

Kinematics of Nearby Galaxies in preparation for WALLABY

Se-Heon Oh (ICRAR/UWA)

With

LITTLE THINGS team & WALLABY WG2

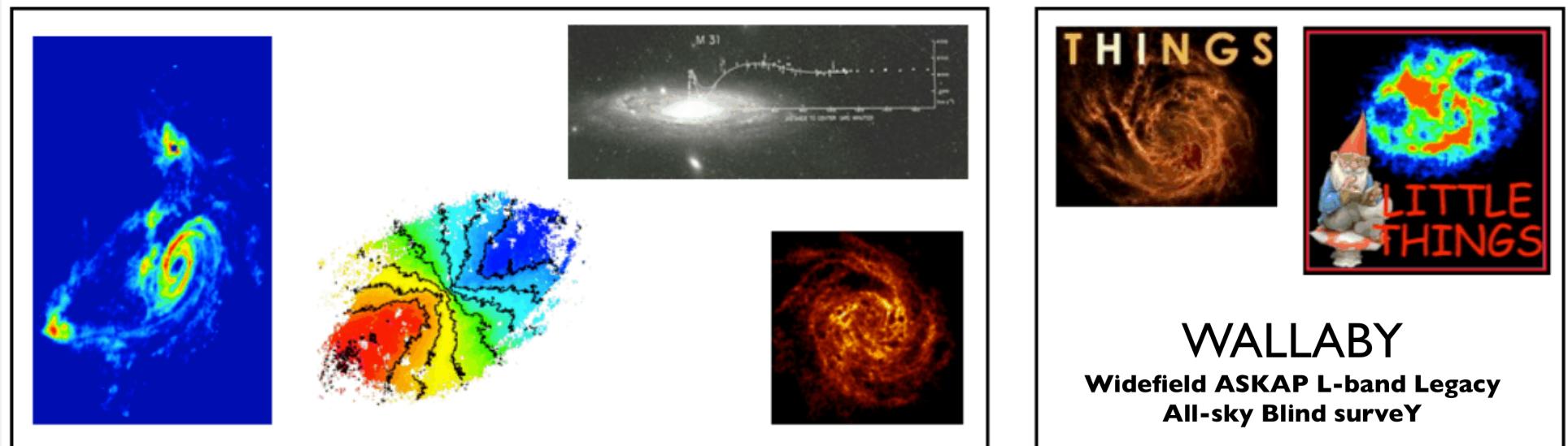


Contents

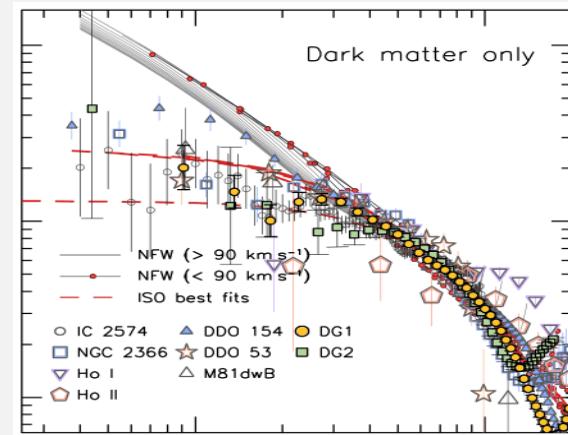
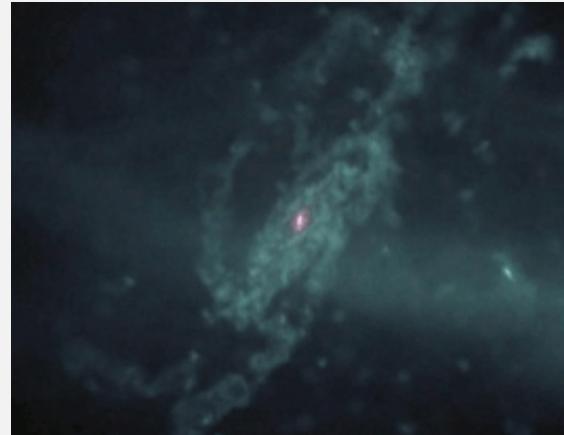
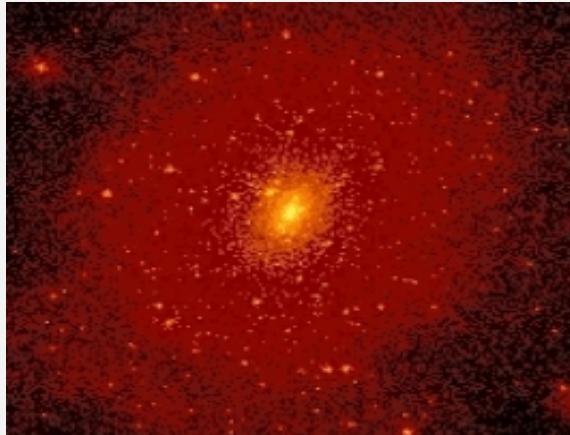
- **HI kinematics of galaxies**
- **Dark matter distribution in dwarf galaxies**
- **Progress on WALLABY rotation curve pipeline**
- **A new approach for extracting bulk velocity fields**
- **Summary & future works**

HI kinematics of resolved galaxies

- **Dynamical structure** : (dark) matter distribution in galaxies
- **Interplay between ISM and star formation** on small (sub-kpc) scales
- **Dynamical information about galaxy evolution** : warps, bars, spiral arms, tidal interaction, HVCs etc.



Small-scale problems in Λ CDM simulations

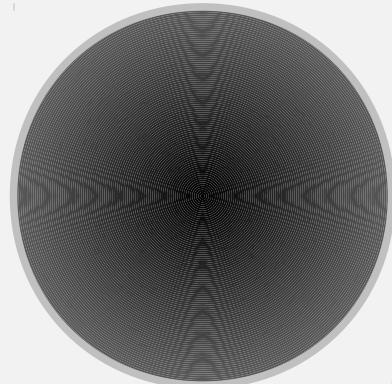


- **Missing satellites problem**
- **Angular momentum problem**
- **“cusp/core” problem**

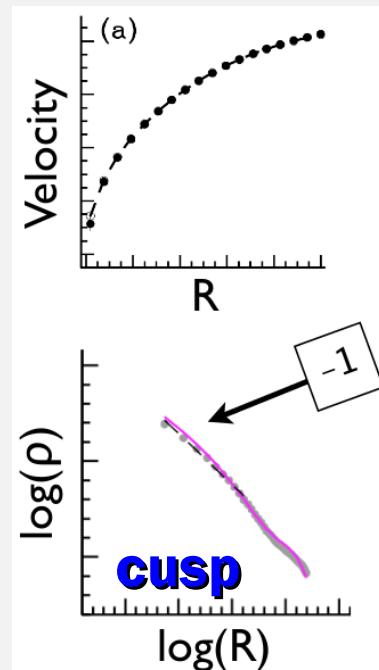


“cusp/core” problem in galaxies

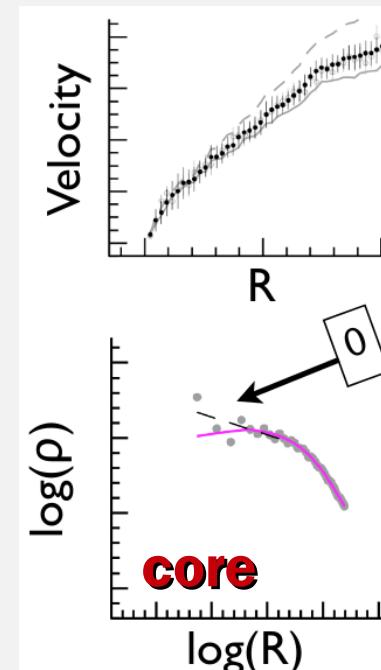
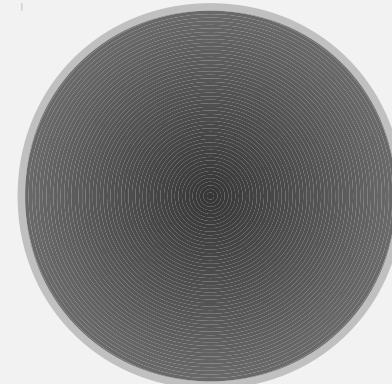
Λ CDM simulations



Moore (1994)
Flores & Primack (1994)
Navarro, Frenk & White (1995)
Navarro, Frenk & White (1996)
Moore et al. (1998)
Ghigna et al. (2000)
Klypin et al. (2001)
Power et al. (2002)
Navarro et al. (2004)
Diemand et al. (2008)
Stadel et al. (2009)
Navarro et al. (2010)
etc.



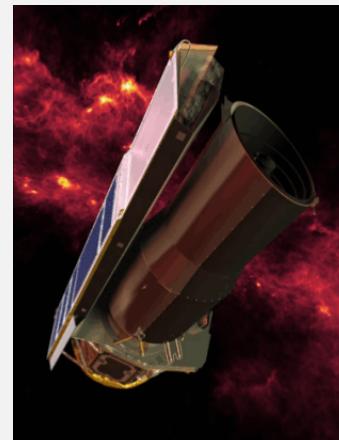
Observations



Flores & Primack (1994)
Moore (1994)
de Blok et al. (2001)
de Blok & Bosma (2002)
Bolatto et al. (2002)
Weldrake et al. (2003)
Simon et al. (2003)
Swaters et al. (2003)
Kuzio de Naray et al. (2006)
Gentile et al. (2007)
Oh et al. (2008)
Trachternach et al. (2008)
de Blok et al. (2008)
Oh et al. (2011a, b)
etc.

The HI Nearby Galaxy Survey (THINGS)

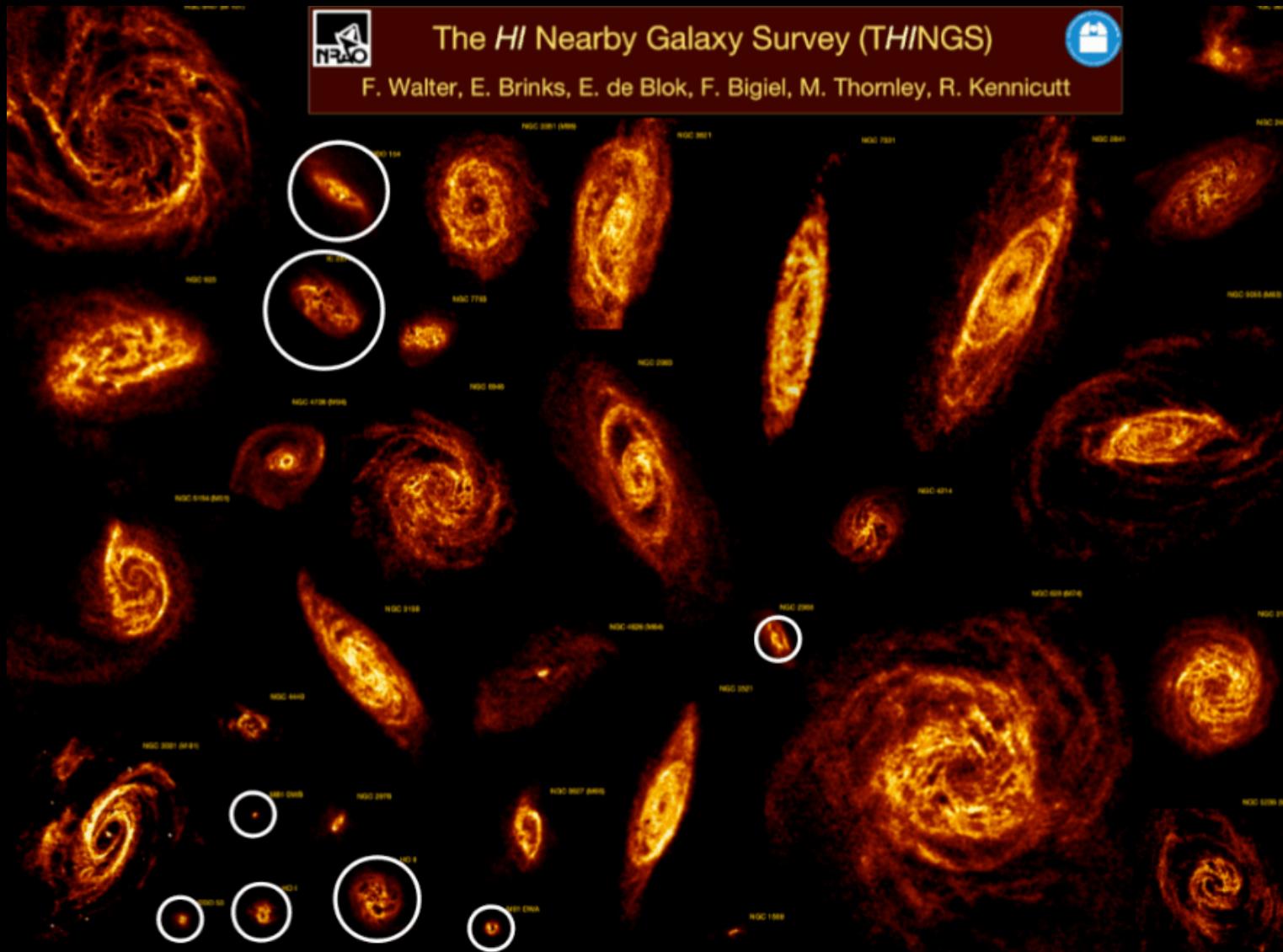
- **VLA HI 21-cm survey (~6"; 5.2 km/s; ~500 hours) of nearby (< 10 Mpc) 34 galaxies**
- **Commensality with optical, Spitzer SINGS, GALEX uv, CO data etc.)**
- **All observations ended in late 2005**
- **Data available at <http://www.mpia.de/THINGS>**



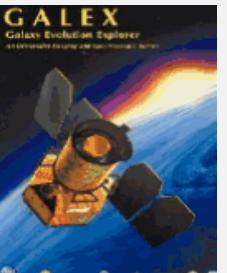
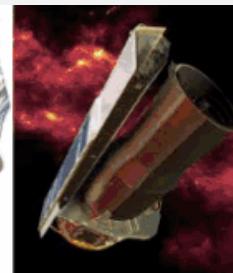
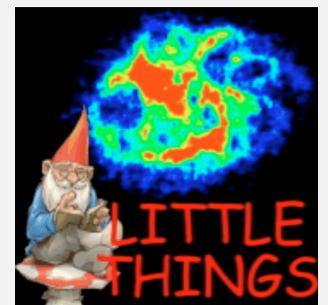


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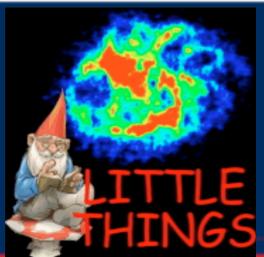
The HI Nearby Galaxy Survey (THINGS)



- **THINGS-like (~6"; < 5.2 km/s) high-resolution VLA HI 21cm survey (B+C+D; 376 hours) for 41 nearby (< 10 Mpc) dwarf (dIm, BCD) galaxies**
- **Commensality with Spitzer (+ Herschel) optical, GALEX uv, CO data etc.)**
- **VLA observations ended in 2008**
- **Further observations with EVLA, CARMA, APEX etc.**



