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# Resolved kinematics of galaxies from Australia SKA Pathfinder (ASKAP) WALLABY

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*+ ASKAP WALLABY kinematics working group*

# 'Resolved' kinematic analysis for galaxies (from HI surveys)

1970s

- **25** spiral galaxies from **WSRT observations** (Bosma 1978)

1990s

- **21** spirals in the center of Virgo Cluster from **VLA observations** (Guhathakurta & van Gorkom 1988)
- **25** late-type and dwarf galaxies from **WSRT WHISP** (Swaters 1999)
- **30** spirals in the Ursa Major Cluster from **WSRT observations** (Verheijen 1997)

2010s

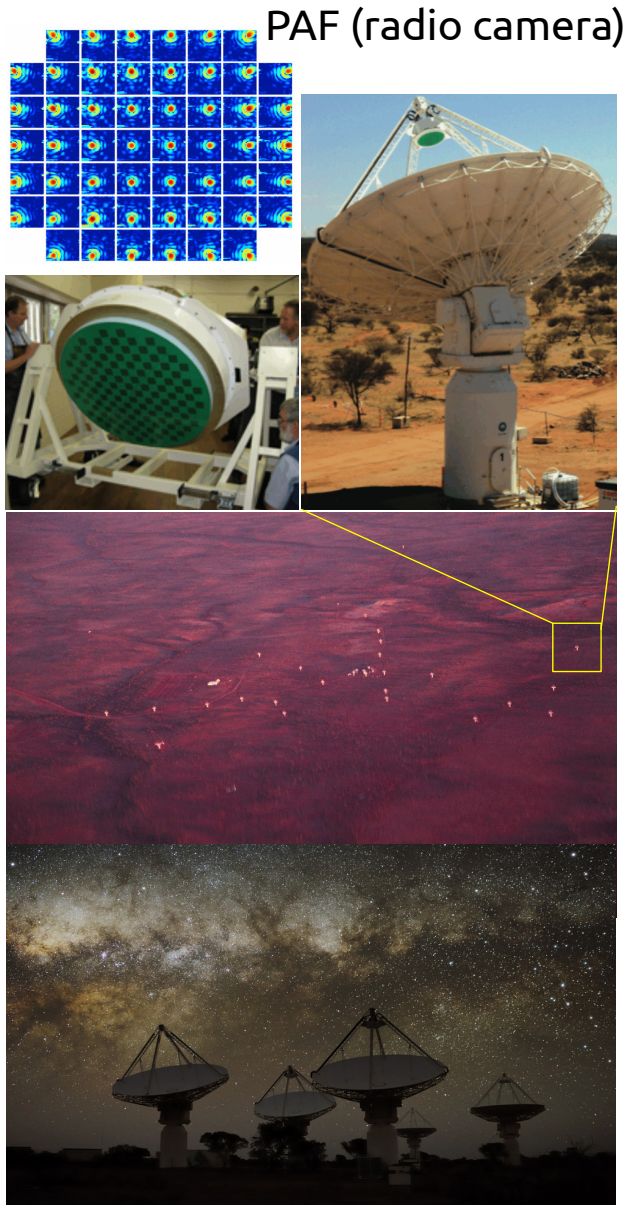
- **21** late-type and dwarf galaxies from **VLA THINGS** (de Blok et al. 2008; Oh et al. 2008)
- **52** dwarf galaxies from **GMRT FIGGS** (Begum et al. 2008)
- **33** dwarf galaxies from **VLA THINGS + LITTLE THINGS** (Oh et al. 2011; Oh et al. 2015)
- **24** spirals from **WSRT HALOGAS** (Heald et al. 2011)
- **26** late-type and dwarf galaxies from **ATCA LVHIS** (Kamphuis et al. 2015; Oh et al. 2018)
- **35** dwarf galaxies from **VLA-ANGST** (Ott et al. 2012)
- **12** dwarf galaxies from **VLA SHIELD** (McNichols et al. 2016)
- **300 SAMI galaxies** from **GMRT follow-up observations** (Kamphuis et al.)
- **28** spiral galaxies from **ATCA IMAGINE** (Popping et al.)

2020s  
onwards

- **> 10,000** *resolved* galaxies from **SKA pathfinders' surveys** (ASKAP, MeerKAT & Apertif)

→ need to prepare for the unprecedented data flow from the upcoming 3D spectroscopic galaxy surveys including SKA pathfinders' large surveys

# ASKAP large survey proposals



- 12m x 36 dishes, 10–30” beam (up to 6 km baseline)
- 700 MHz – 1.8 GHz (32,768 channels over 300 MHz BW)
- 188 phase array elements → 30 deg<sup>2</sup> FOV
- Continuum & spectral lines
- 12 Phased Array Feeds (PAFs) installed → *ASKAP-12 early science observations have been on-going since Oct/2016*

## 10 ASKAP Large Survey Projects

- Evolutionary Map of the Universe (EMU)
- **Widefield ASKAP L-Band Legacy All-Sky Blind Survey (WALLABY)**
- The First Large Absorption Survey in HI (FLASH)
- An ASKAP Survey for Variables and Slow Transients (VAST)
- The Galactic ASKAP Spectral Line Survey (GASKAP)
- Polarization Sky Survey of the Universe's Magnetism (POSSUM)
- The Commensal Real-time ASKAP Fast Transients survey (CRAFT)
- **Deep Investigations of Neutral Gas Origins (DINGO)**
- The High Resolution Components of ASKAP: Meeting the Long Baseline Specifications for the SKA (VLBI)
- Compact Objects with ASKAP: Surveys and Timing (COAST)



