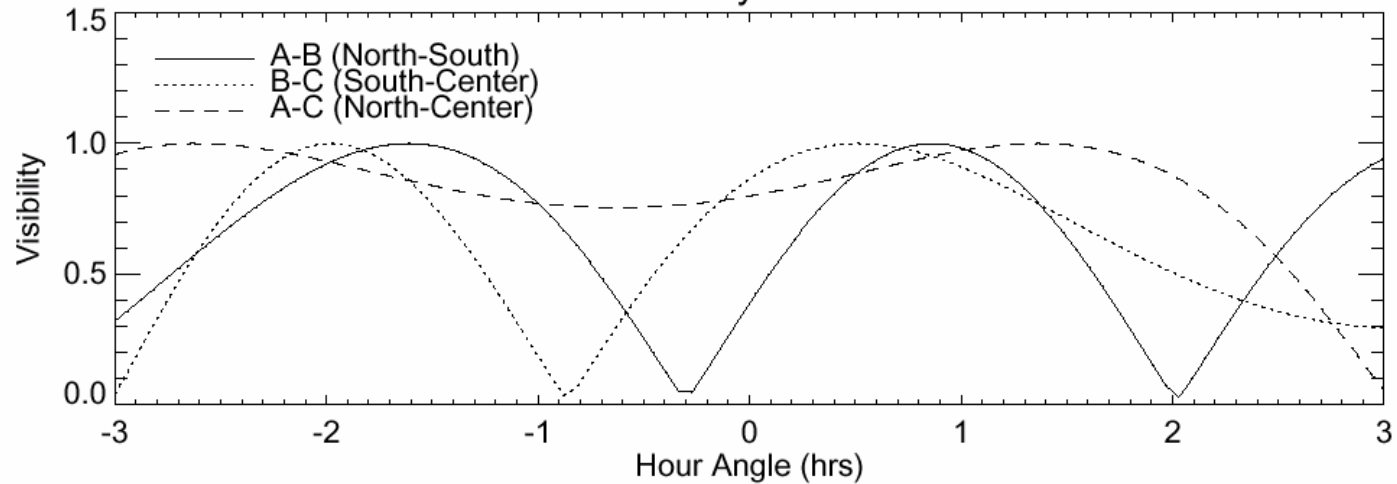
# Equal Binary: Vis and CLP tracks



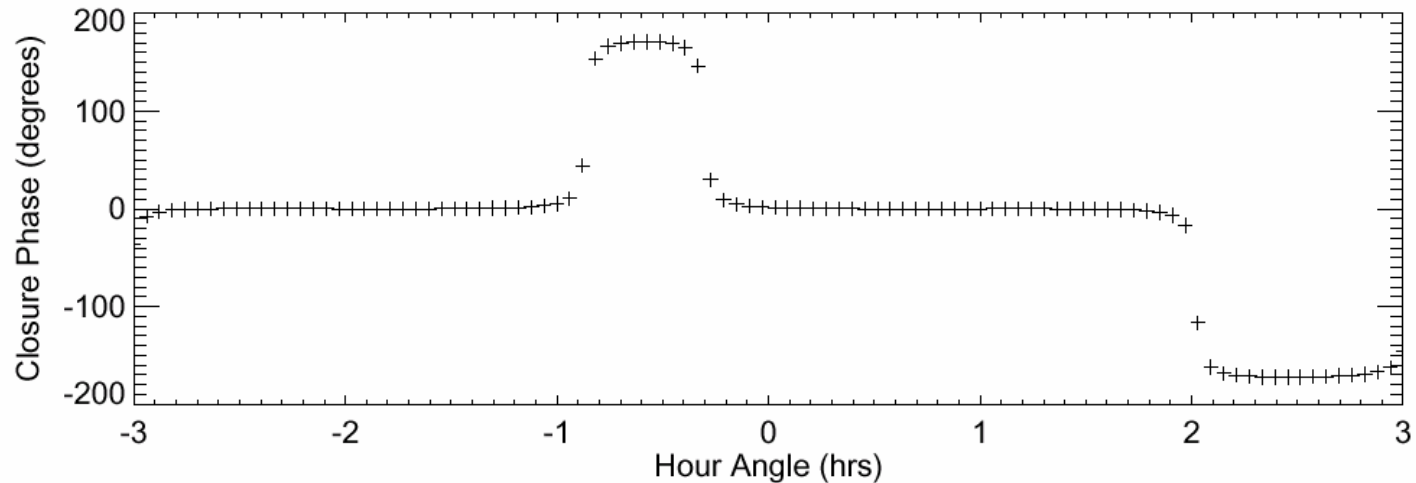


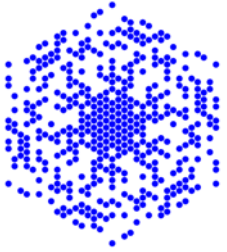
# Almost-Equal binary 1.05 : 1

Visibility Tracks



Closure Phases



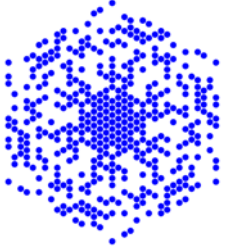


# Getting from data to Image



Current status of Imaging for  
Optical Interferometry

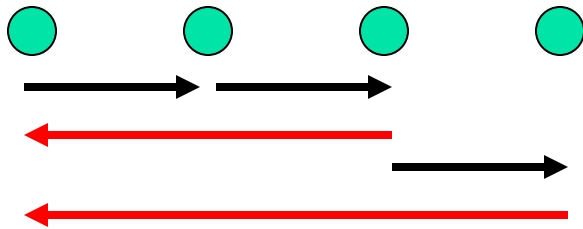
- Fourier Data are Incomplete
- Fourier Data have Noise
- Phases need to be found from Closure Phases
- External assumptions are required