LITTLE THINGS



Deidre Hunter (PI. Lowell obs)
Elias Brinks (Univ. of Hertf.)
Bruce Elmegreen (IBM)
Michael Rupen (NRAO)
Caroline Simpson (Florida Univ.)
Fabian Walter (MPIA)
David Westpfahl (NMT)
Lisa Young (NMT)
Trisha Ashley (Florida Int. Univ.)
Sandipan Basu (Florida Int. Univ.)
Phil Cigan (NMT)
Dana Ficut-Vicus (Univ. of Hertf.)
Volker Heesen (Univ. of Hertf.)
Kim Herrmann (Lowell Obs)
Megan Jackson (Lowell Obs)
Se-Heon Oh (ICRAR/UWA)
Andreas Schruba (MPIA)
Hongxin Zhang (Lowell Obs)

3rd team meeting in Socorro 27-29 Mar 2011

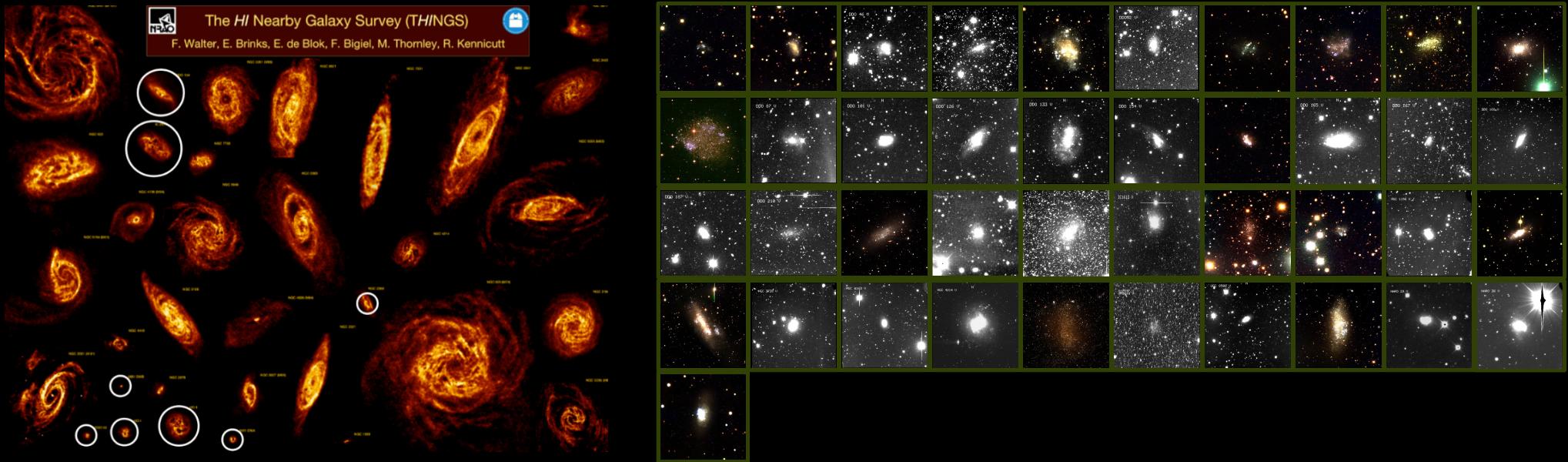
LITTLE THINGS sample galaxies

International Centre for Radio Astronomy Research

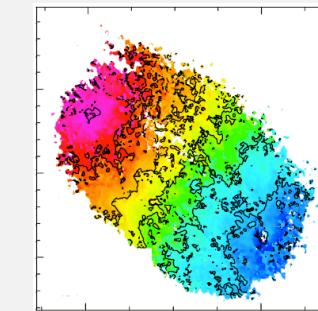
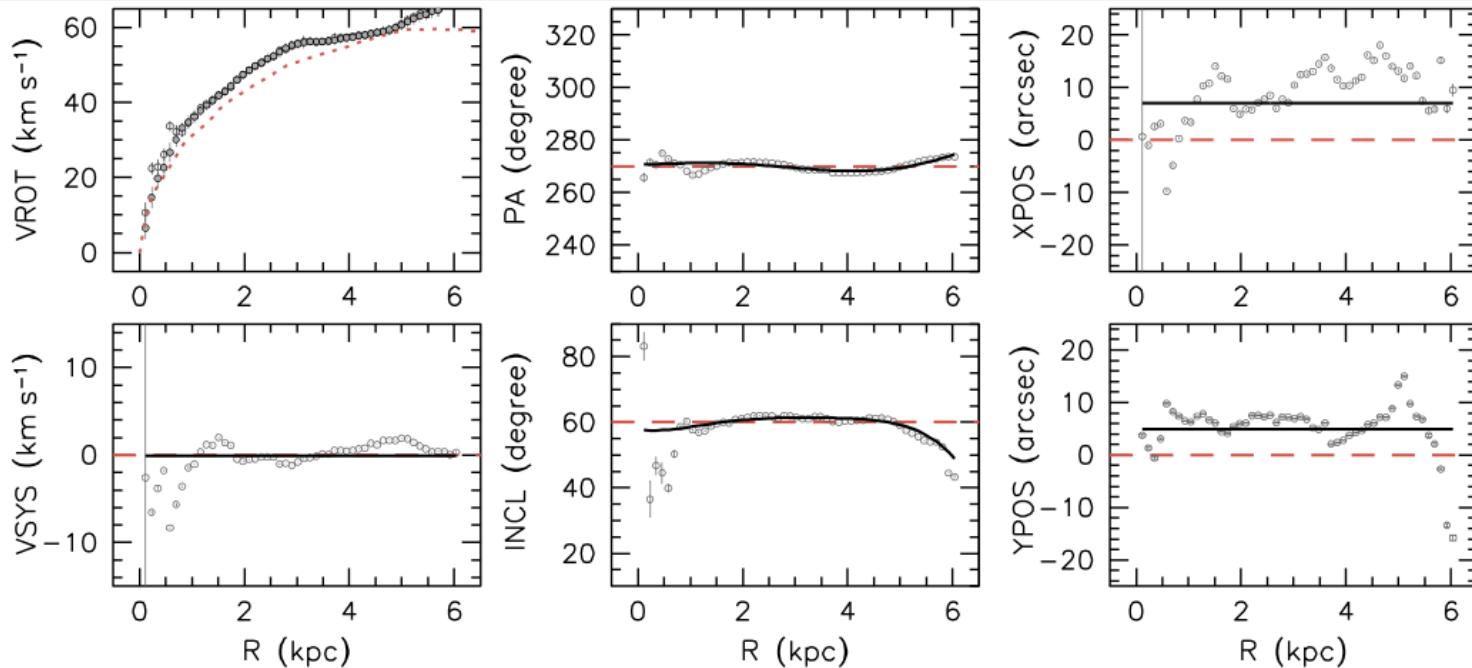


Dark matter distribution in (LITTLE) THINGS dwarf galaxies

International Centre for Radio Astronomy Research



I. Deriving rotation curves

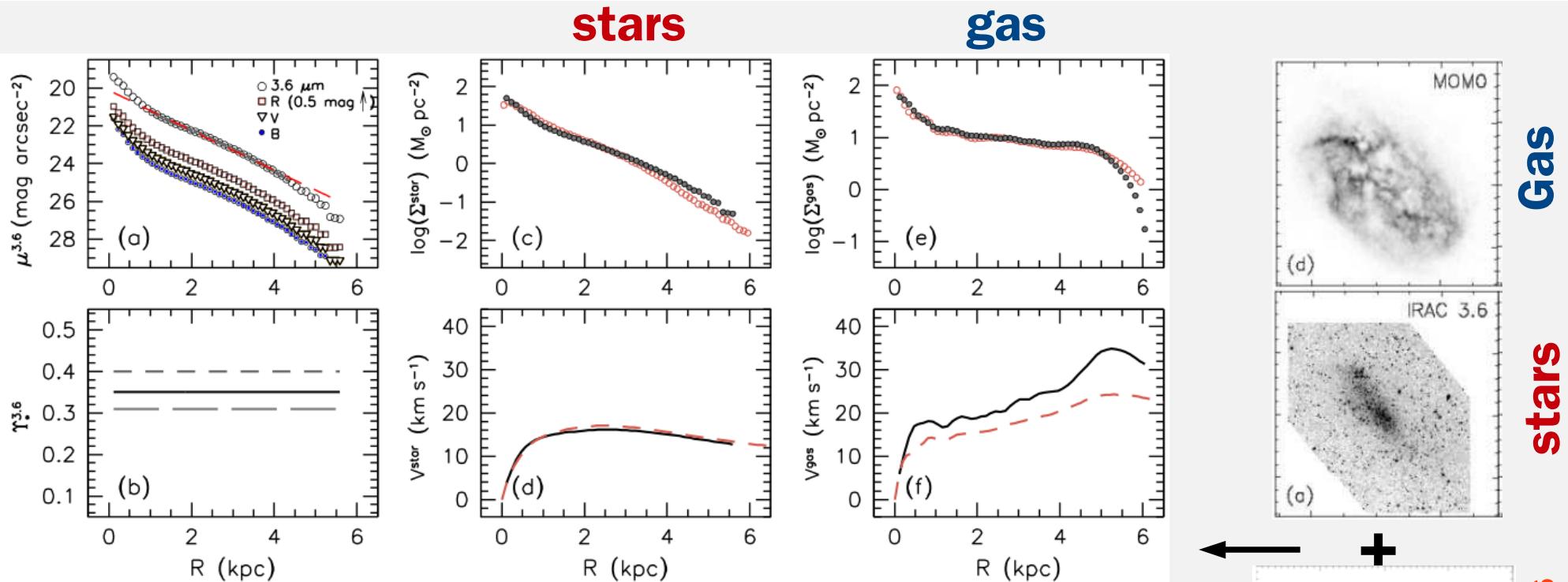


Velocity field

TR models

- **Fit tilted-ring models to 2D velocity fields**
(e.g., Rogstad et al. 1974; “rotcur” in GIPSY)

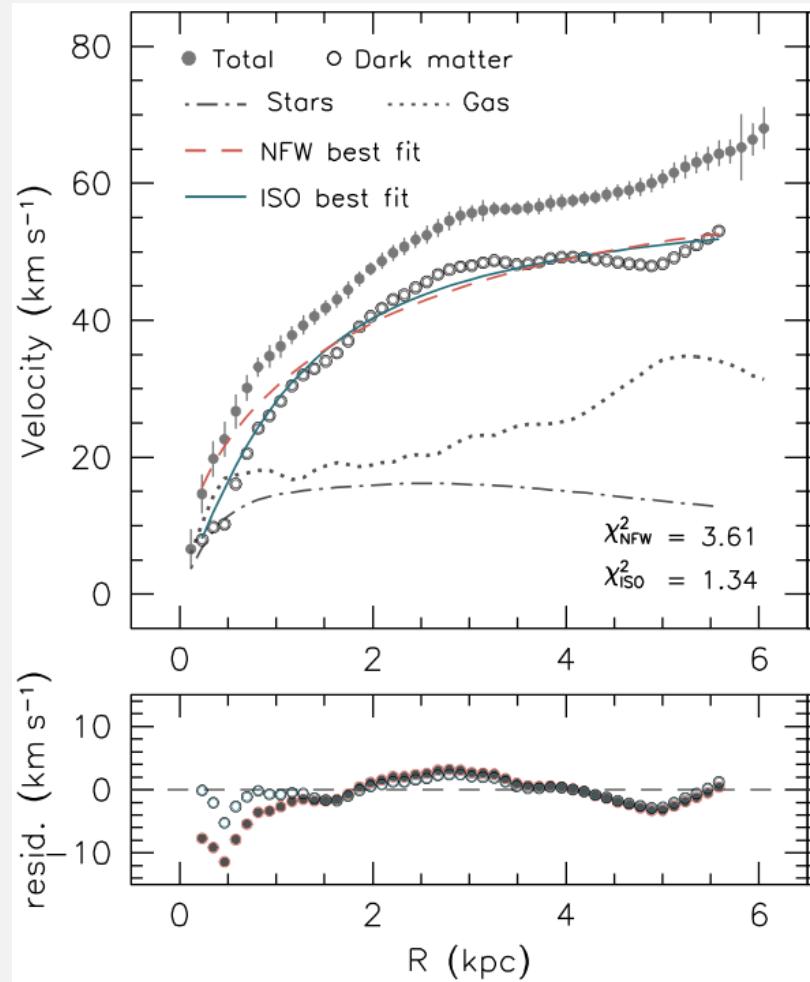
II. Deriving mass models of baryons



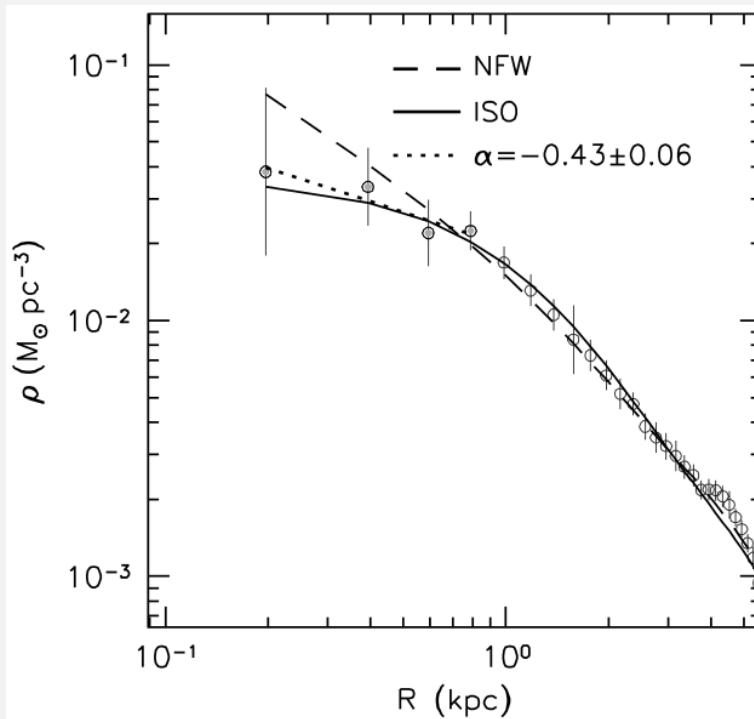
- Mass modelling of 7 THINGS and 15 LITTLE THINGS dwarf galaxies using VLA HI data, Spitzer 3.6 micron images and ancillary optical images

III. Deriving dark matter density profiles

Disk-halo decomposition

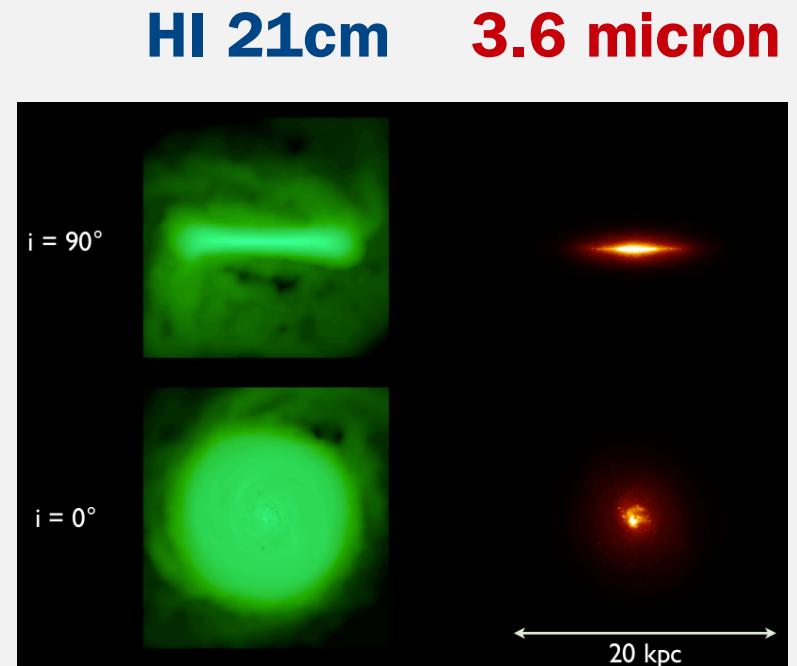


Dark matter density profile



$$\rho(R) = \frac{1}{4\pi G} \left[2 \frac{V}{R} \frac{\partial V}{\partial R} + \left(\frac{V}{R} \right)^2 \right]$$