# MeerKAT large survey proposals

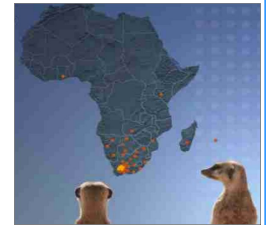
*This is not a CG but a real photo !*



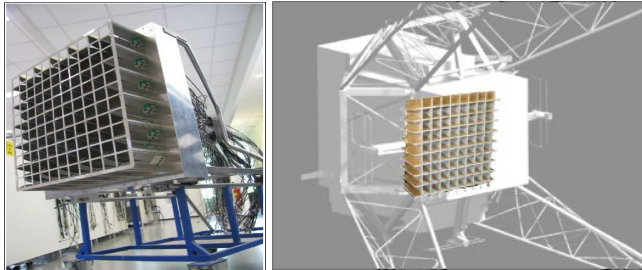
- 13.5m x 64 dishes, 8" beam over 1.8 deg<sup>2</sup> FOV
- Antenna layout: a dense inner component (70%) + an outer component (30%) over 30m to 8 km
- 580 MHz – 14.5 GHz (32,768 channels over 300 MHz BW)
- Continuum & spectral lines
- *MeerKAT AR1 (16 dishes) has started its early science observation from early 2017*

## 10 MeerKAT Large Survey Projects

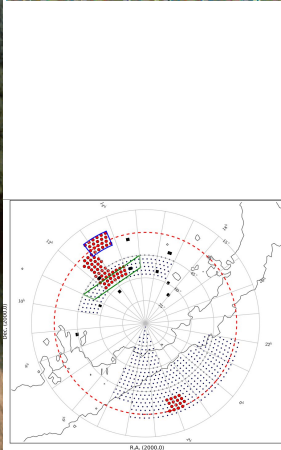
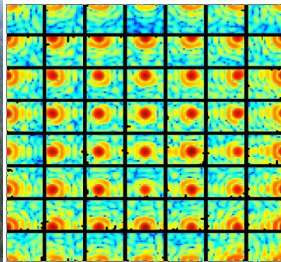
- Radio Pulsar Timing: Testing Einstein's theory of gravity and gravitational radiation
- **LADUMA (Looking at the Distant Universe with the MeerKAT Array)**
- MESMER (MeerKAT Search for Molecules in the Epoch of Re-ionisation)
- MeerKAT Absorption Line Survey for atomic hydrogen and OH lines in absorption against distant continuum sources
- **MHONGOOSE (MeerKAT HI Observations of Nearby Galactic Objects: Observing Southern Emitters)**
- TRAPUM (Transients and Pulsars with MeerKAT)
- A MeerKAT HI Survey of the Fornax Cluster (Galaxy formation and evolution in the cluster environment)
- MeerGAL (MeerKAT High Frequency Galactic Plane Survey)
- MIGHTEE (MeerKAT International GigaHertz Tiered Extragalactic Exploration Survey)
- ThunderKAT (The Hunt for Dynamic and Explosive Radio Transients with MeerKAT)



# WSRT Apertif large survey proposals



- 25m x 14 dishes with Apertif : being upgraded to an HI survey telescope with FOV of  $\sim 8$  deg<sup>2</sup>;  $\sim 15''$  beam
- 1.0 – 1.7 GHz (16,384 channels over 300 MHz)
- *Commissioning is under way*

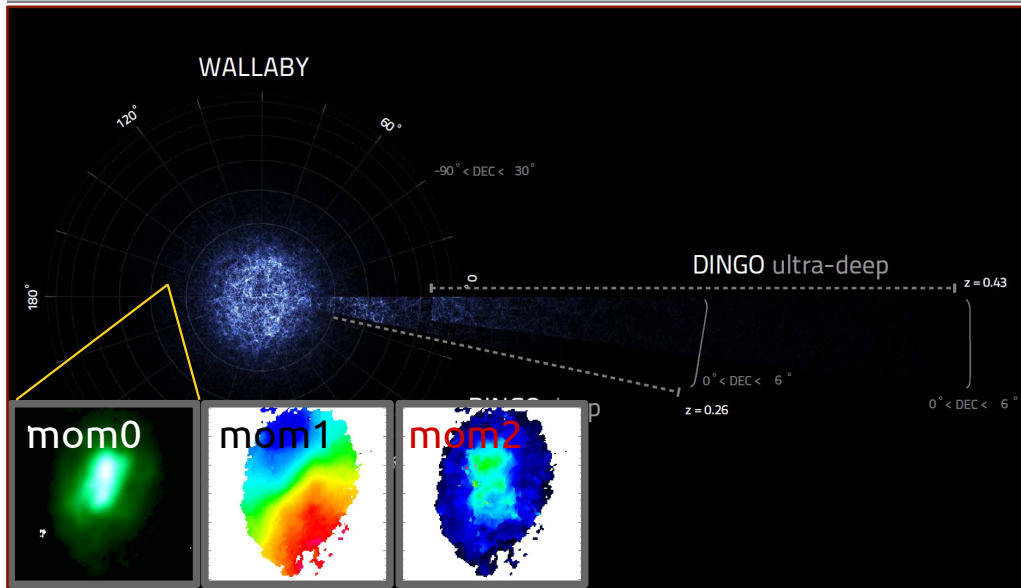


## Apertif large surveys

- An HI survey telescope in northern sky comparable to ASKAP
- A large area, **shallow imaging survey** of HI and polarised radio continuum emission covering  $\sim 3500$  deg<sup>2</sup>
- A **medium-deep imaging survey** of HI and polarised radio continuum emission covering  $\sim 450$  deg<sup>2</sup>
- A time domain survey for **pulsars and fast transients** over  $15,000$  deg<sup>2</sup>
- Follow-up of some LOFAR fields

# ASKAP all-sky HI survey (WALLABY)

: Baerbel Koribalski (CASS/CSIRO) & Lister Staveley-Smith (ICRAR/UWA)



- ASKAP 3 $\pi$  HI galaxy survey
  - ~5,000 hours of ASKAP time
  - > ~500,000 galaxies out to  $z \sim 0.26$  (~1 million if combined with Apertif observations)
  - > ~5,000 galaxies within 200 Mpc are spatially resolved: Resolved galaxy kinematics!
- Galaxies in local Universe / (dark) mass distribution in galaxies / Galaxy environments / Intergalactic HI / HI mass function / Galaxy clusters / High-velocity clouds / Multi-frequency synergies etc.