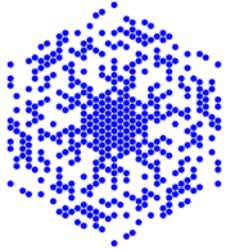
# Baseline Bootstrapping

---

Redundant array:  
baseline bootstrapping



- Pros
  - Direct recovery of the phase
  - Minimal initial assumptions
- Cons
  - Cumulative error propagation
  - Array must be redundant

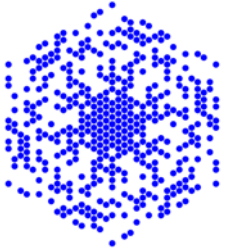


# Phase Recovery: Image Plane Constraints

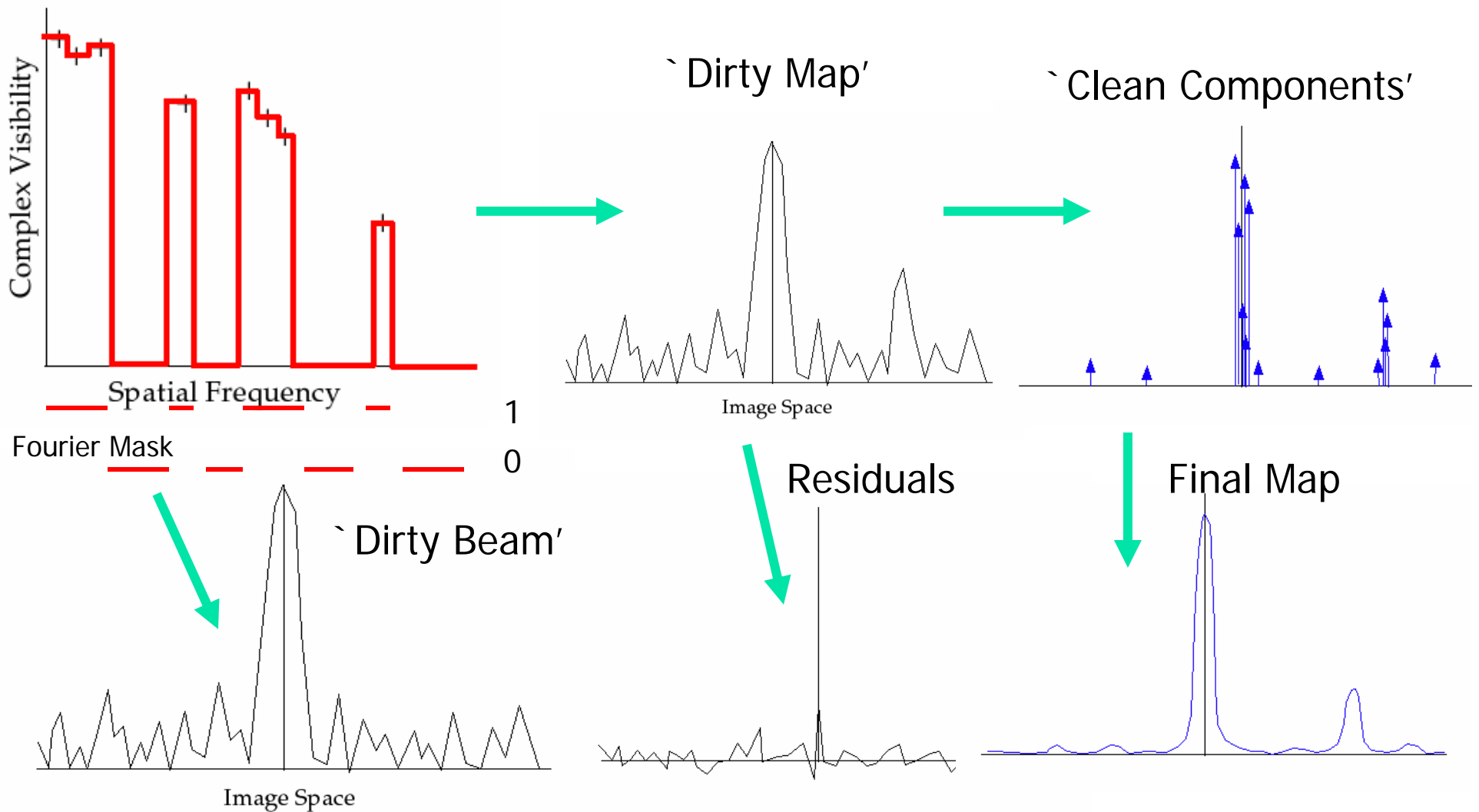
---

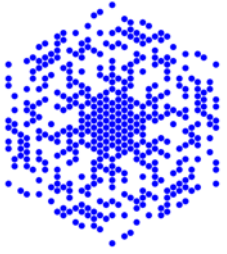
- **Finite extent**
  - Flux from a bounded region of image space
- **Positive Definite**
  - No negative photons
- **Smoothness**
  - Image as smooth as is consistent with the data
- **Prior Information**
  - From other observations or theoretical considerations