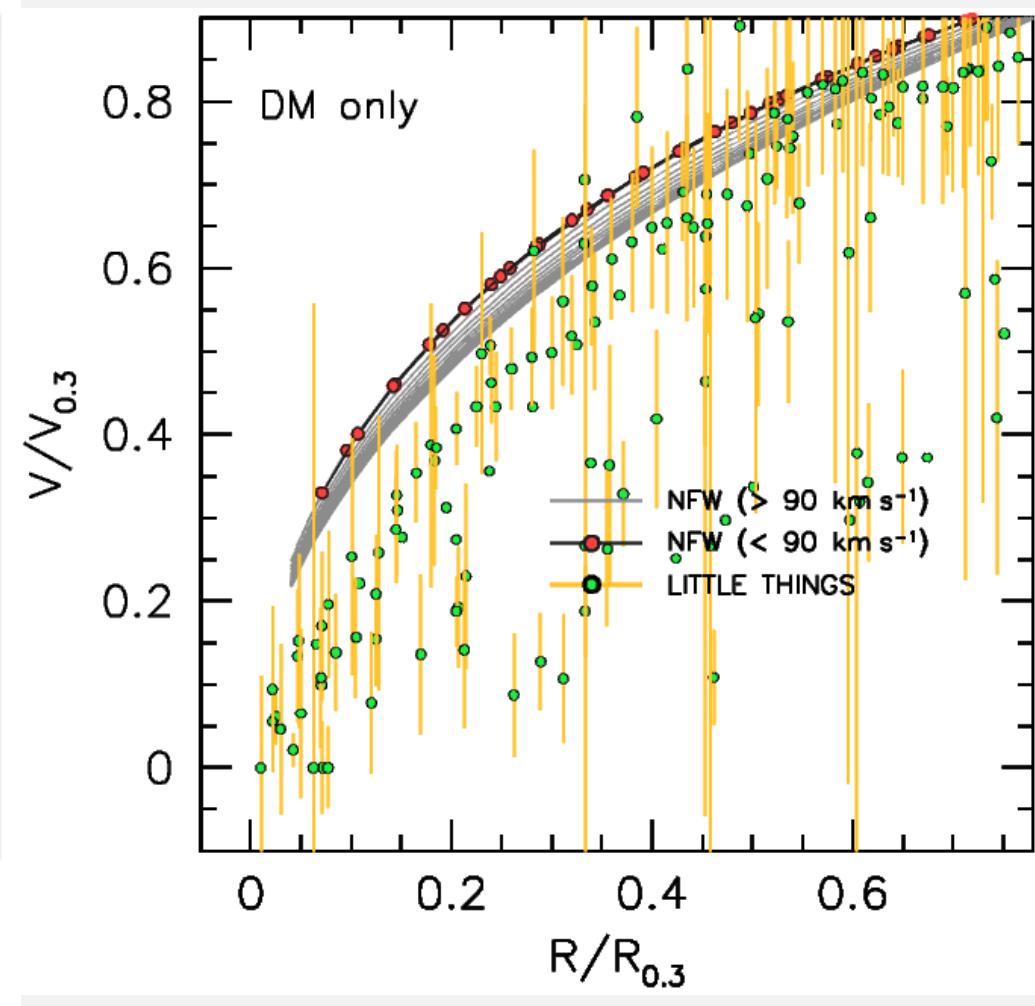
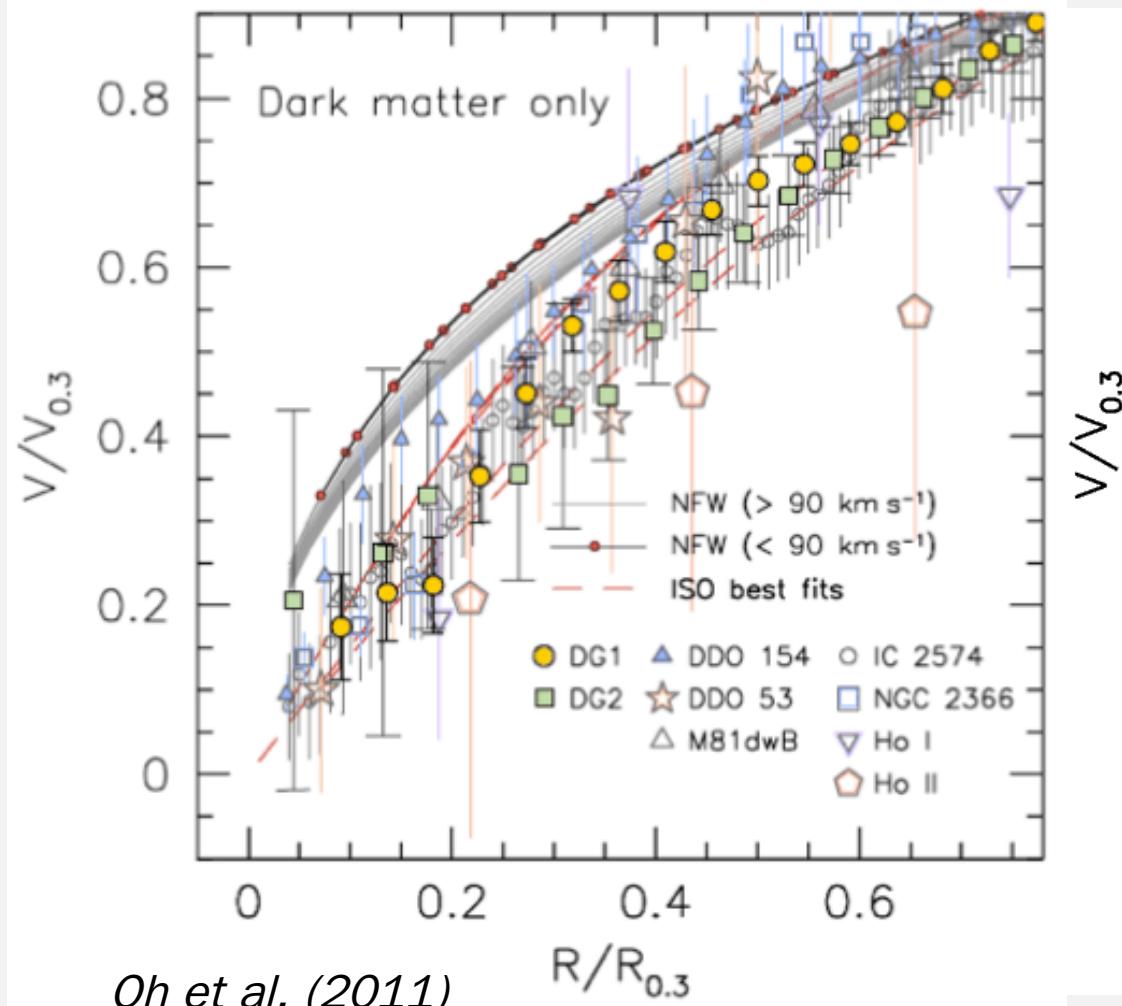
- N-body+SPH tree-code **GASOLINE**
- Flat Λ -dominated cosmology
- Baryonic processes are included, such as
 - gas cooling
 - cosmic UV field heating
 - star formation
 - SNe-driven gas outflows
- ~ 3.3 million particles within the virial radius at $z = 0$.
- $DM \sim 1.6 \times 10^4 M_{\odot}$; gas particle $\sim 3.3 \times 10^3 M_{\odot}$
- The force resolution (gravitational softening) ~ 86 pc.



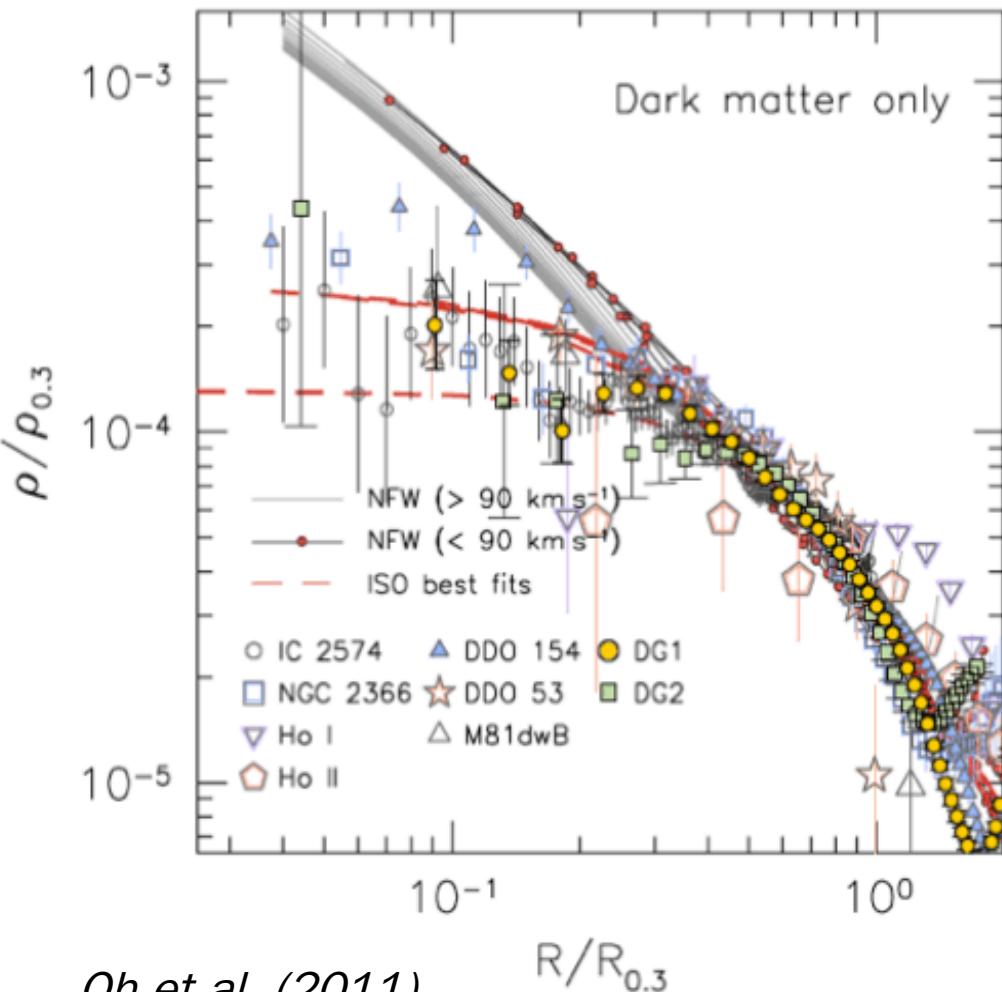
The rotation curve shape of THINGS & LITTLE THINGS