# 2D vs. 3D kinematic analysis

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## 2D kinematic analysis

- Ring-by-ring or entire disk fit to velocity fields projected from 3D cubes
- Affected by projection effect and beam smearing
- Challenging for edge-on like galaxies
- Rotcur / kinemetry / diskfit / nemo

## 3D kinematic analysis

- Use full information of spectral observations without any compression
- Ring-by-ring or 3D kinematic model fit to 3D cubes
- Less affected by projection effect and beam smearing
- Even works for edge-on like galaxies
- Higher degree of flexibility but CPU expensive and often too sensitive to inhomogeneous gas distributions
- FAT(TiRiFiC) / 3DBAROLO / GBKFIT, GALACTUS

# (2D) Tilted-ring analysis

- 2D tilted-ring model (Rogstad et al. 1974)

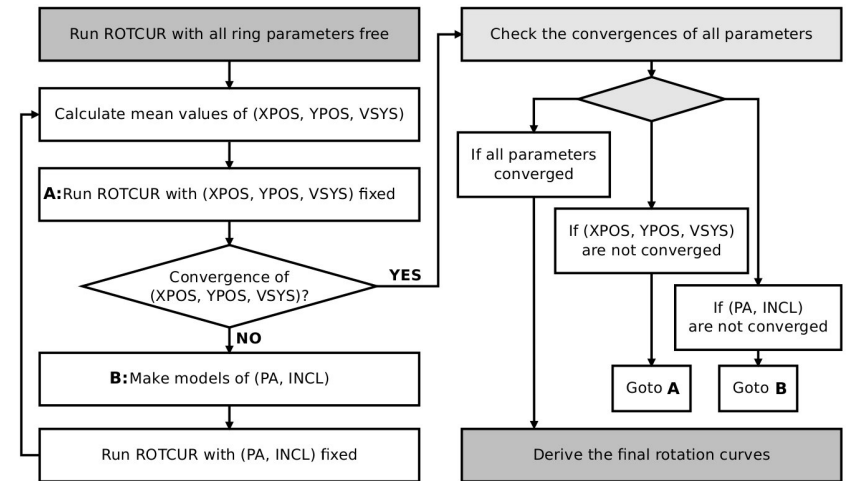
$$v_{\text{LOS}}(x, y) = v_{\text{SYS}} + \sin i \{v_{\text{ROT}}(r) \cos \theta + v_{\text{EXP}}(r) \sin \theta\}$$

where

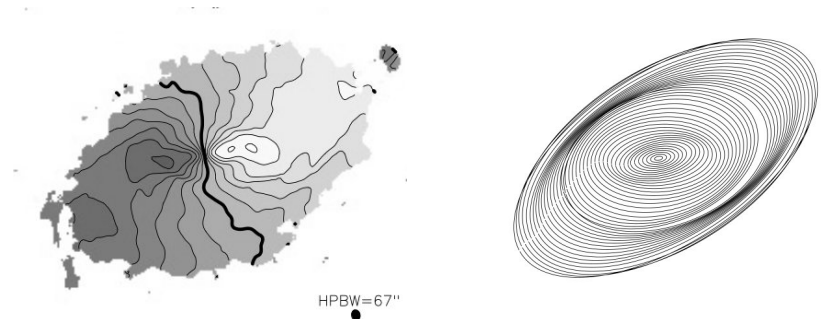
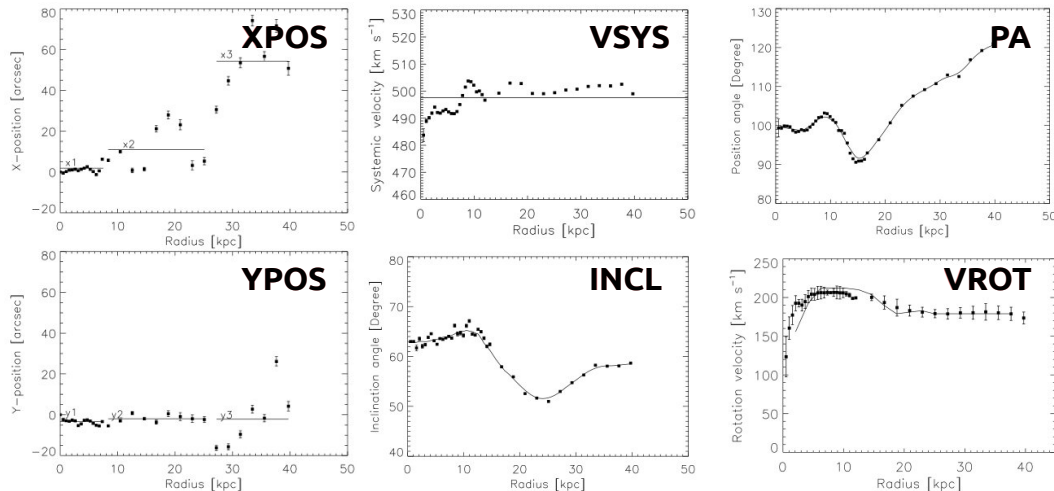
$$\cos \theta = \frac{-(x - x_C) \sin \phi + (y - y_C) \cos \phi}{r}$$

$$\sin \theta = \frac{-(x - x_C) \cos \phi - (y - y_C) \sin \phi}{r \cos i}$$

- An example of conventional TR analysis



Oh et al. (2009)



NGC 5055 (Battaglia et al. 2005)



# Key requirements of the kinematic analysis for WALLABY

: in a 2D perspective *(see Kamphuis et al. 2015 for a 3D view)*

- **Robustness**
  - insensitive to initial estimates
  - insensitive to localized outliers
  - flexible regularization for PA/INCL/VEXP/VROT
- **Efficiency**
  - fast but reliable fitting of the resolved disk galaxies from the massive WALLABY data stream
- **Automation**
  - determine initial priors
  - check convergence

→ Fit 2D kinematic disc models to the entire region of input velocity fields in a Bayesian framework at one time