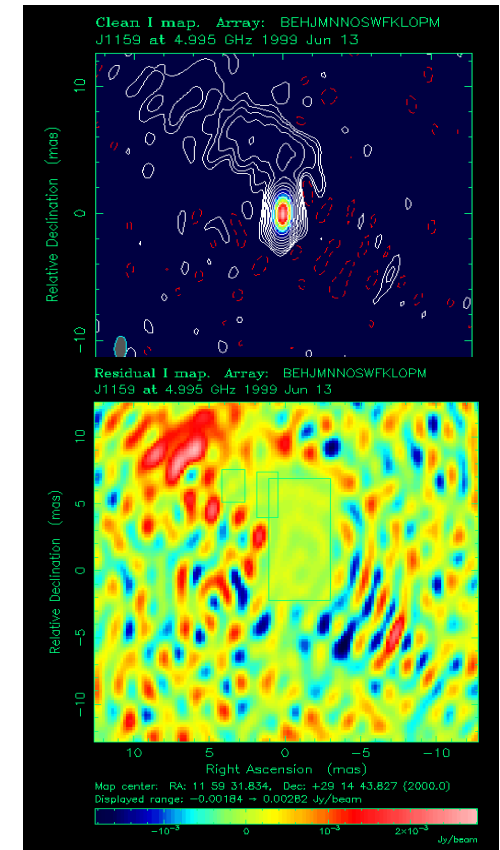
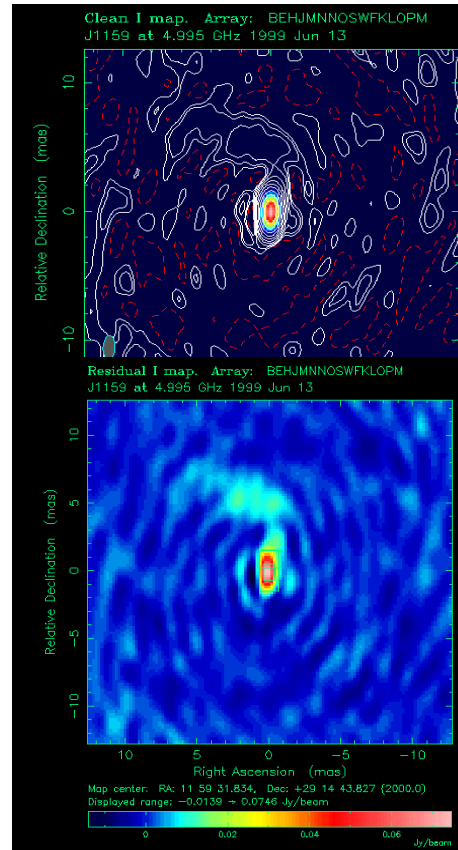
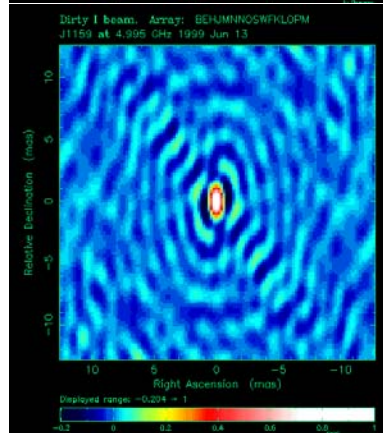
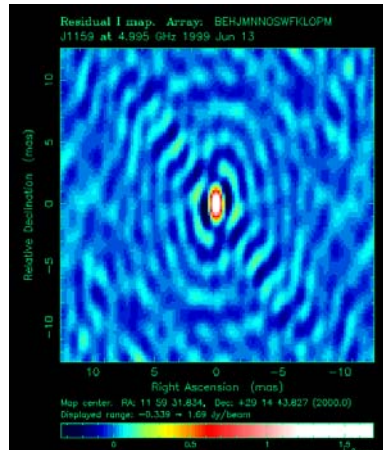
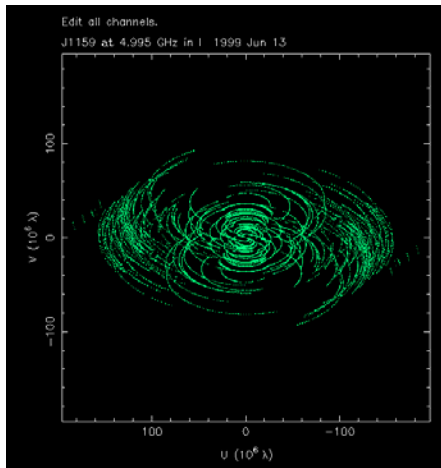


# Deconvolution: Clean





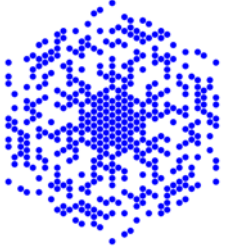
# CLEAN: example VLA 5 GHz



From Mike  
Garrett, NRAO  
summer school

Clean 30

Clean 2300



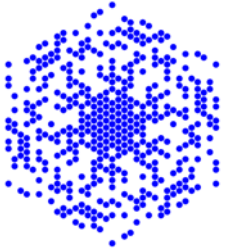
# CLEAN Comments

- Pros:
  - Intuitive, numerically quick, intensively developed in radio
- Cons:
  - Generates Negative Flux
  - After reconvolving, solution no longer fits data
  - Difficult to incorporate errors
  - Arbitrary parameters: gain, stopping point
  - Diverges if left to iterate.
  - Very difficult to put on rigorous statistical footing