7 THINGS + new SPH simulations

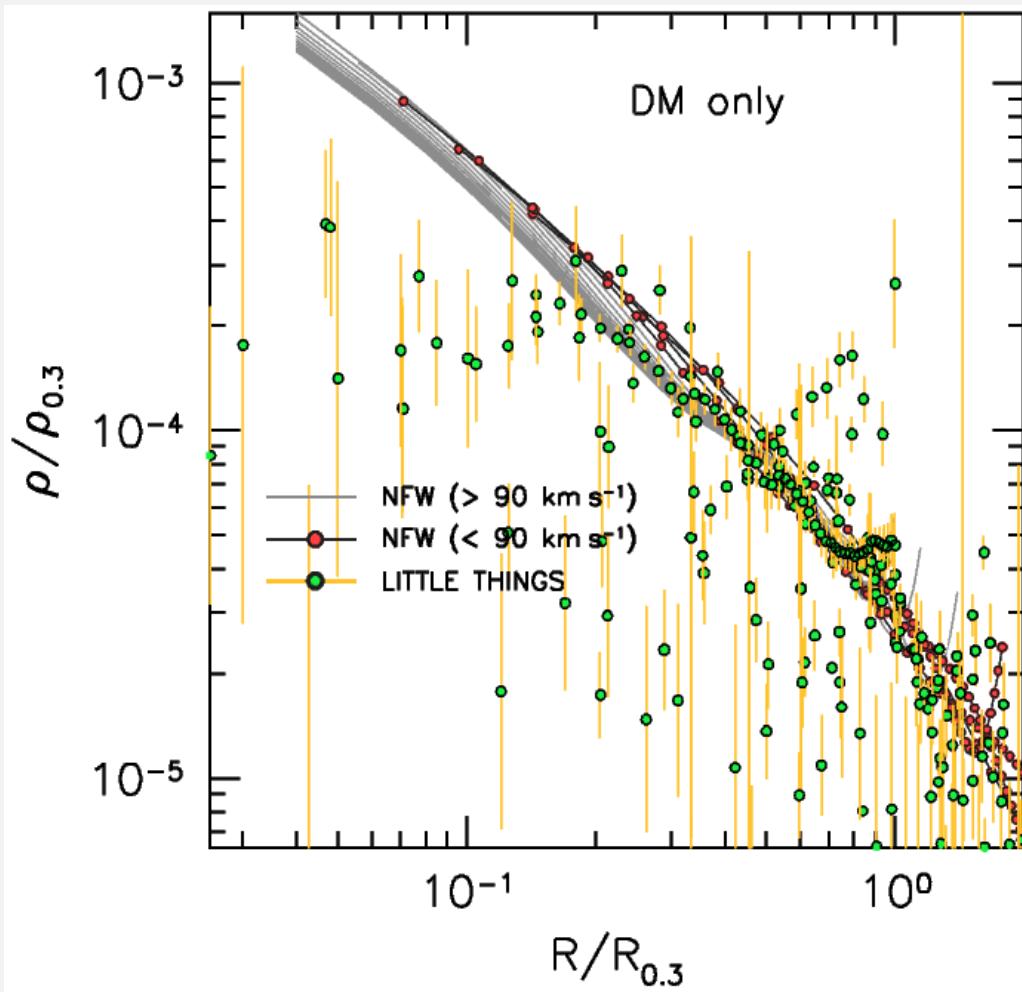
15 LITTLE THINGS



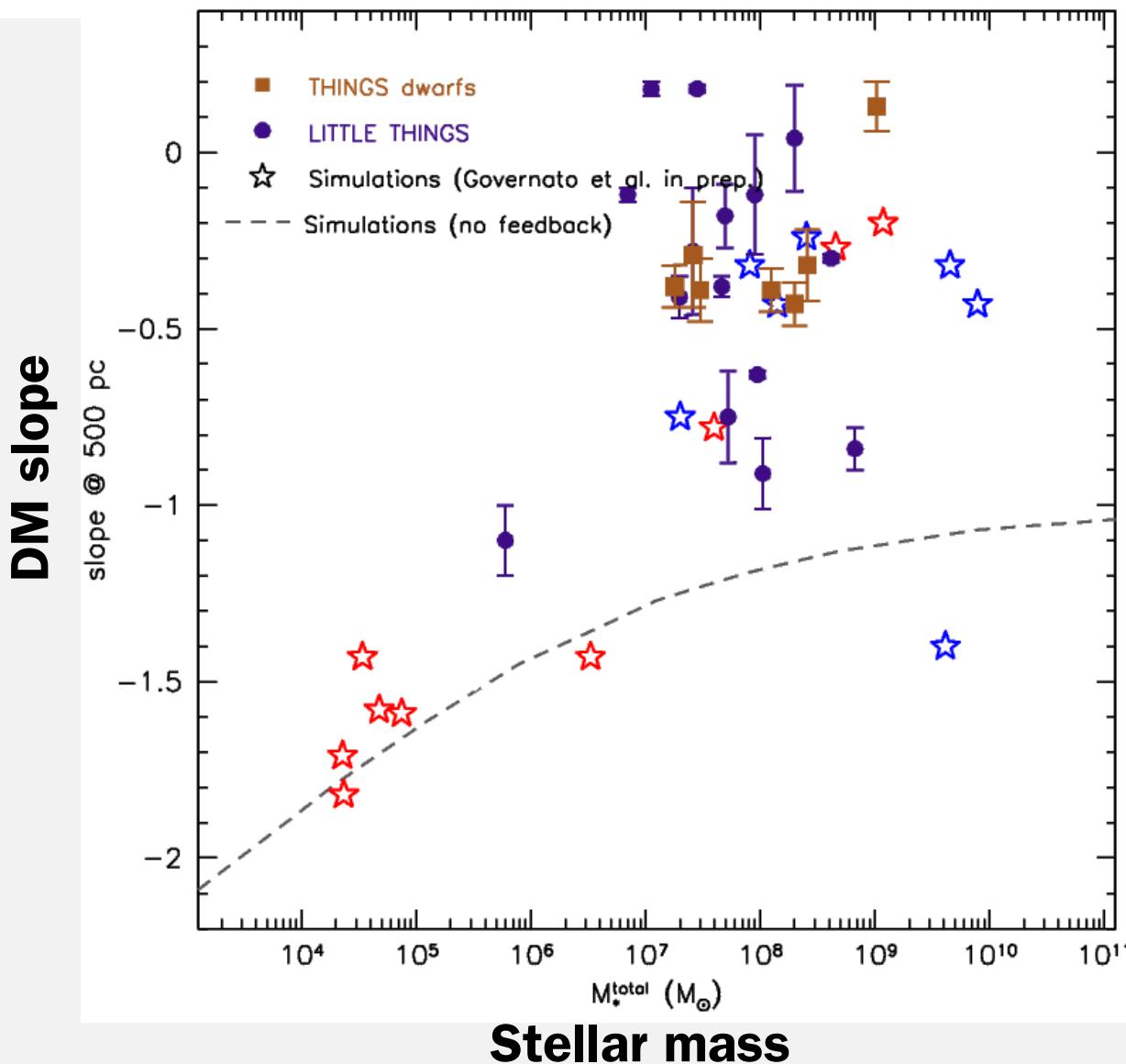
7 THINGS + new SPH simulations



15 LITTLE THINGS



DM slope as a function of stellar mass

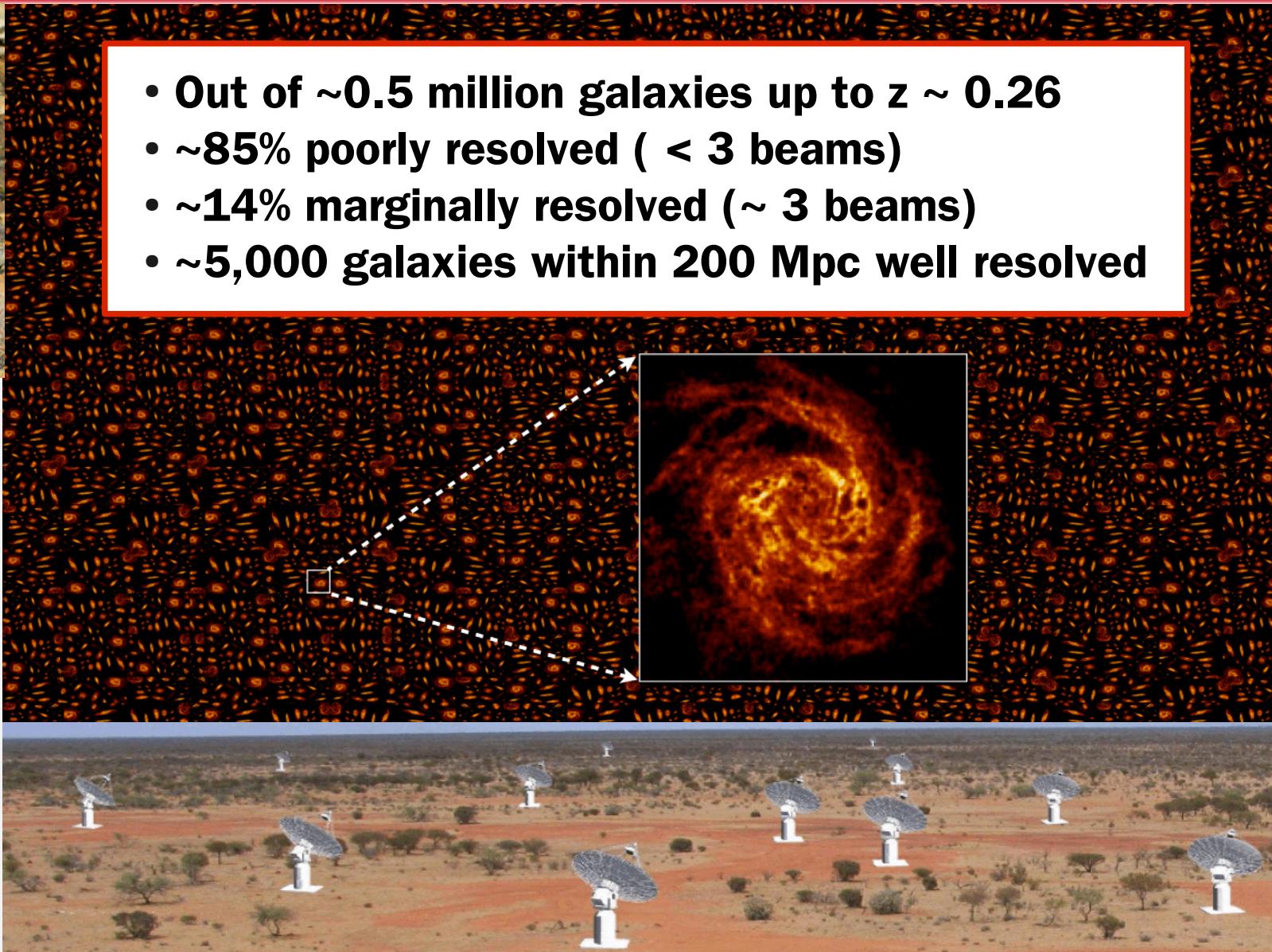


- Gas outflows get less efficient in smaller galaxies so cores at fixed radius get smaller...
- SN driven gas outflows in the early Universe can be a solution for the “cusp/core” controversy

Oh et al. in prep.

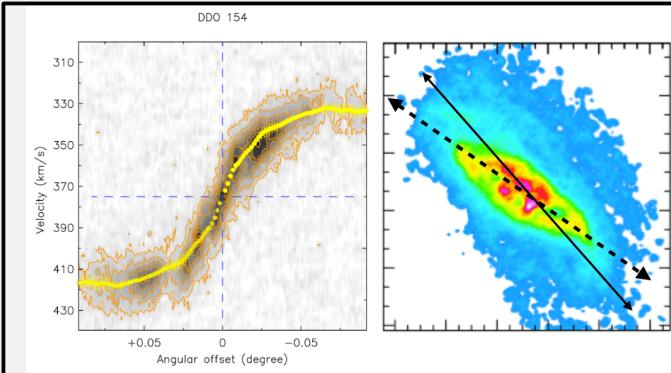
ASKAP WALLABY survey

(Widefield **ASKAP L-band Legacy All sky Blind survey**)

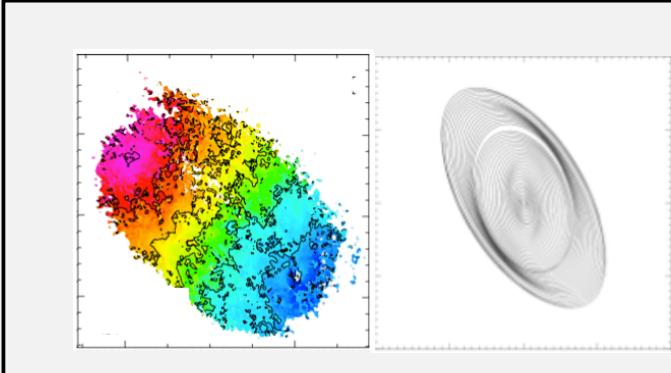


How to derive rotation curves of the resolved WALLABY galaxies?

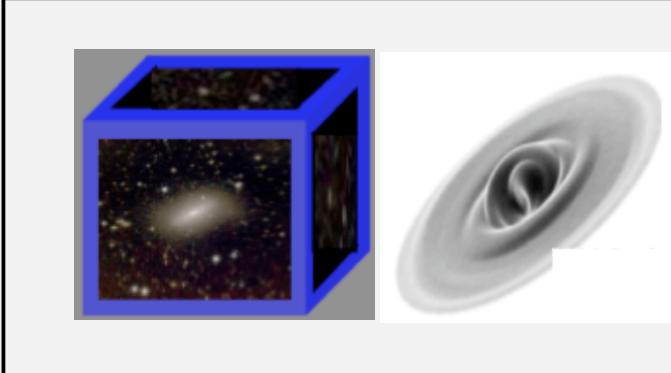
Deriving rotation curves of galaxies



- **1-D : long slit observations**
 - position-velocity diagram
 - major axis cut
 - affected by systematic effects (e.g., non-circular motions, beam smearing etc.)



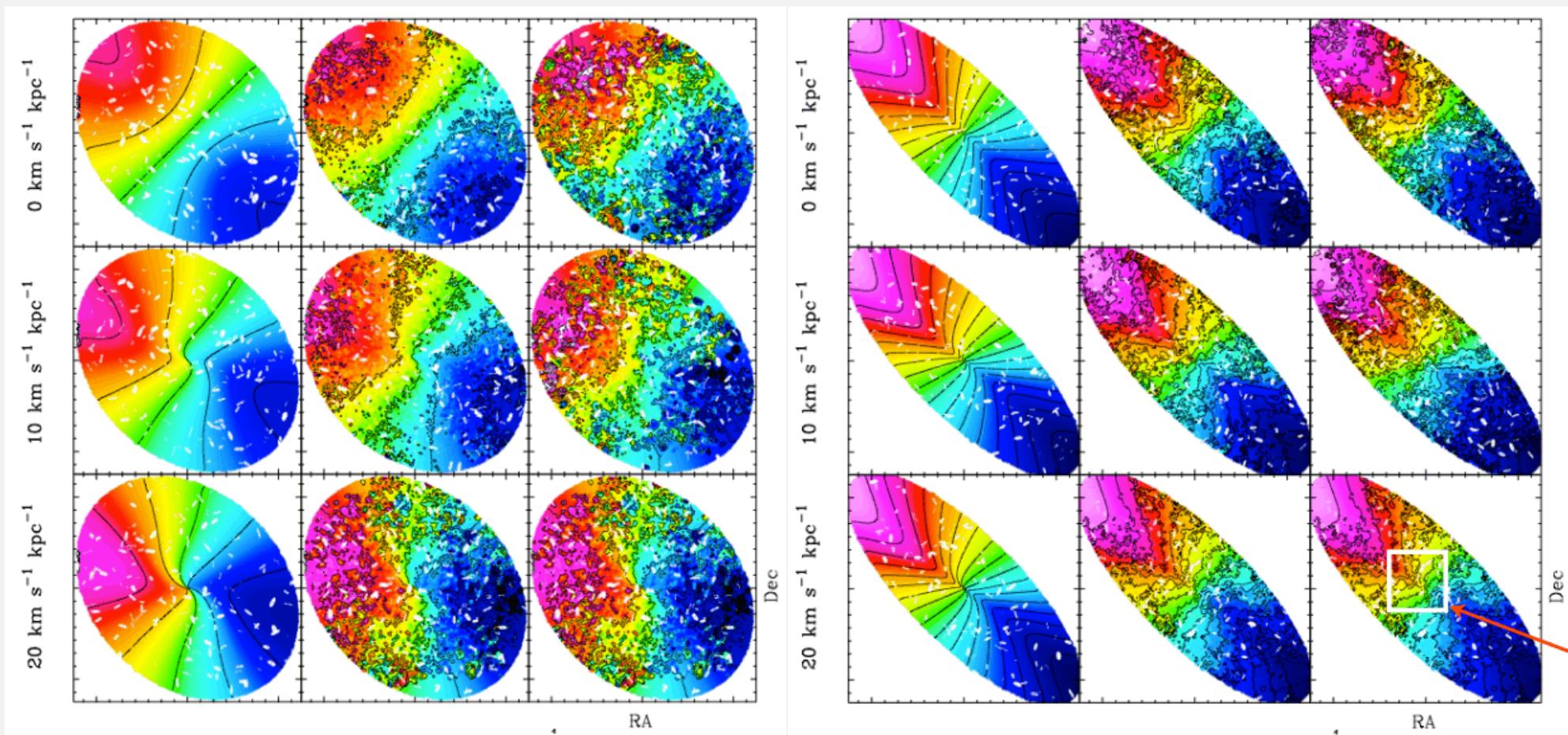
- **2-D : velocity fields**
 - tilted-ring model (“rotcur”, Rogstad et al. 1974)
 - flat disk model (“velfit”, Spekkens et al. 2007)
 - suited for well-resolved galaxies with moderate inclinations



- **3-D : data cubes**
 - direct fits to data cubes (e.g., “TiRiFiC”, Jozsa et al. 2007)
 - fits a larger class of galaxies