→ Find the best fits via MCMC sampling given priors of the ring parameters

→ Parallel processing using multi-cores

# 2D Bayesian Automated Tilted-ring fitter (2DBAT)

- 2D kinematic model based on B-splines + Einasto rotation velocity

single values

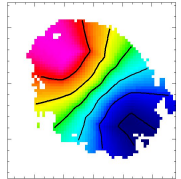
regularized by the below forms:

$$v_{\text{MODEL}} = v_{\text{MODEL}}(x_C, y_C, v_{\text{SYS}}, c_i^{v_{\text{EXP}}}, c_m^\phi, c_n^i, n, r_{-2}, \rho_{-2})$$

where

$$\phi(r) = \sum_{m=1}^n c_m^\phi B_{m,k}^\phi(r) \quad \text{INCL} \quad i(r) = \sum_{m=1}^n c_m^i B_{m,k}^i(r) \quad \text{VEXP} \quad v_{\text{EXP}}(r) = \sum_{m=1}^n c_m^{v_{\text{EXP}}} B_{m,k}^{v_{\text{EXP}}}(r)$$

$$\text{VROT} \quad v_E(r) = \sqrt{4\pi G n \frac{r_{-2}^3}{r} \rho_{-2} e^{2n} 2n^{-3n} \gamma(3n, \frac{r}{r_{-2}})}, \quad \gamma(3n, x) = \int_0^x dt e^{-t} t^{3n-1}$$



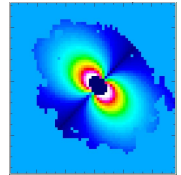
- A log-likelihood function for a Student-t distribution

$$\log L = \sum_{t=1}^N w_t \log \left[ \frac{\Gamma(\frac{\nu+1}{2})}{\sqrt{\pi(\nu-2)} \Gamma(\frac{\nu}{2})} \right] - \frac{1}{2} \sum_{t=1}^N w_t \log \sigma_t^2 - \frac{\nu+1}{2} \sum_{t=1}^N w_t \log \left[ 1 + \frac{\epsilon_t^2}{\sigma_t^2(\nu-2)} \right]$$

$$w_t = \frac{l_{\text{outermost}}}{l_t} \times \frac{|\cos(\theta_t)|^q}{v_t^{\text{LOS-error}}}$$

where

$$\epsilon_t = v_t^{\text{LOS}} - v_t^{\text{MODEL}}$$



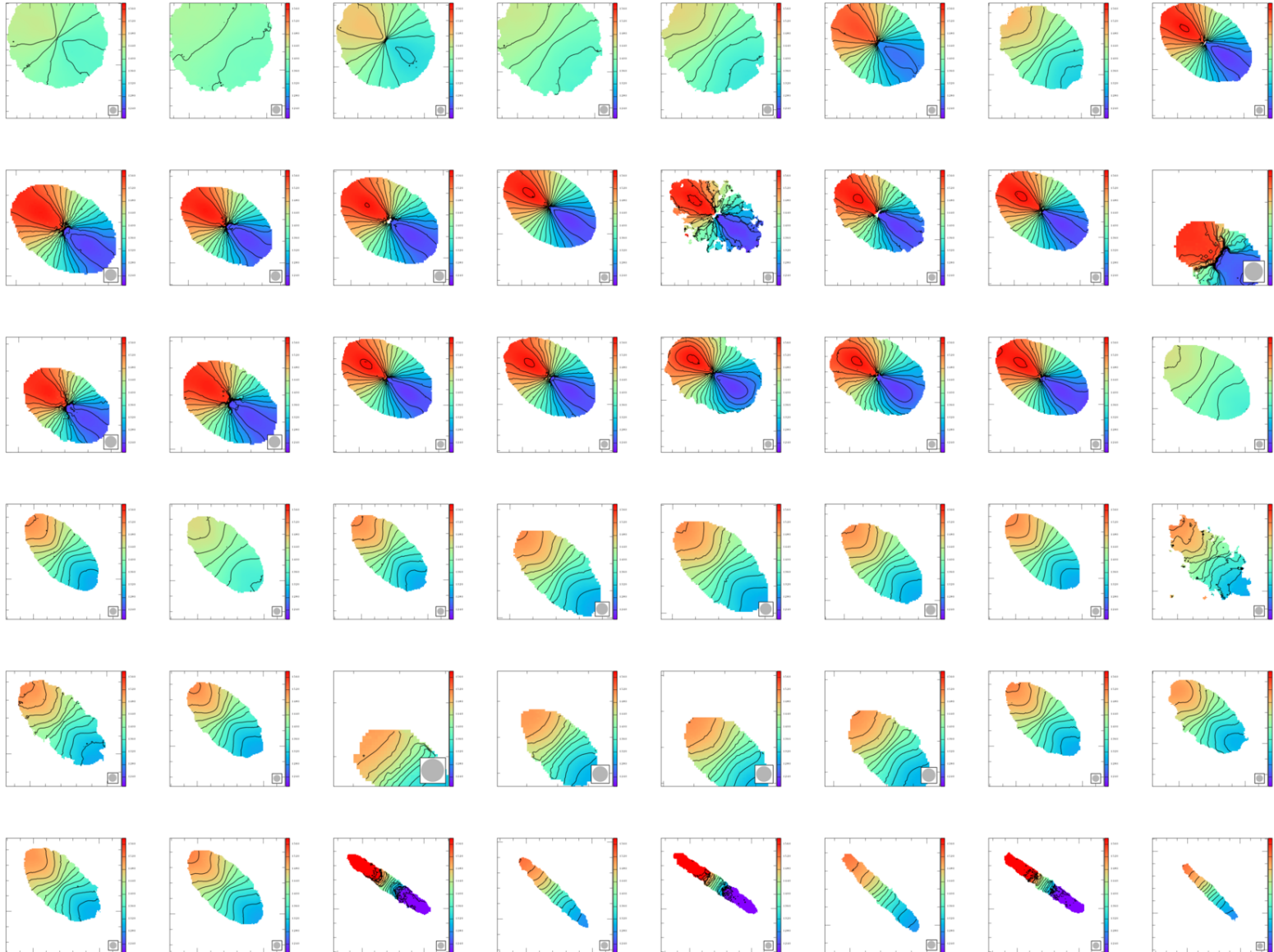
Oh et al. (2018)