## **SIRIUS CYBERNETICS CORPORATION PRODUCTS:**

**“It is very easy to be blinded to the essential uselessness of them by the sense of achievement you get from getting them to work at all ... their fundamental design flaws are completely hidden by their superficial design flaws.”**

**Douglas Adams, Hitch Hiker’s Guide to the Galaxy.**



# A Bayesian Approach to Regularization: MEM

## ■ Maximum Entropy Method

- Philosophy: Of that set of images which all fit the data adequately (in a chi-squared sense), we should choose the one with the *least* information (*Occam's Razor*)
- Information content of an image can be quantified by the ENTROPY:

Fraction of flux in pixel  $i$

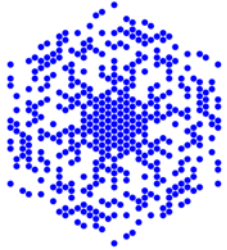
Entropy  $S = - \sum_i f_i \ln \frac{f_i}{I_i}$

Skilling & Bryan (1984)

Image prior

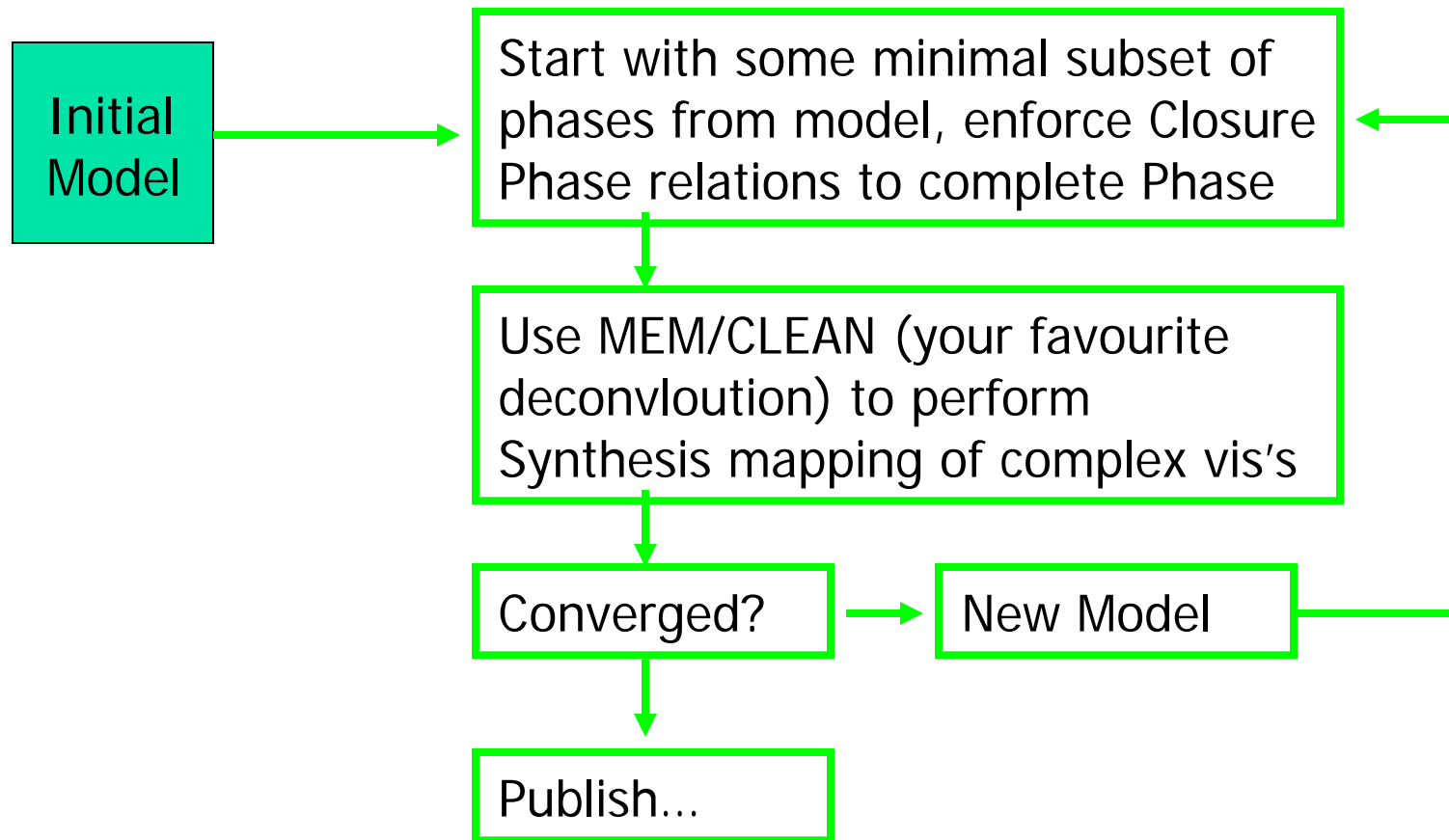
Sum over all pixels

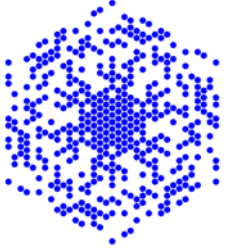
- Naturally enforces positivity
- Statistically tractable
- Incorporates Prior information (no data: output=prior)
- Smoothness criterion results in super-resolution