Performance comparison of RC programs : Artificial data cubes

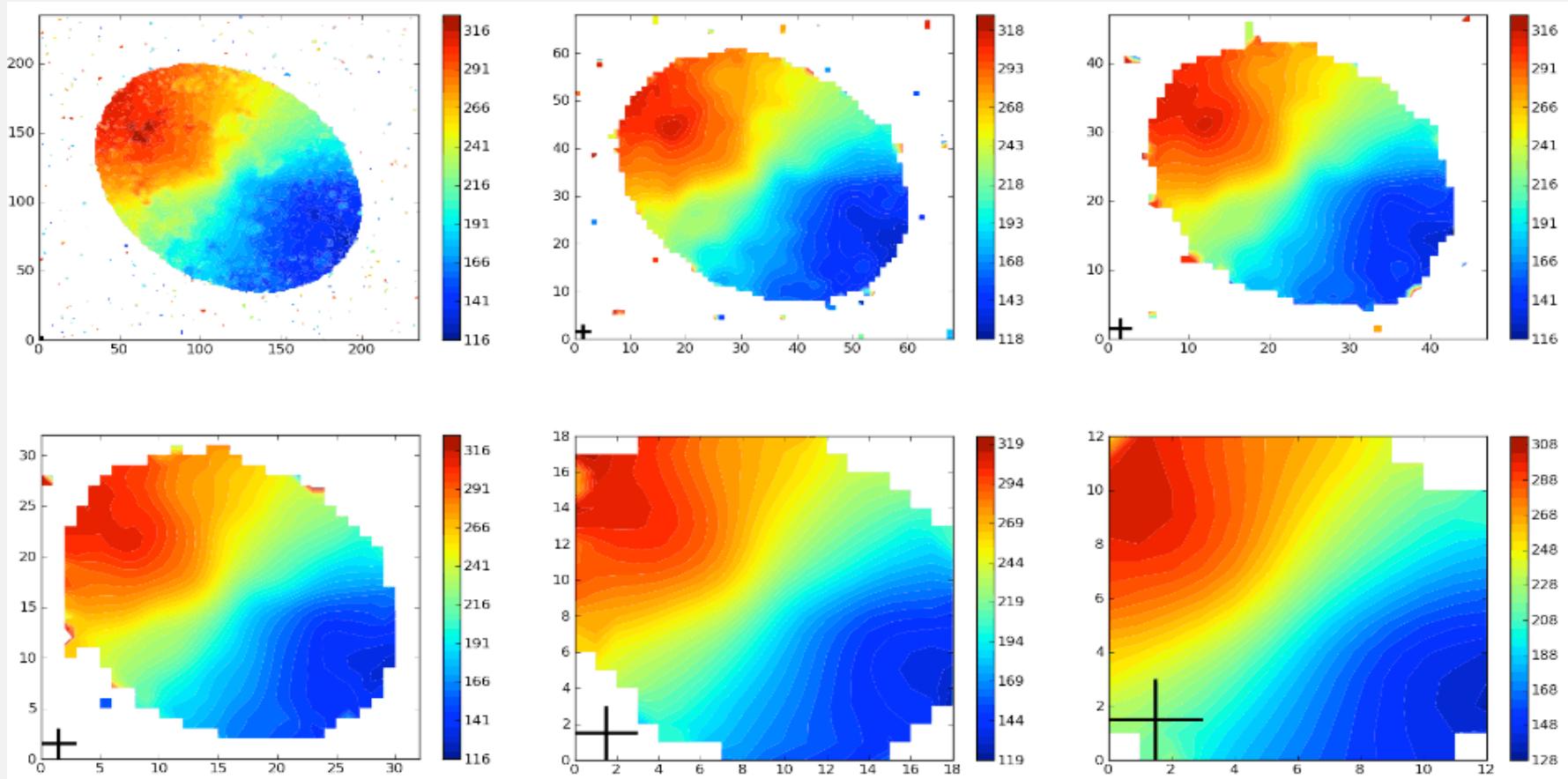
- Based on THINGS (e.g., HI column density, velocity dispersion, rotation curves etc.), a suite of model data cubes created..



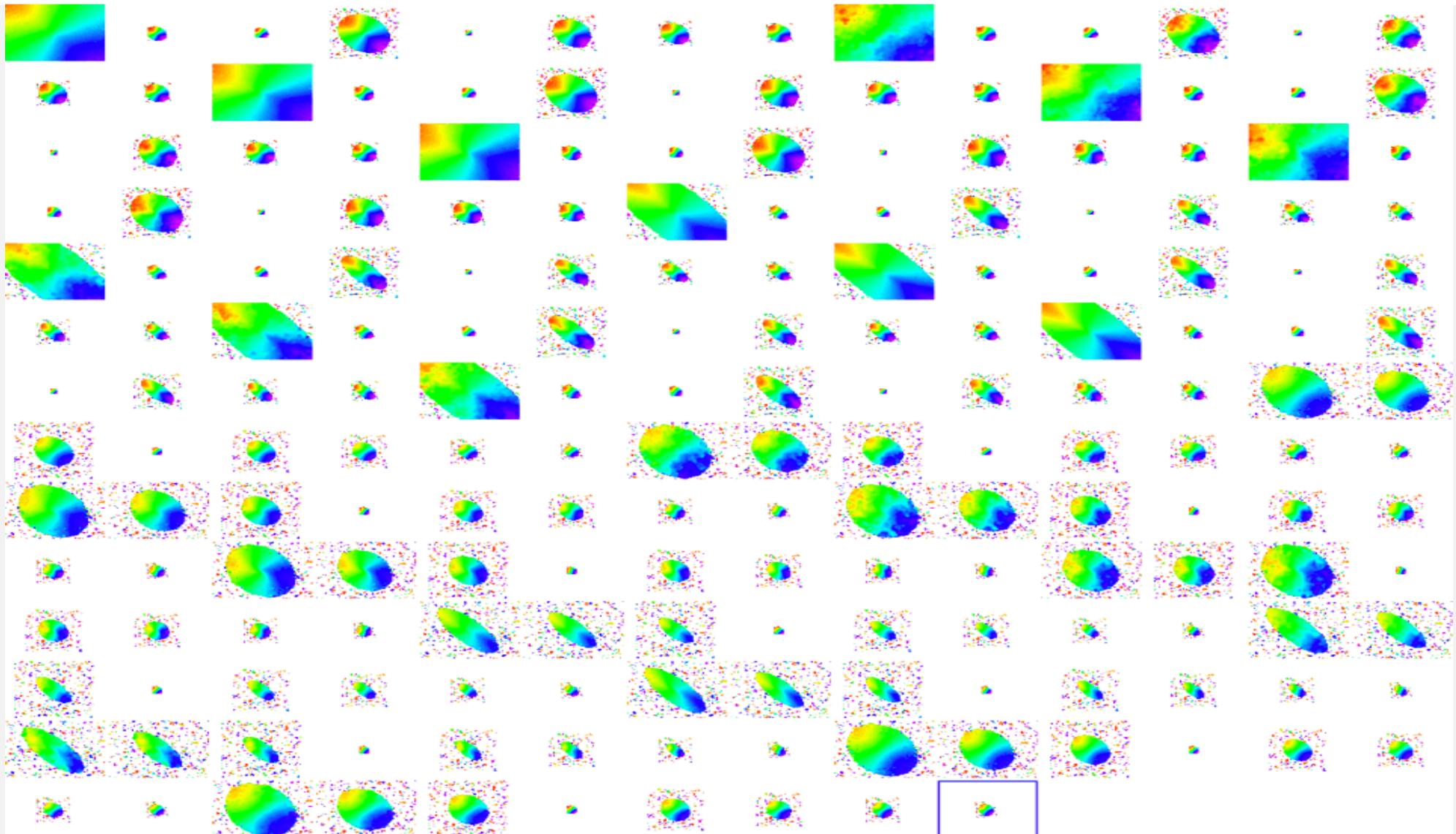


Shifting the model galaxies to 6 redshifts

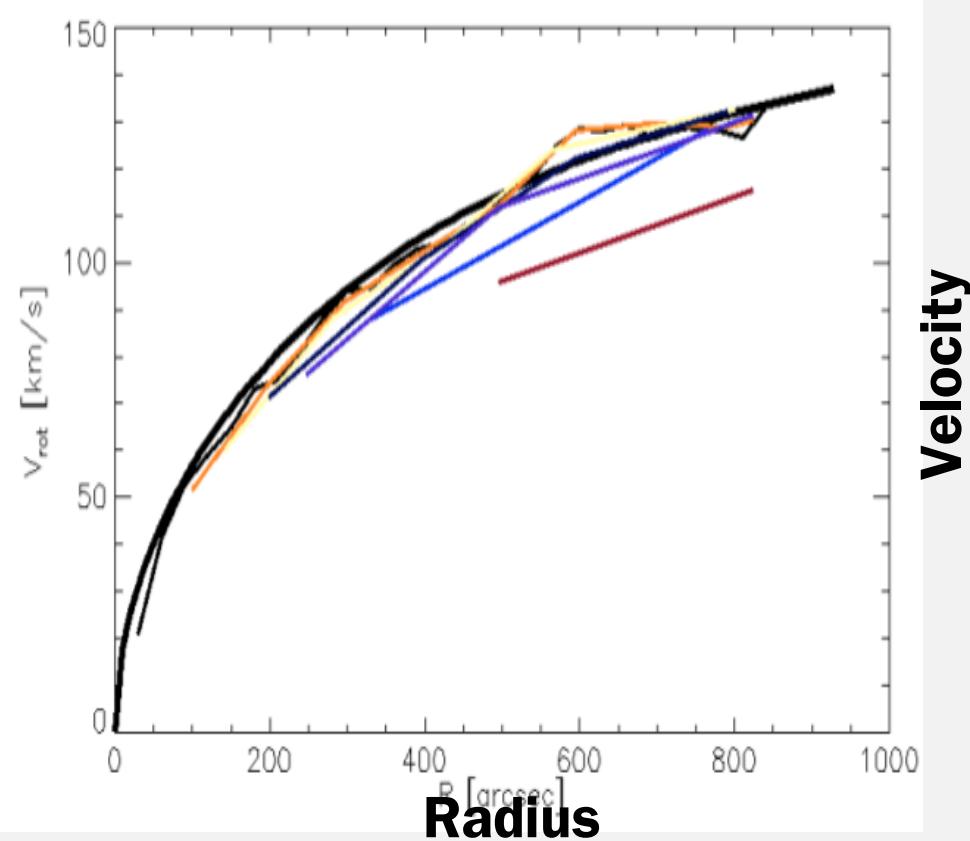
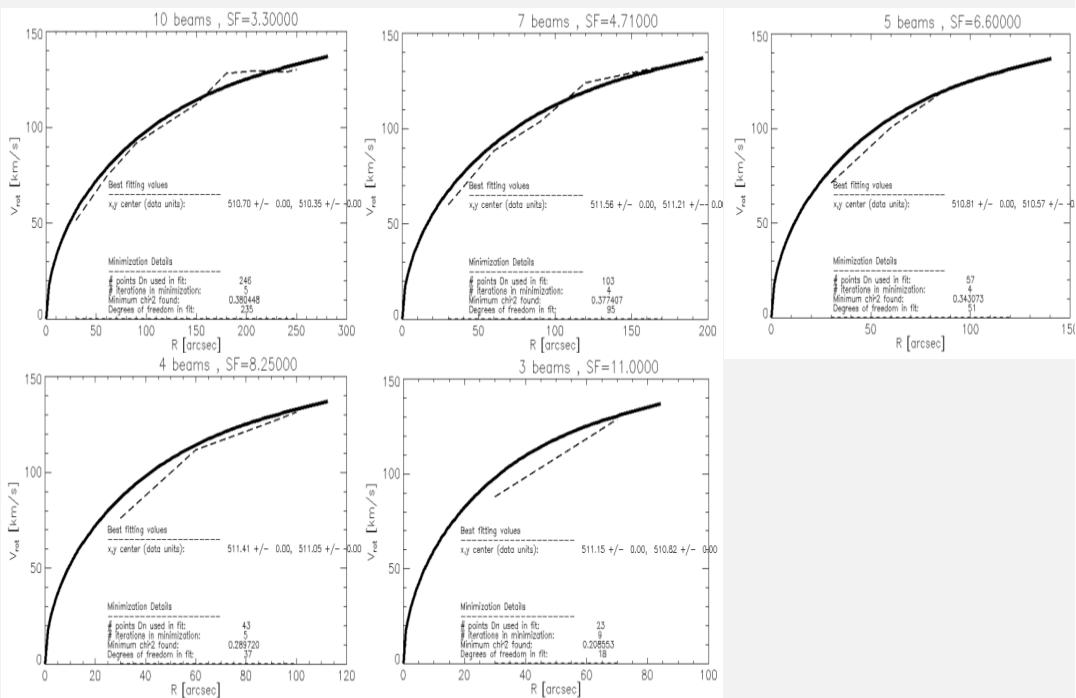
- Re-observe the model data cubes with the ASKAP beam ($30''$) and shift them to 6 different redshifts, and derive rotation curves...