## 2D Bayesian Automated Tilted-ring fitter (2DBAT)

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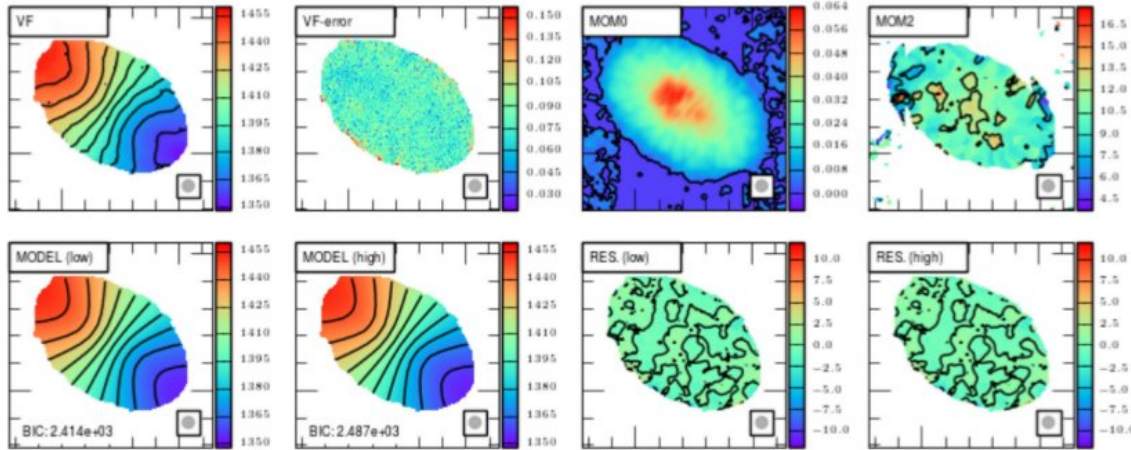
- A standalone code for 2D tilted-ring analysis based on Bayesian MCMC techniques
  - robust & coherent 2D kinematic analysis: (1) masks outlying pixels; (2) estimates priors; (3) regularise ring parameters with B-splines + Einasto profile; (4) carries out Bayesian fits & derives rotation curves
  - fully automated given broadly defined ranges of initial priors for the ring parameters
  - parallelised: Message Passing Interface (MPI) supported
  - written in C with publicly available libraries: MultiNest v3.10 (Feroz & Bridges 2008, 2009), cfitsio, GSL & standard MPI libraries
  - comprise the WALLABY kinematics pipeline together with the automated TiRiFiC (FAT)
  - downloadable at <http://github.com/seheonoh/2dbat>
  - cross-platform (linux/mac/windows) "*DOCKERIZED*" version available
  - See Oh et al. (2018) for a complete description of the code

# 2DBAT analysis for artificial galaxies

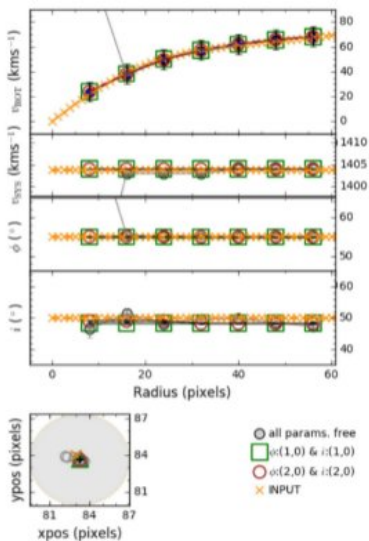


# 2DBAT analysis for artificial galaxies

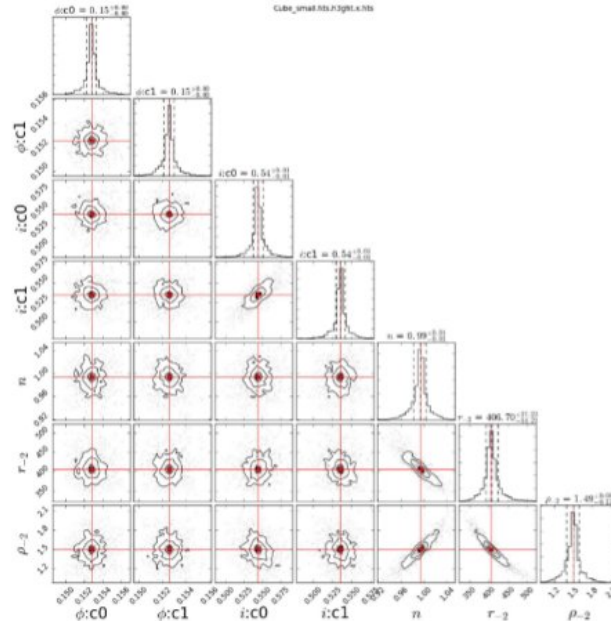
(a) Velocity fields & moment maps (i50d8.0-8.0-dwarf-pa55w0.00-0.00f0.2-0.2ba16SN8)



(b) 2D tilted-ring analysis



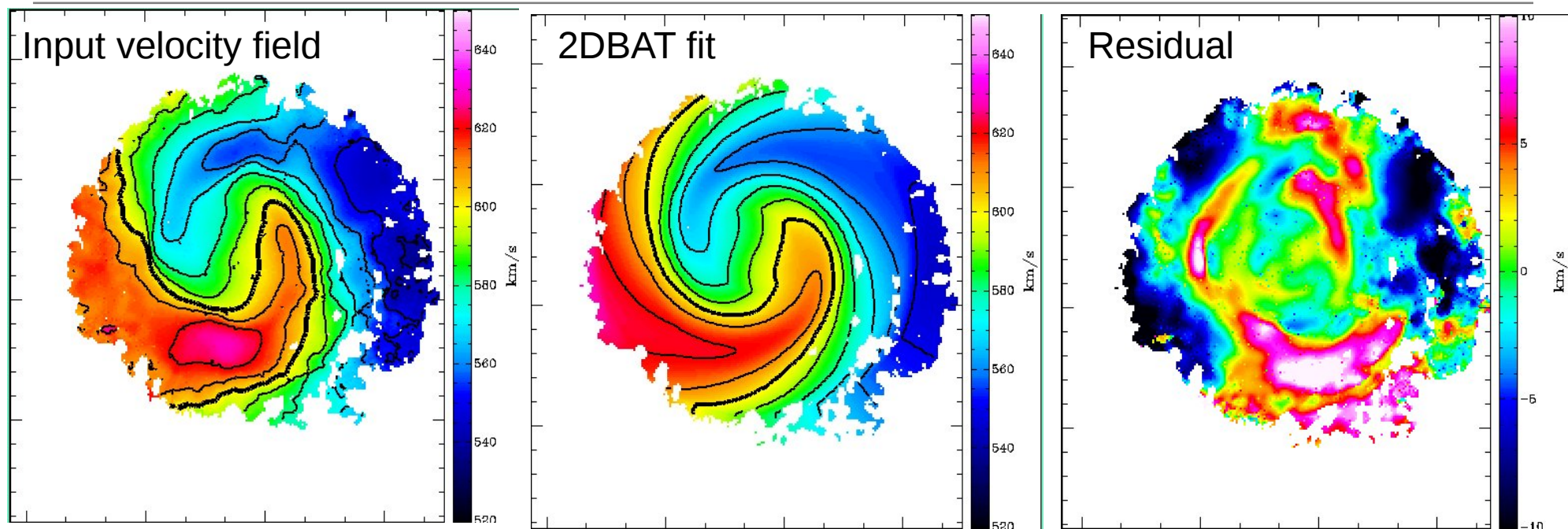
(c) correlations (high-order regularization)