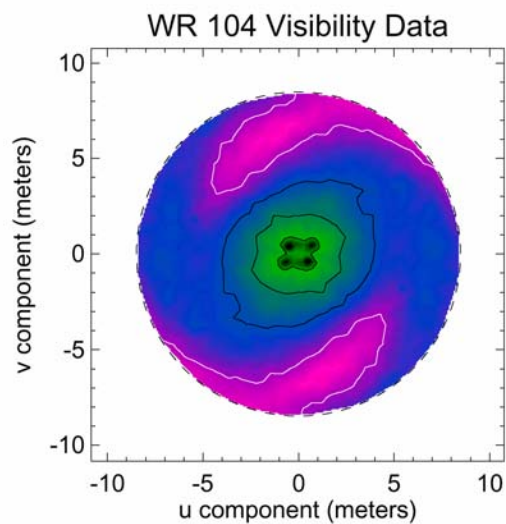
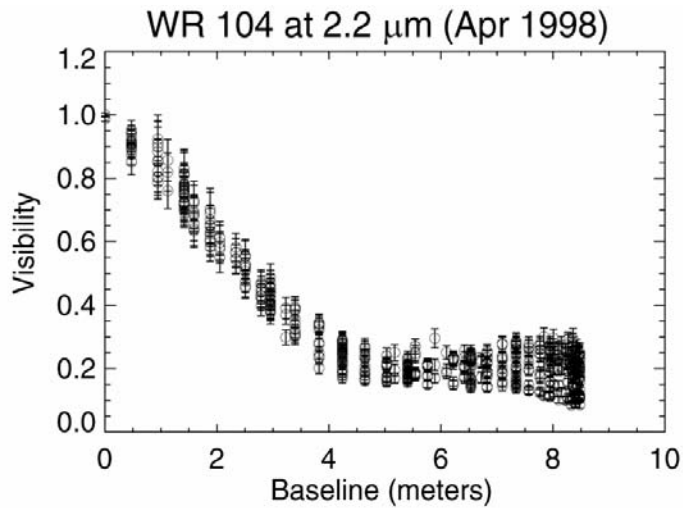
# Self-Cal

Problem: We can't start deconvolution without complex vis's (not CLP's)