196 model data cubes shifted

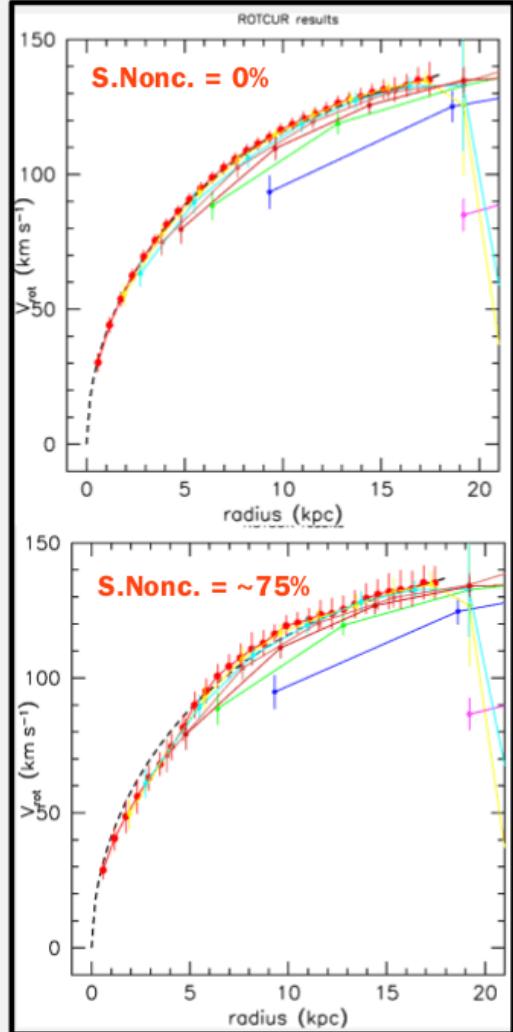


Performance comparison of RC programs : velfit

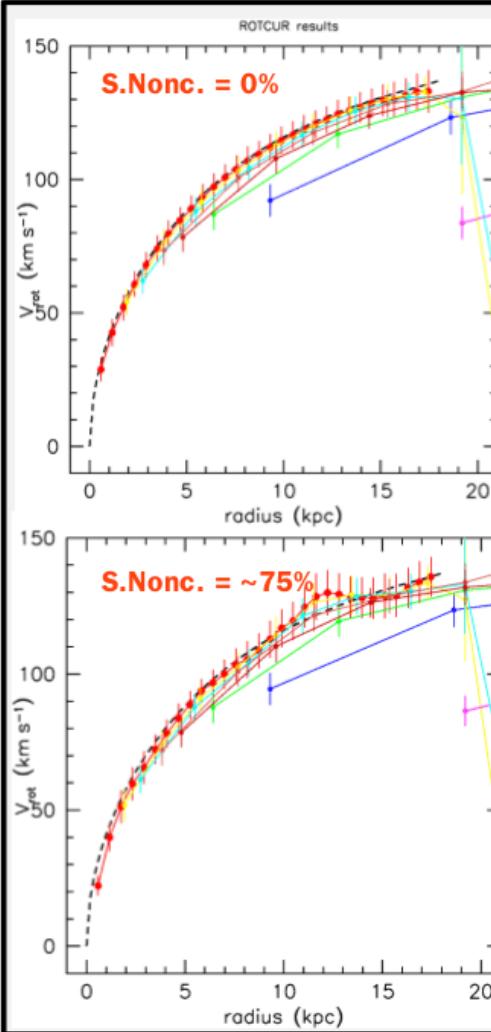


Performance comparison of RC programs : rotcur

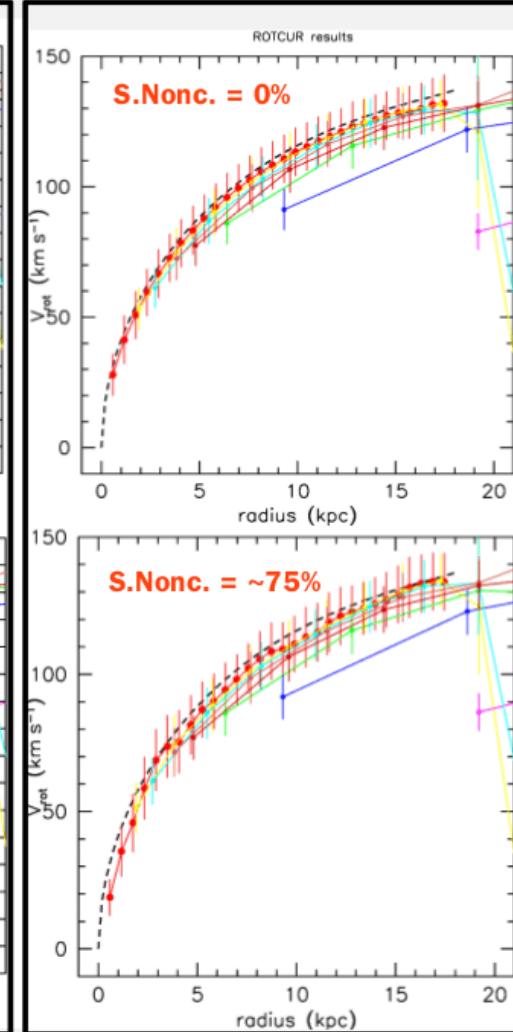
$\Omega=0 \text{ km/s/kpc}$



$\Omega=10 \text{ km/s/kpc}$



$\Omega=20 \text{ km/s/kpc}$

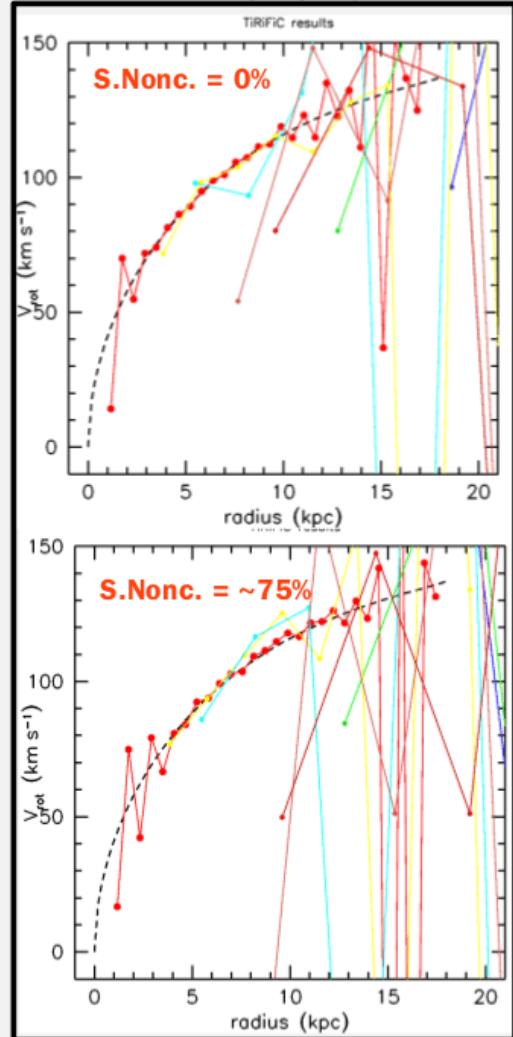


Velocity (km/s)

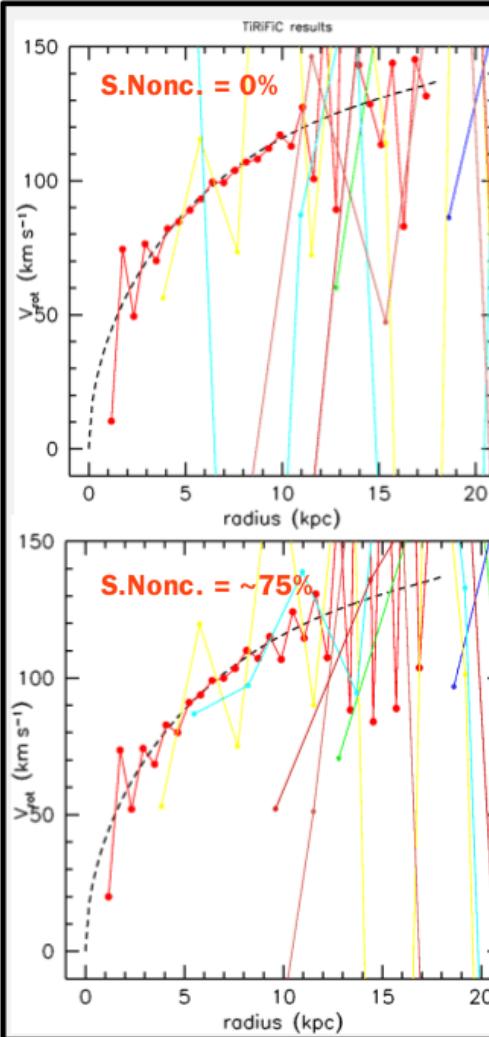
Radius

Performance comparison of RC programs : tirific

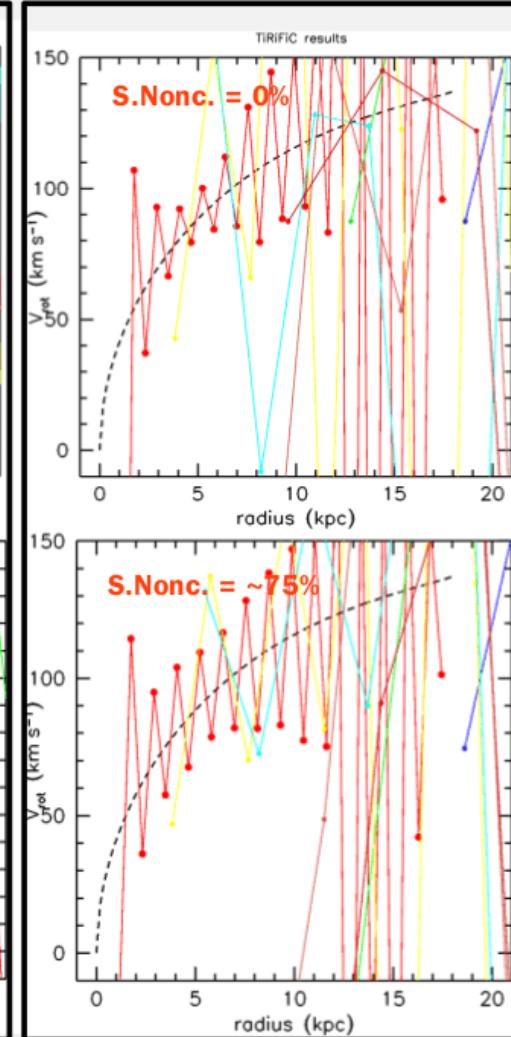
$\Omega=0 \text{ km/s/kpc}$



$\Omega=10 \text{ km/s/kpc}$



$\Omega=20 \text{ km/s/kpc}$



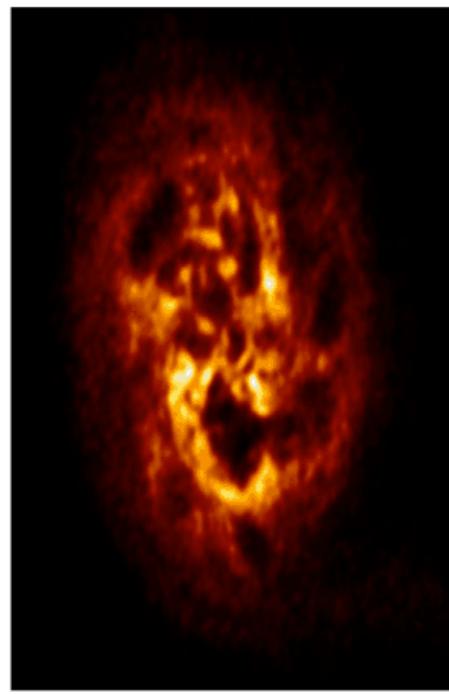
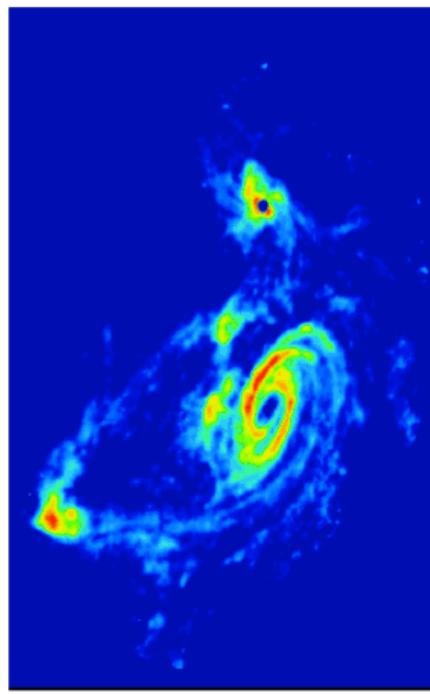
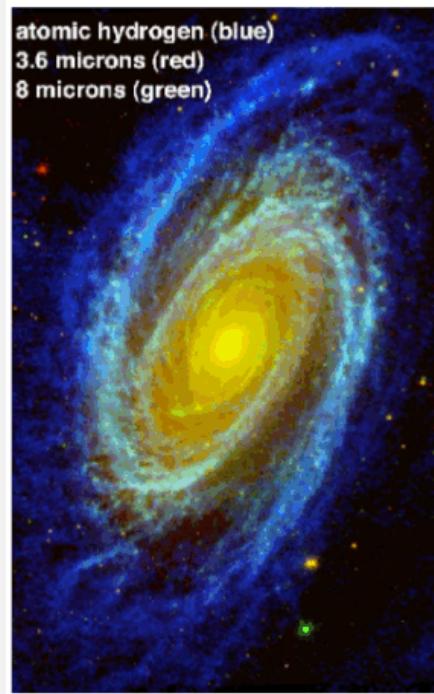
Radius

Preliminary results/findings...

- **We now have a machinery in place that will allow us to do:**
 - autonomously produce (realistic) model data cubes
 - autonomously parameterise (rotation curves) galaxies
- **We will further expand the parameter space of the model data cube (e.g., inclinations, maximum rotation velocities, sizes etc.)**