- 52 artificial galaxies in Kamphuis et al. (2015)
  - two representative rotation curves of intermediate-mass and massive disk galaxies as well as a solid body-like rotation curve of dwarf galaxies
  - 4 km/s of channel resolution
  - white noise added
  - smoothing the cubes with a Gaussian beam with FWHM of 30''
- Run 2DBAT on their extracted Hermite h3 velocity fields given the degree of regularization in a fully automated manner

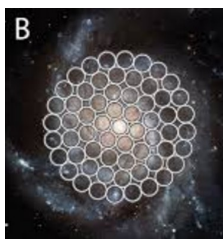
# Cases of 2DBAT application:

## (1) Revisit of galaxy kinematics from HI archival data

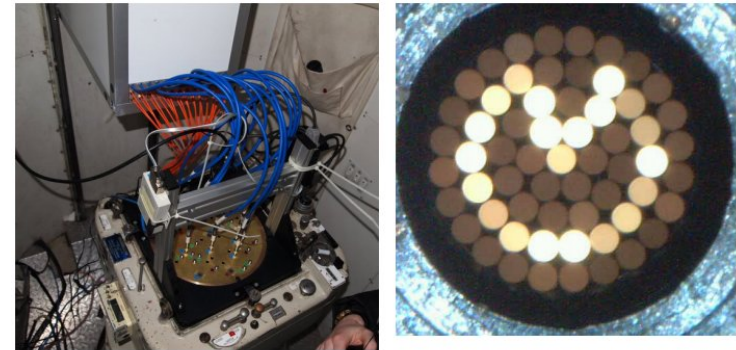
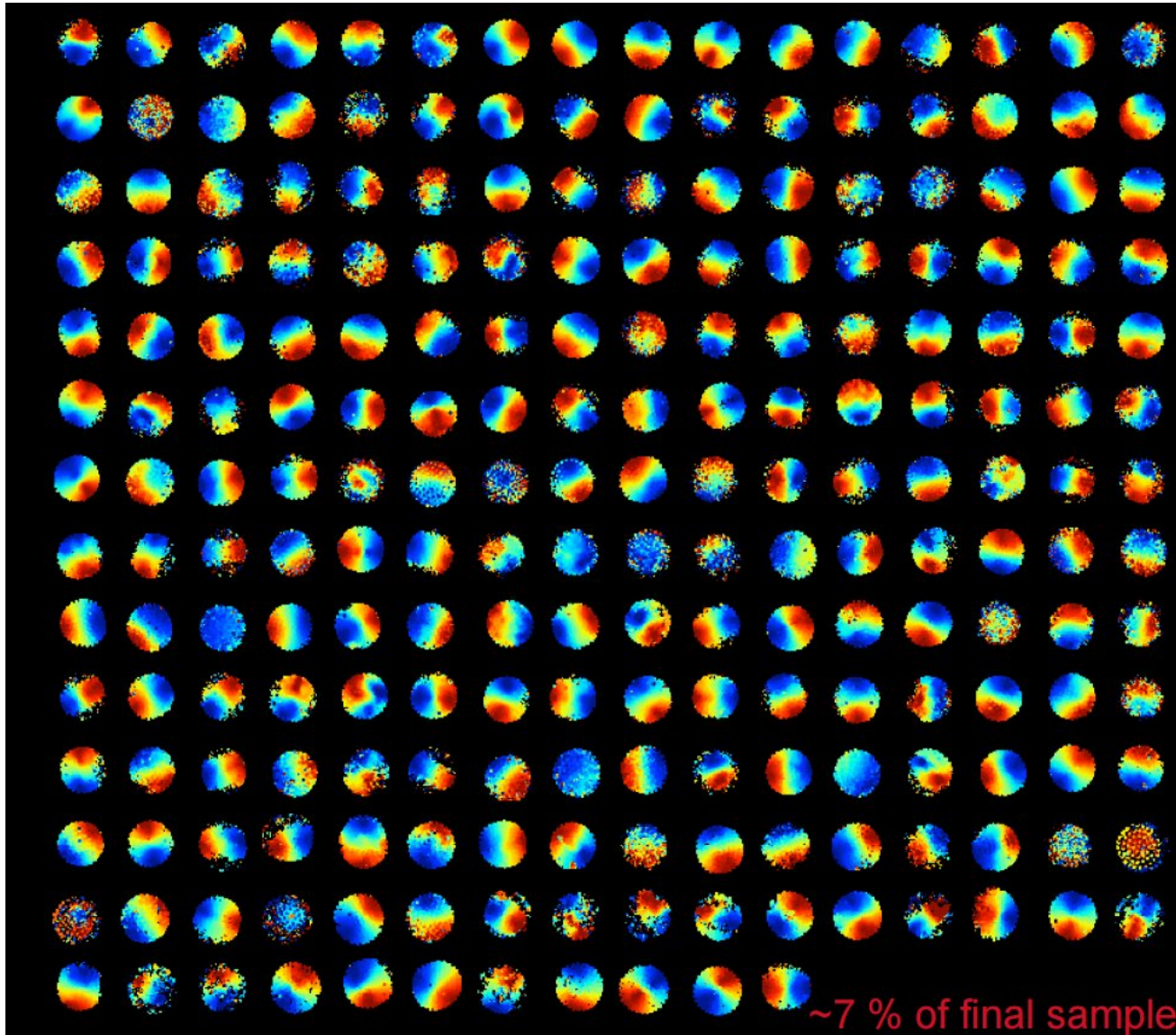