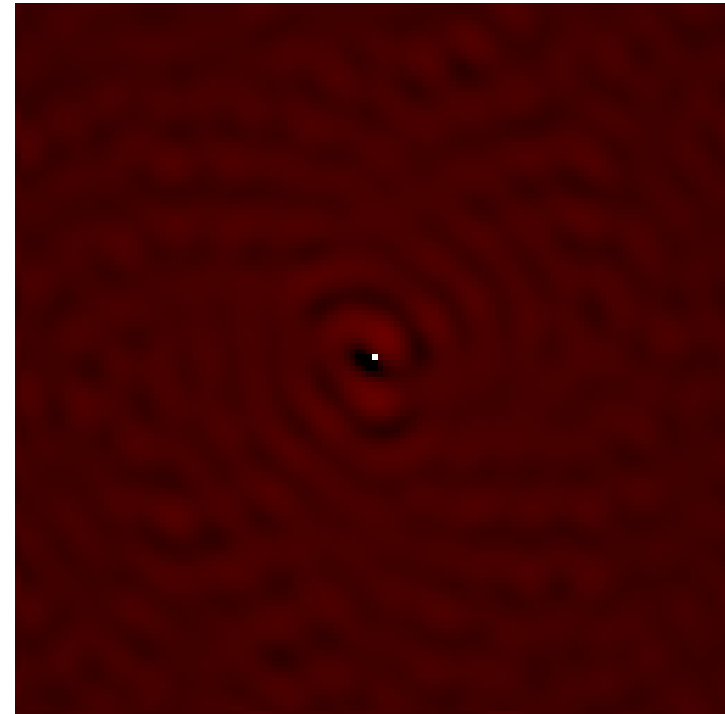




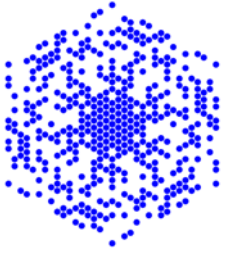
# Example: WR 104 data



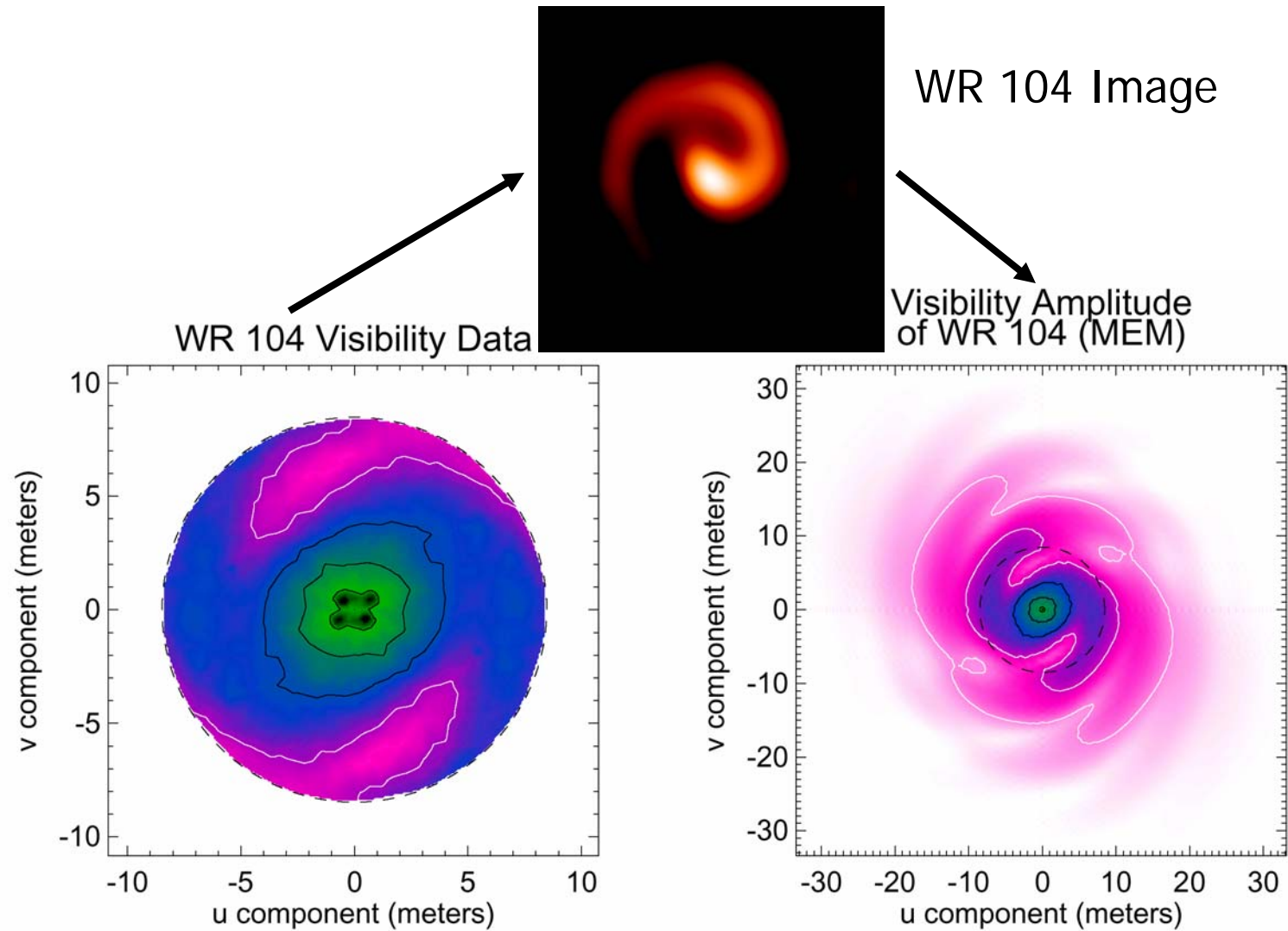
Iterations 1 to 30

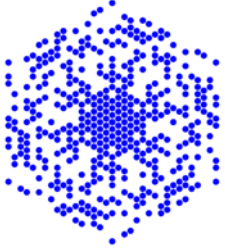


WR 104 (2.2 microns)

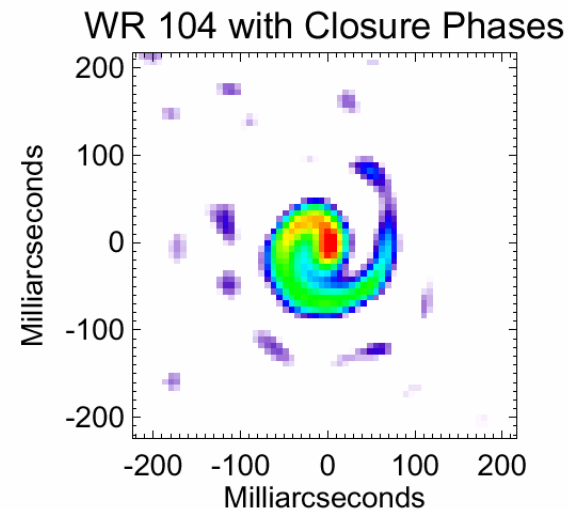
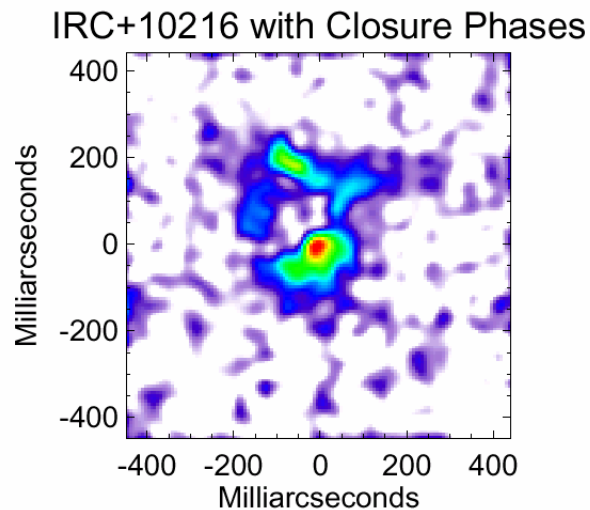
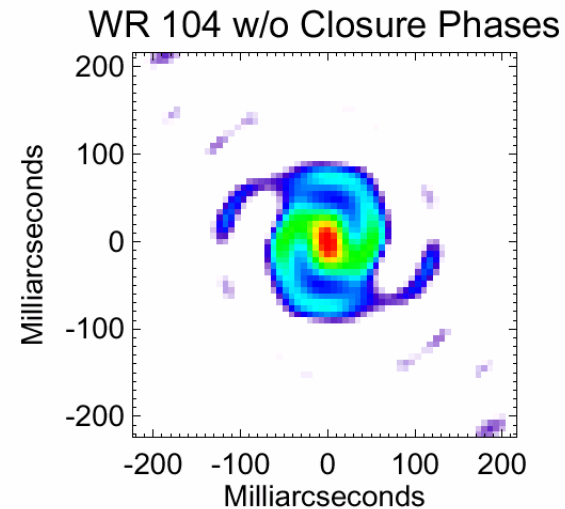
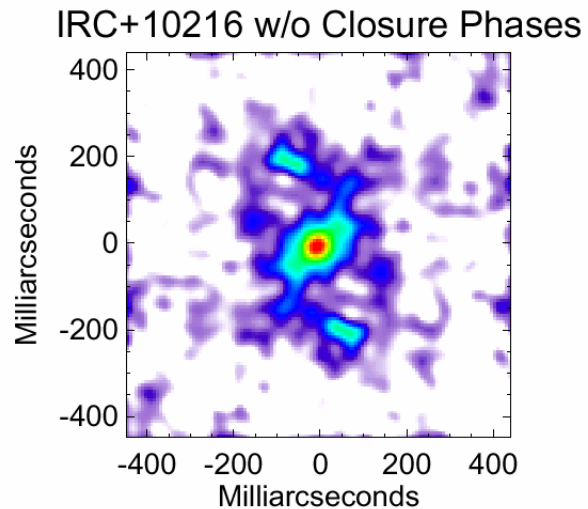