The effect of non-circular motions on velocity fields



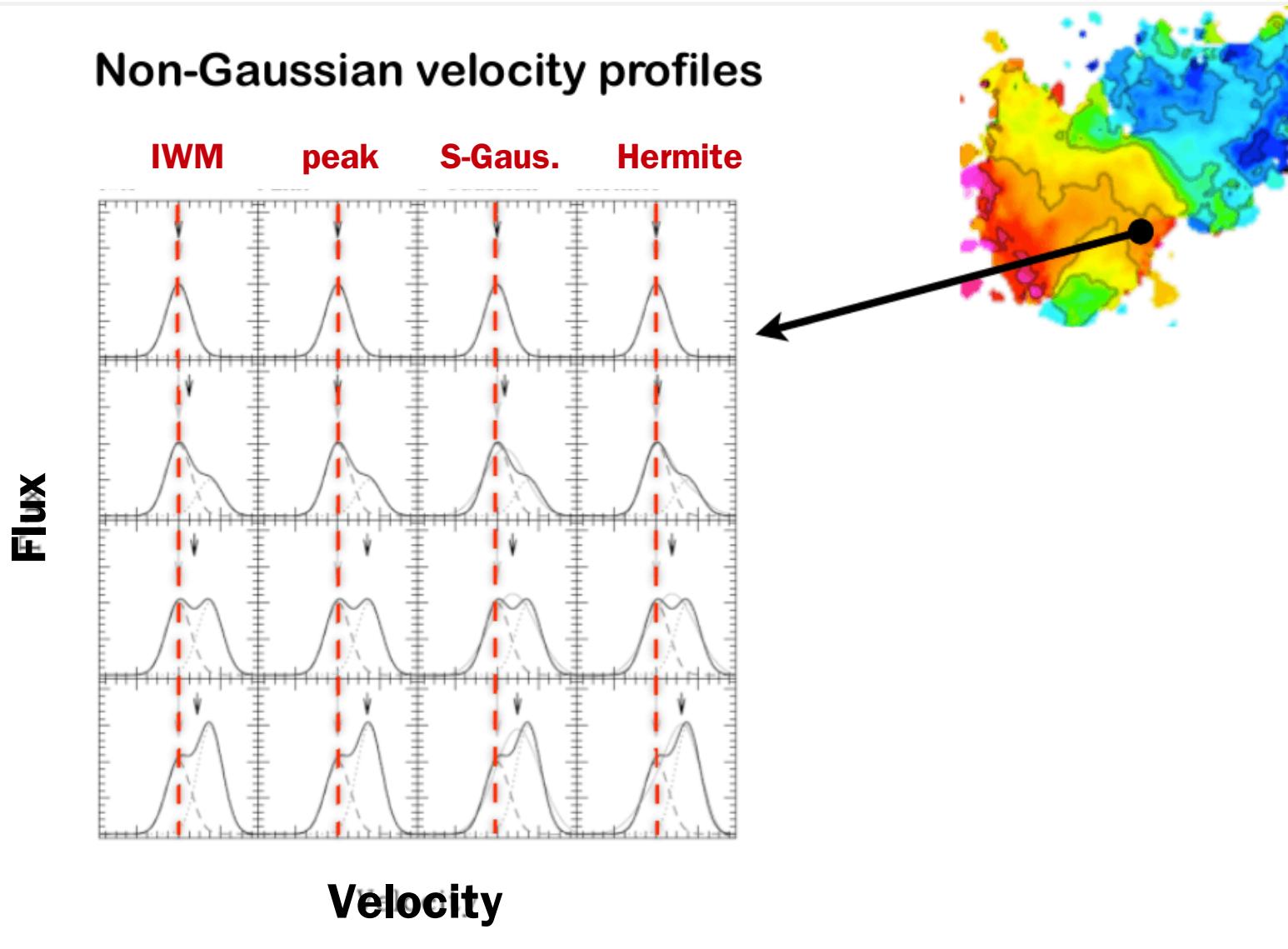
Streaming motions
along spiral arms

Streaming motions
along bars

Large-scale asymmetric
deviations

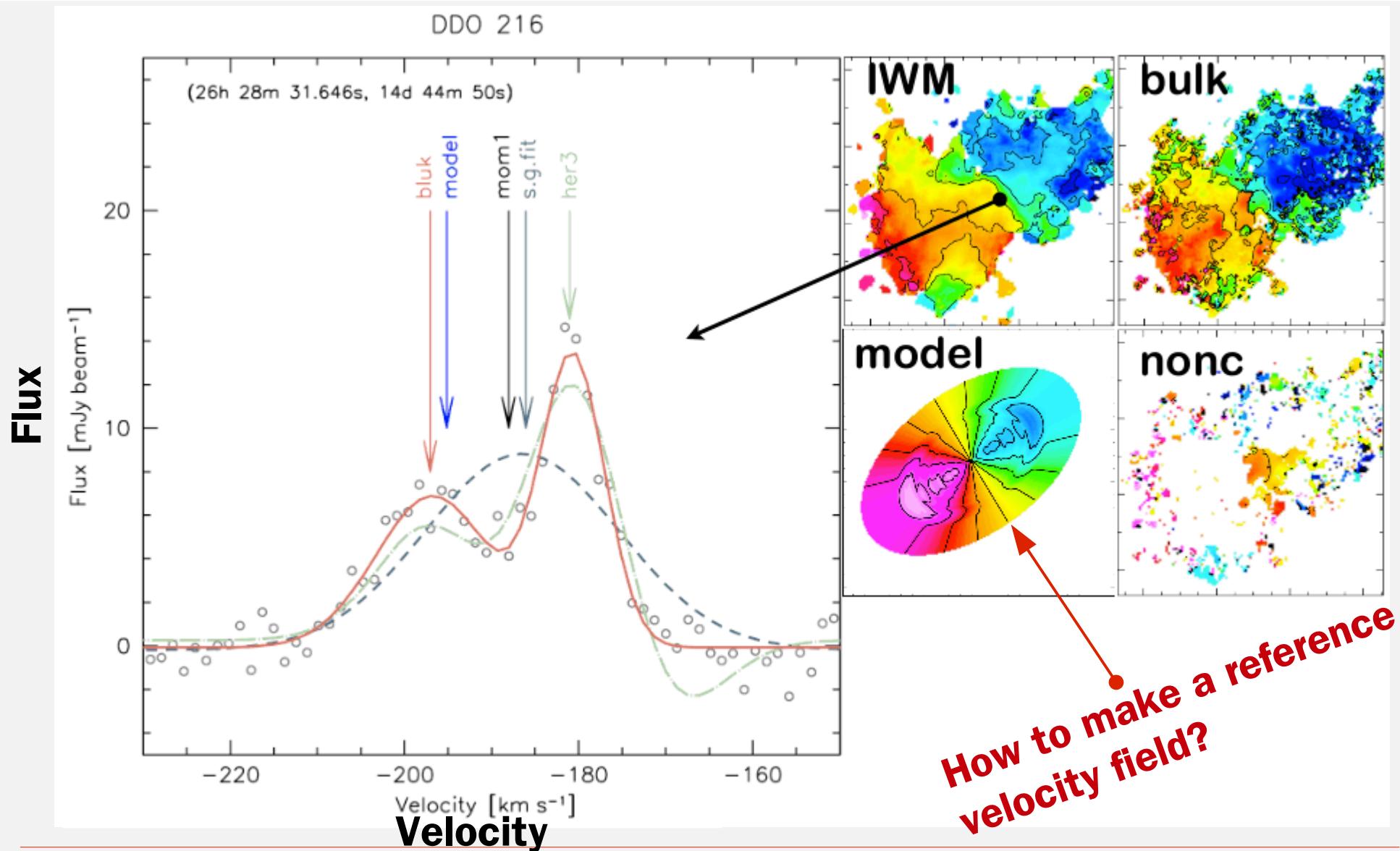
Small-scale asymmetric
deviations

Non-Gaussian velocity profiles





Bulk velocity field



Reference velocity field

- **fit a set of general galaxy disk models**

(e.g., Spekkens *et al.* 2007)

- **Solid body model :**



$$V_{\text{model}} = V_{\text{sys}} + \sin i (\bar{V}_t \cos \theta)$$

- **Radial model :**



$$V_{\text{model}} = V_{\text{sys}} + \sin i (\bar{V}_t \cos \theta + \bar{V}_r \sin \theta)$$

- **Bisymmetric model :** $V_{\text{model}} = V_{\text{sys}} + \sin i [\bar{V}_t \cos \theta - V_{2,t} \cos (2\theta_b) \cos \theta$

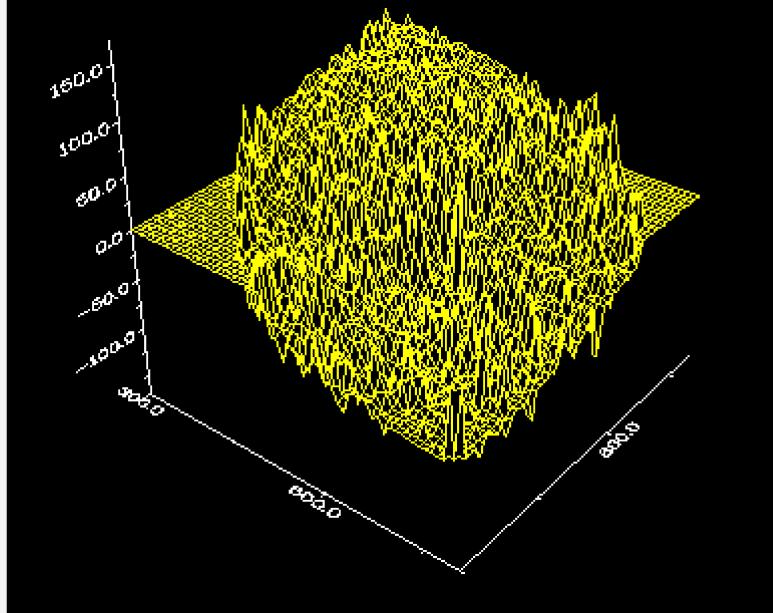


$$- V_{2,r} \sin (2\theta_b) \sin \theta].$$

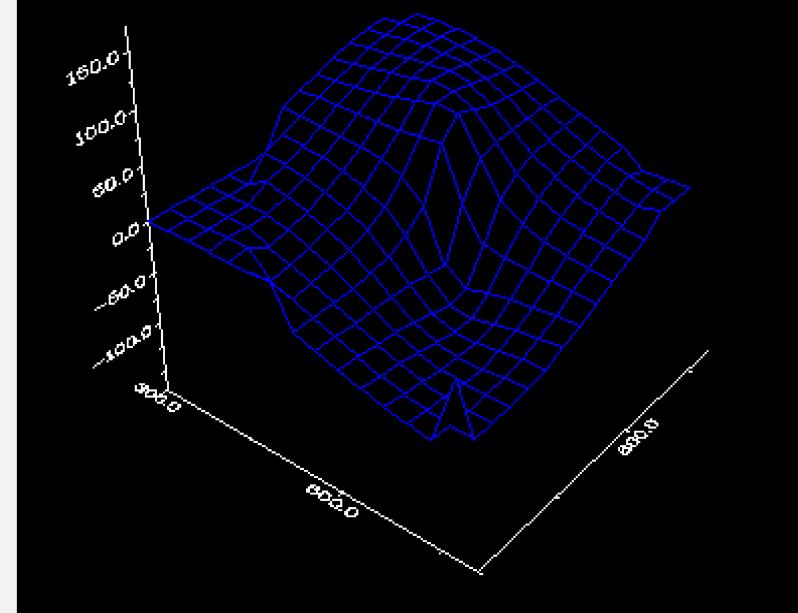


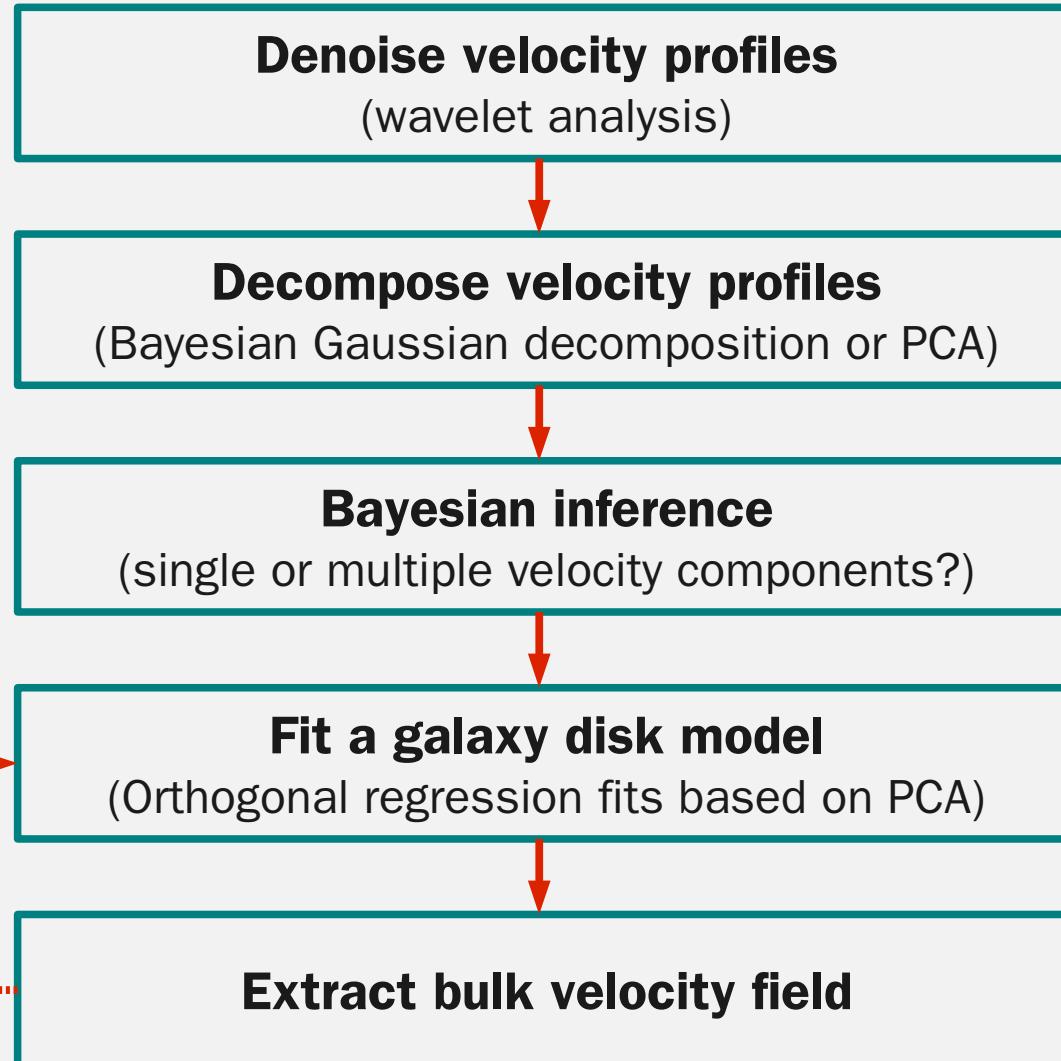
Reference velocity field

**3D plot of the decomposed
velocity components**



**Orthogonal regression surface
fit using a solidbody disk model**





A test python code

- **Bayesian Gaussian fits**

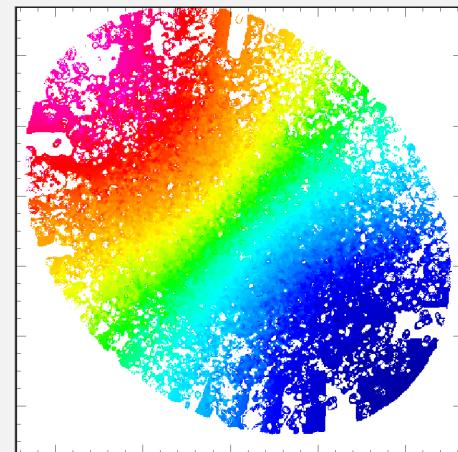
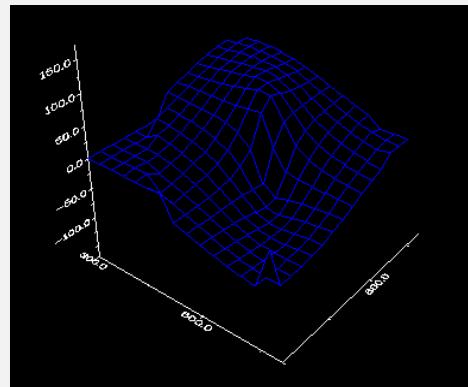
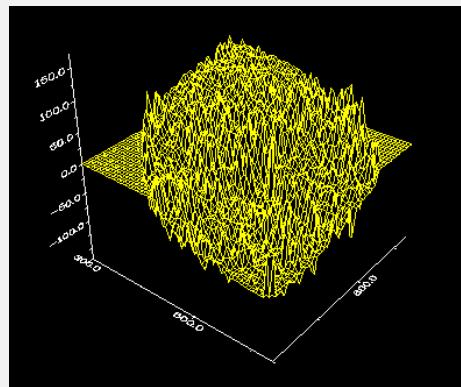
→ python modules: pymc, pyAstronomy

- **bulk_VF_wallaby_V0.9.py**

→ [usage] : python bulk_vf_wallaby_v0.9.py cube.fits 2

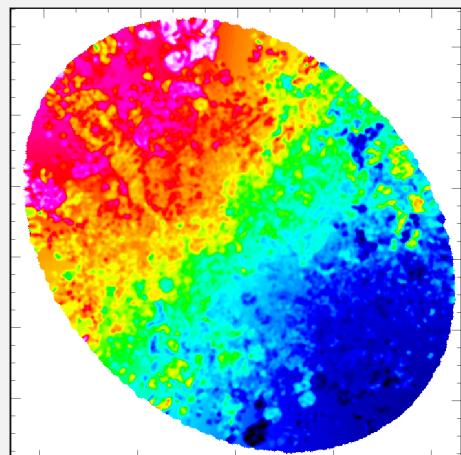
```
Thanks for flying Vim
seheon@darkmatter bayesian]$ 
seheon@darkmatter bayesian]$ 
seheon@darkmatter bayesian]$ 
seheon@darkmatter bayesian]$ 
seheon@darkmatter bayesian]$ python bulk_VF_wallaby_v0.9.py IA3.14B12X120X20C00S0P45I40D00.SS74.B6.fits 2
```

A test with a model data cube

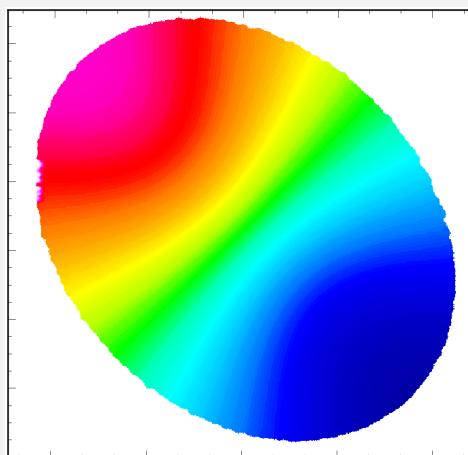


Bulk V.F.

Nonc V.F.



IWM V.F.



Model V.F.

Summary & Future works

- **The dark matter distribution near the centres of dwarf galaxies are better described by core-like halo models unlike the prediction from dark-matter-only simulations**
- **New SPH simulations including baryonic feedback processes (e.g., SN-driven gas outflows) are better to explain the shallow DM distribution found in nearby dwarf galaxies**
- **More tests on rotation curve programs**
- **More tests on bulk velocity field business**
 - C/C++ modules for Bayesian analysis which is computationally expensive
 - Apply PCA techniques for a reliable profile decomposition
 - Develop `bulk_VF_wallaby_v1.0.py`



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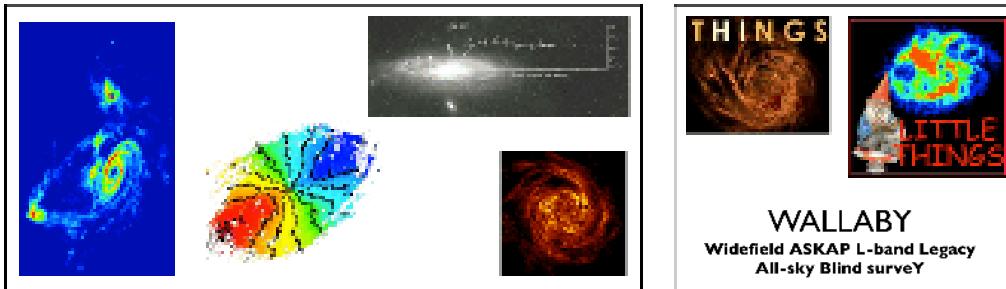


E.A. SKA collaboration meeting @ KASI 30/Nov-2/Dec/2011

Se-Heon Oh

- HI kinematics of galaxies
- Dark matter distribution in dwarf galaxies
- Progress on WALLABY rotation curve pipeline
- A new approach for extracting bulk velocity fields
- Summary & future works

- **Dynamical structure** : (dark) matter distribution in galaxies
- **Interplay between ISM and star formation** on small (sub-kpc) scales
- **Dynamical information about galaxy evolution** : warps, bars, spiral arms, tidal interaction, HVCs etc.