*Oh et al. (2018)*

- 24 sample galaxies from LVHIS (Koribalski et al.)
  - taken out of a sample of 82 (< 10 Mpc), gas-rich galaxies undertaken with the ATCA
  - more or less like those of WALLABY resolved galaxies in terms of the spatial (20-60") and spectral (4 km/s) resolutions as well as the number of resolved elements across the major axis
  - also used for testing the performance of FAT in Kamphuis et al. (2015)
- Run 2DBAT on their extracted Hermite h3 velocity fields given the degree of regularization in a fully automated manner



## Cases of 2DBAT application: (2) 2D kinematics of SAMI galaxies



### The Sydney-AAO Multi-object Integral field spectrograph

Scott Croom (for the SAMI team)

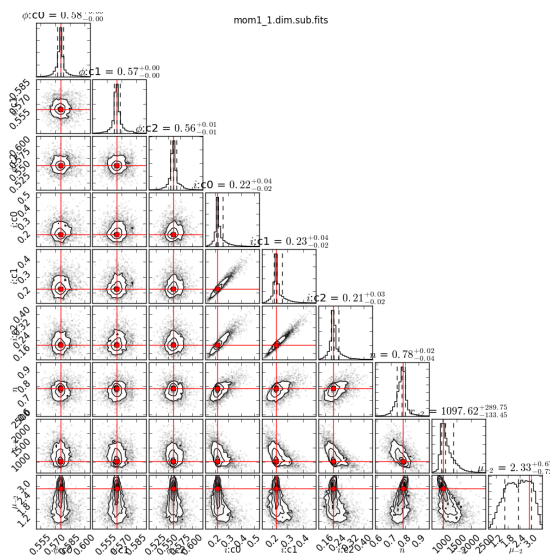
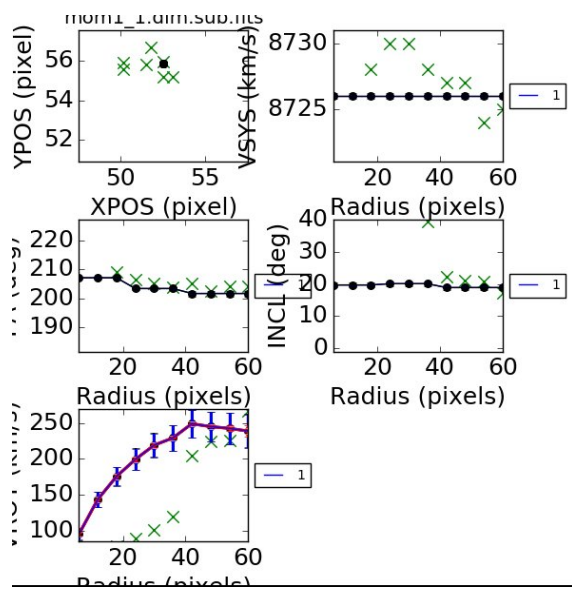
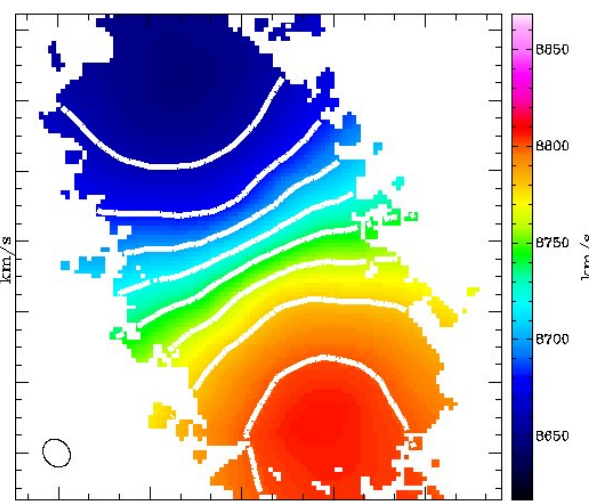
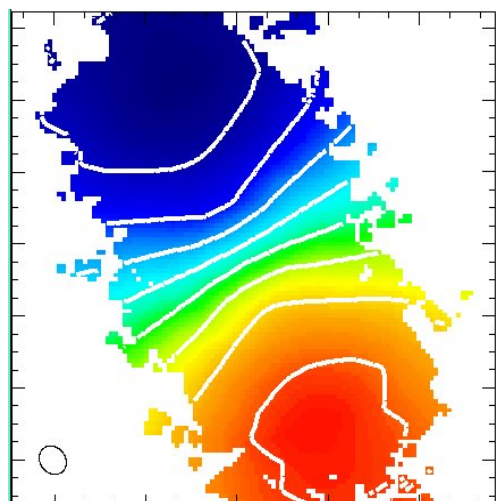
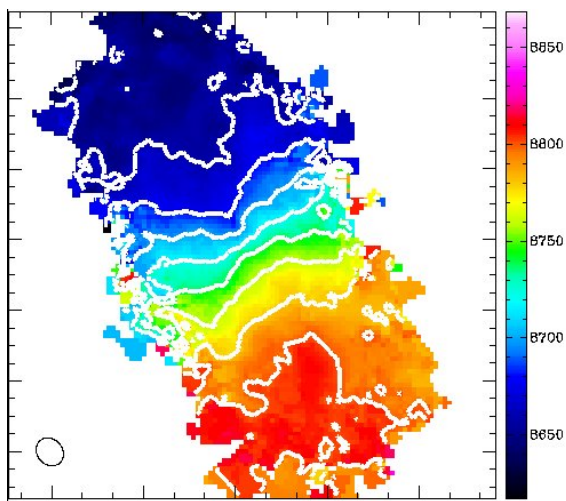
Sydney Institute for Astronomy (SIfA)  
CAASTRO ARC Centre of Excellence  
University of Sydney