# Super-Resolution (and snake oil)

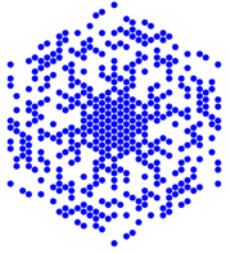




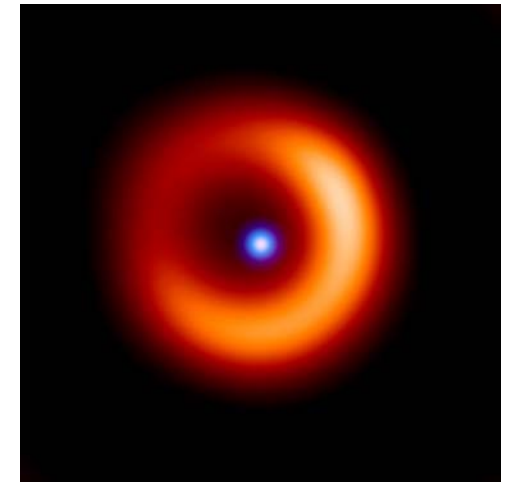
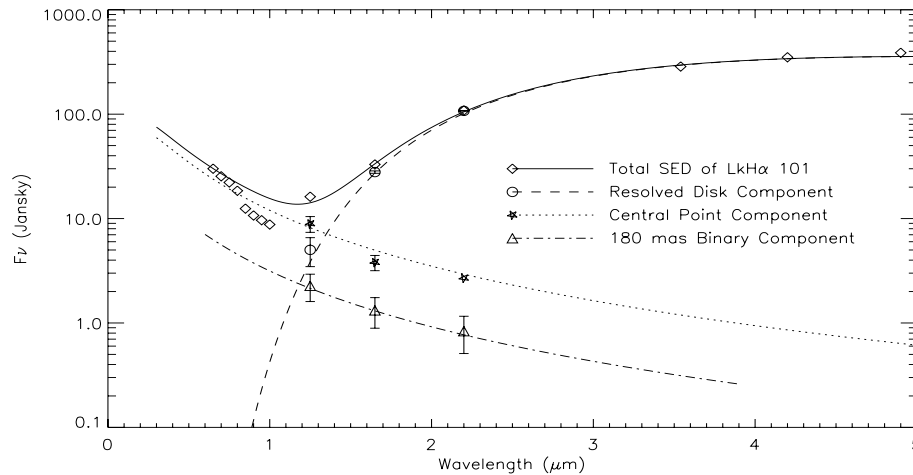
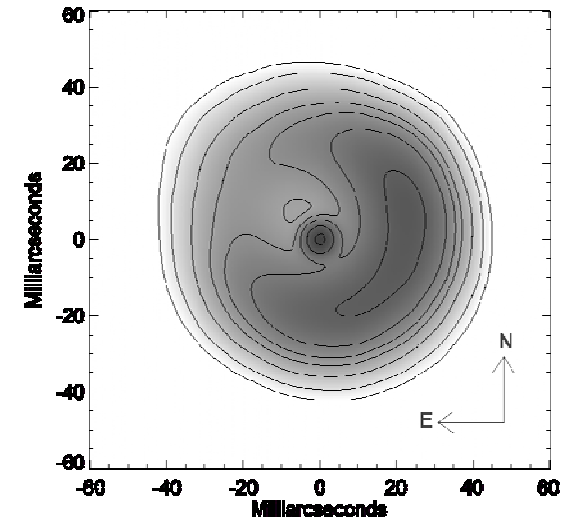
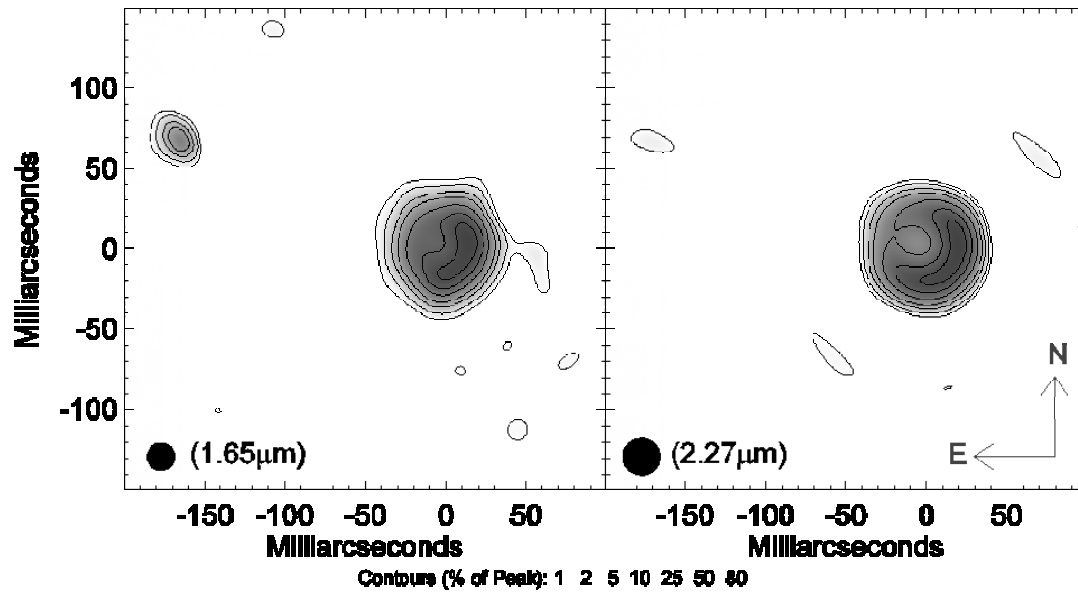
# The importance of closure phase