# Cases of 2DBAT application: (3) ASKAP Early Science Observations

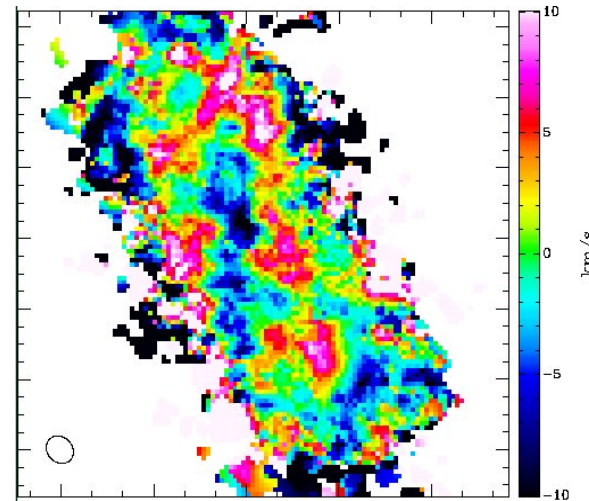
MOM1

Model1: constant PA/INCL

Model2: higher order PA/INCL

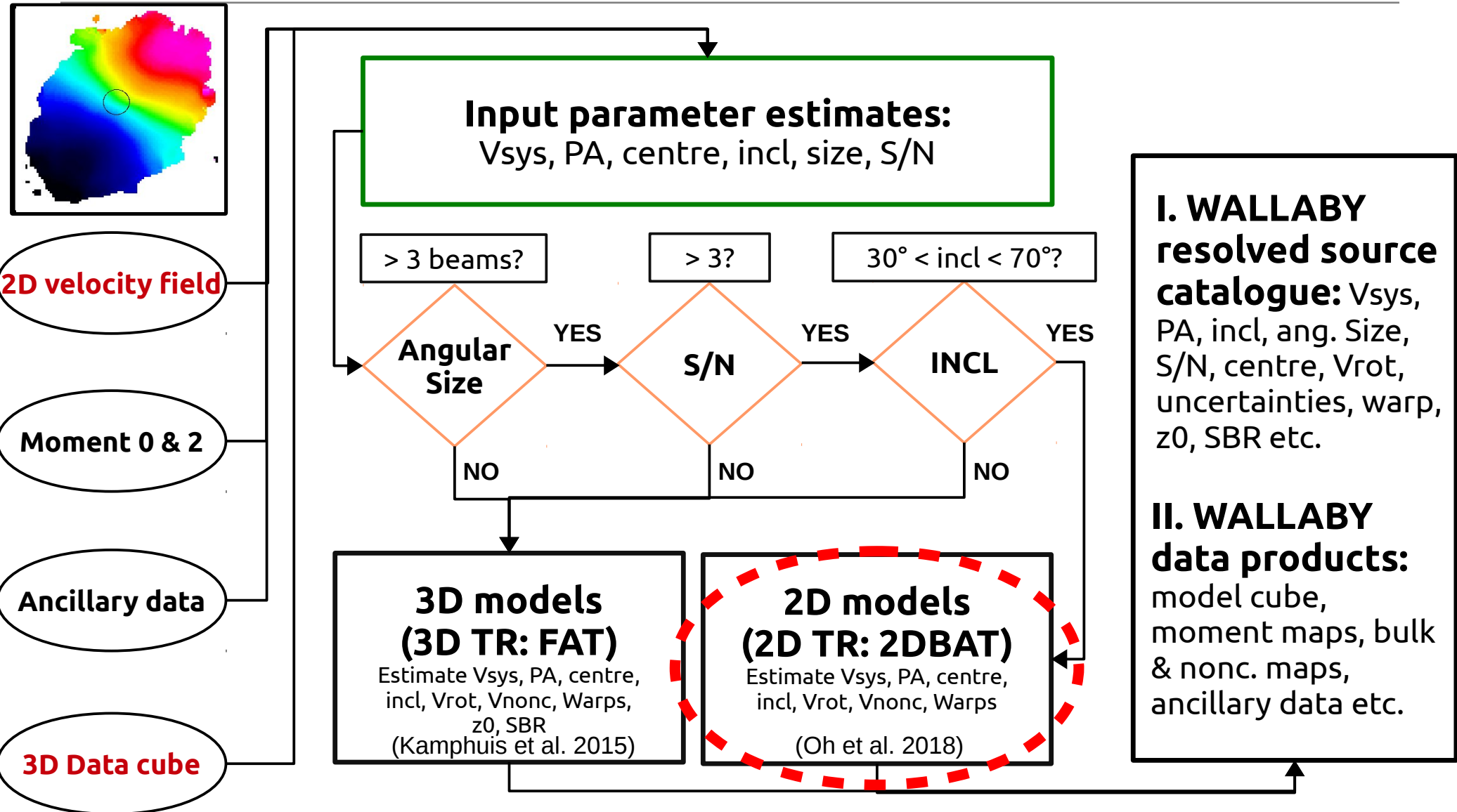


Residual: input - Model2





# Kinematic parameter extraction for WALLABY : ASKAP WALLABY/DINGO (~5,000) + WSRT Apertif (~7,000) galaxies



# Summary & (near) future directions

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- A new standalone 2D tilted-ring analysis tool (2DBAT) on hand
- Fully automated given broadly defined ranges of initial priors
- Written in C with publicly available libraries: MultiNest v3.10 (Feroz & Bridges 2008), cfitsio, GSL & standard MPI libraries
- Parallelised: Message Passing Interface (MPI) supported
- Comprise the WALLABY kinematics pipeline together with the automated TiRiFiC (FAT)
- See Oh et al. (2018) for a complete description of the code
- Downloadable at <http://github.com/seheonoh/2dbat>
- Cross-platform (linux/mac/windows) “DOCKERIZED” version available
- Evolution to 3DBAT?
- Applications (e.g.):
  - statistical revisit of resolved galaxy kinematics from all the available archival data
  - Resolved kinematics for ASKAP Early Science Observations
  - 2D kinematic baseline for SAMI

*Thank you!*