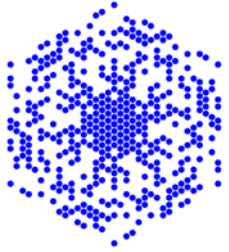






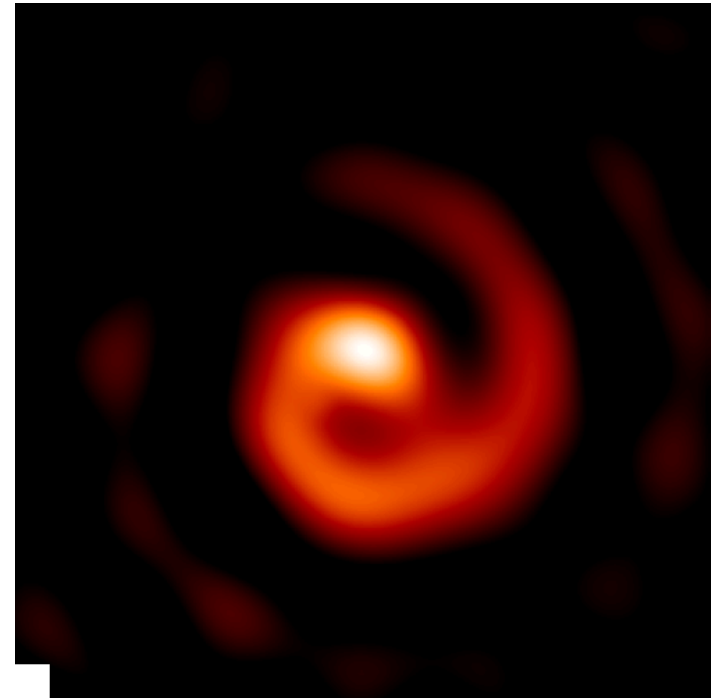
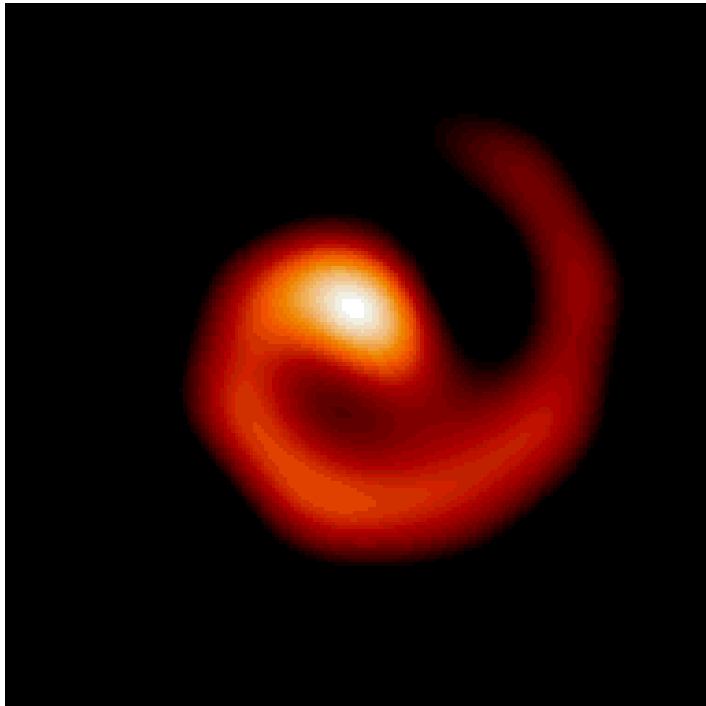
# Using extra information in mapping: Case Study





# Colliding Winds in WR 104

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75 AU

Actual Observations  
Period 243.5 days