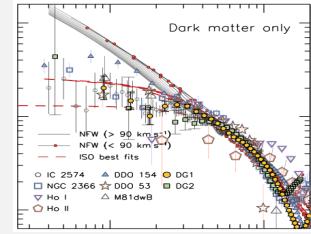
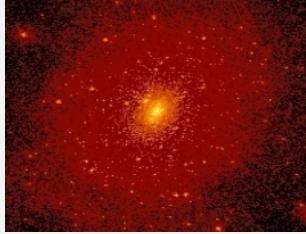
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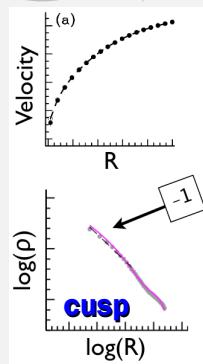


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- **Angular momentum problem**
- **“cusp/core” problem**

“cusp/core” problem in galaxies

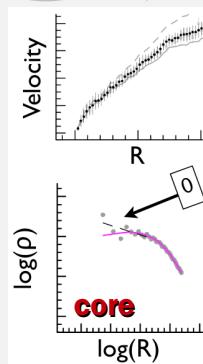
Λ CDM simulations

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Observations

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 Kuzio de Naray et al. (2006)
 Gentile et al. (2007)
 Oh et al. (2008)
 Trachternach et al. (2008)
 de Blok et al. (2008)
 Oh et al. (2011a, b)
 etc.

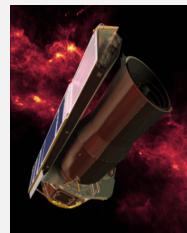




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The HI Nearby Galaxy Survey (THINGS)

- **VLA HI 21-cm survey (~6"; 5.2 km/s; ~500 hours) of nearby (< 10 Mpc) 34 galaxies**
- **Commensality with optical, Spitzer SINGS, GALEX uv, CO data etc.)**
- **All observations ended in late 2005**
- **Data available at <http://www.mpia.de/THINGS>**



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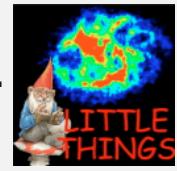
The HI Nearby Galaxy Survey (THINGS)



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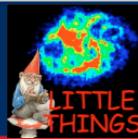
Se-Heon Oh

- **THINGS-like (~6"; < 5.2 km/s) high-resolution VLA HI 21cm survey (B+C+D; 376 hours) for 41 nearby (< 10 Mpc) dwarf (dIm, BCD) galaxies**
- **Commensality with Spitzer (+ Herschel) optical, GALEX uv, CO data etc.)**
- **VLA observations ended in 2008**
- **Further observations with EVLA, CARMA, APEX etc.**



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**Deidre Hunter (PI. Lowell obs)**

Elias Brinks (Univ. of Hertf.)

Bruce Elmegreen (IBM)

Michael Rupen (NRAO)

Caroline Simpson (Florida Univ.)

Fabian Walter (MPIA)

David Westpfahl (NMT)

Lisa Young (NMT)

Trisha Ashley (Florida Int. Univ.)

Sandipan Basu (Florida Int. Univ.)

Phil Cigan (NMT)

Dana Ficut-Vicus (Univ. of Hertf.)

Volker Heesen (Univ. of Hertf.)

Kim Herrmann (Lowell Obs)

Megan Jackson (Lowell Obs)

Se-Heon Oh (ICRAR/UWA)

Andreas Schruba (MPIA)

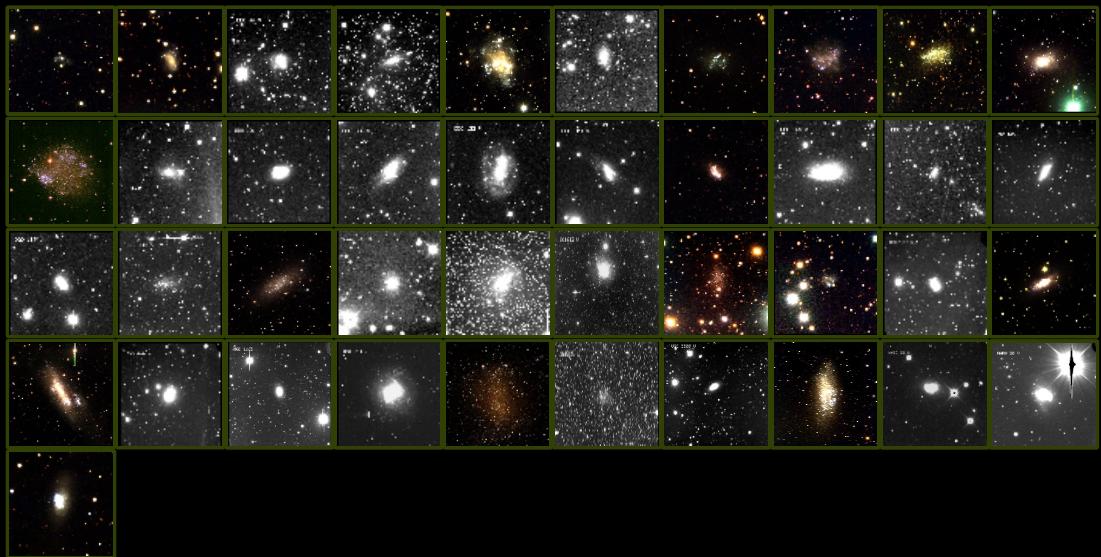
Hongxin Zhang (Lowell Obs)

3rd team meeting in Socorro 27-29 Mar 2011**E.A. SKA collaboration meeting @ KASI 30/Nov-2/Dec/2011****Se-Heon Oh**



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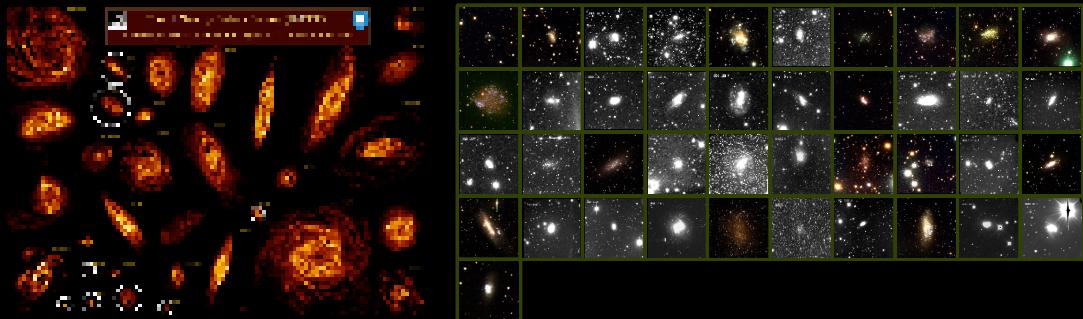
LITTLE THINGS sample galaxies



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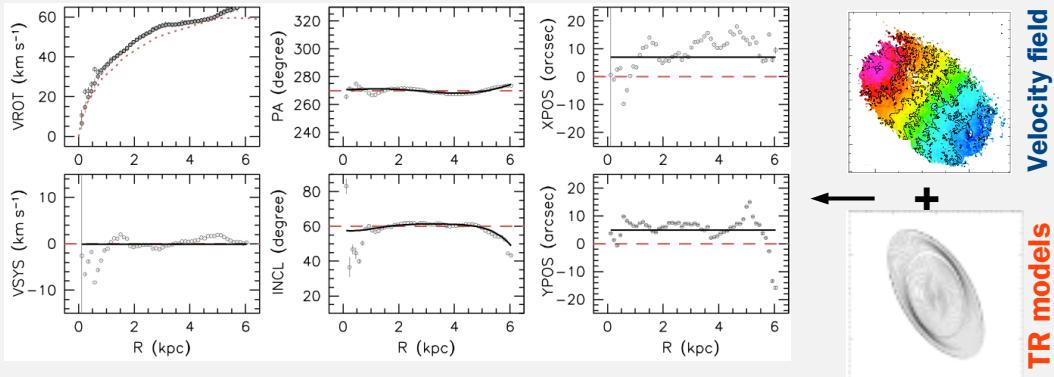
Dark matter distribution in (LITTLE) THINGS dwarf galaxies



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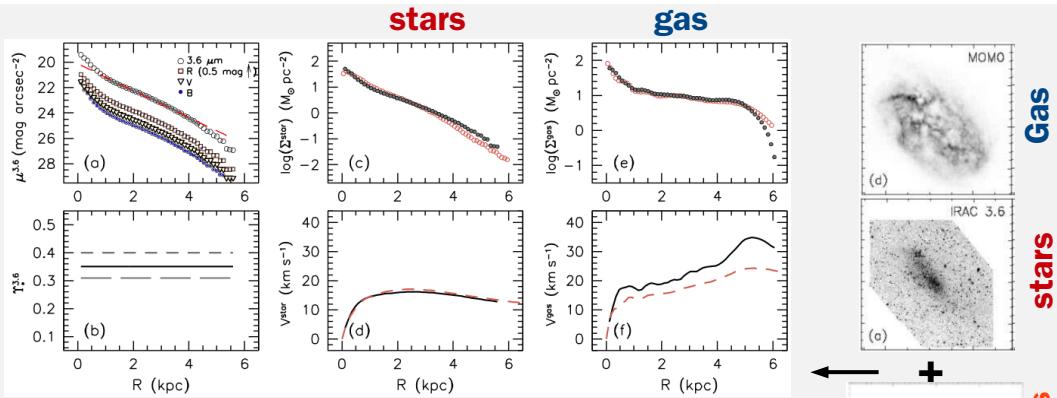
Se-Heon Oh

I. Deriving rotation curves



- **Fit tilted-ring models to 2D velocity fields**
 (e.g., Rogstad et al. 1974; “rotcur” in GIPSY)

II. Deriving mass models of baryons



- Mass modelling of 7 THINGS and 15 LITTLE THINGS dwarf galaxies using VLA HI data, Spitzer 3.6 micron images and ancillary optical images



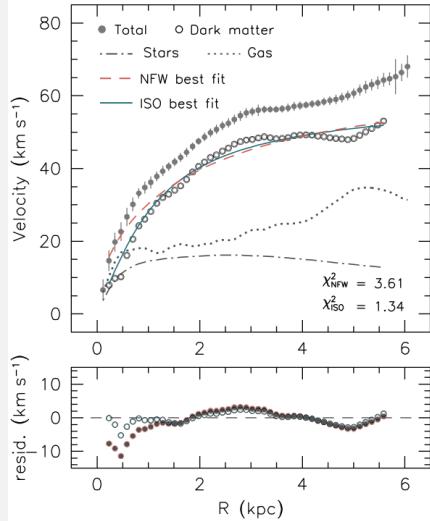
Gas

stars

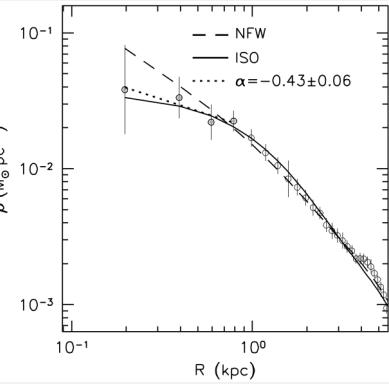
TR models

III. Deriving dark matter density profiles

Disk-halo decomposition

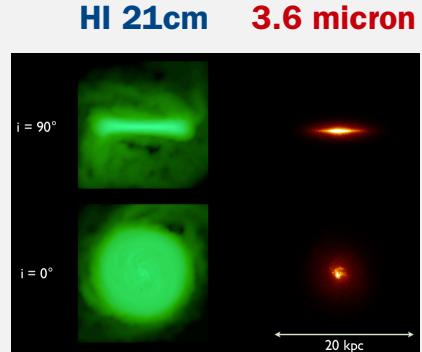


Dark matter density profile



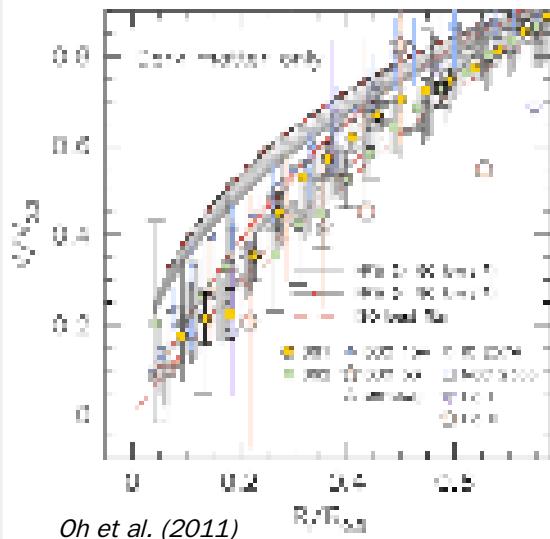
$$\rho(R) = \frac{1}{4\pi G} \left[2 \frac{V}{R} \frac{\partial V}{\partial R} + \left(\frac{V}{R} \right)^2 \right]$$

- N-body+SPH tree-code **GASOLINE**
- Flat Λ -dominated cosmology
- Baryonic processes are included, such as
 - gas cooling
 - cosmic UV field heating
 - star formation
 - SNe-driven gas outflows
- ~3.3 million particles within the virial radius at $z = 0$.
- $DM \sim 1.6 \times 10^4 M_{\odot}$; gas particle $\sim 3.3 \times 10^3 M_{\odot}$
- The force resolution (gravitational softening) ~ 86 pc.



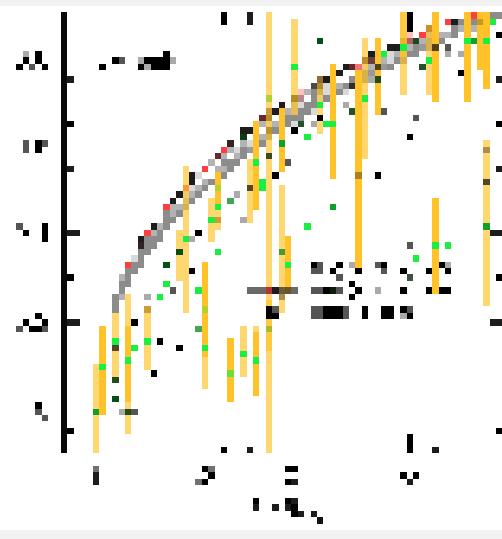
The rotation curve shape of THINGS & LITTLE THINGS

7 THINGS + new SPH simulations



Oh et al. (2011)

15 LITTLE THINGS

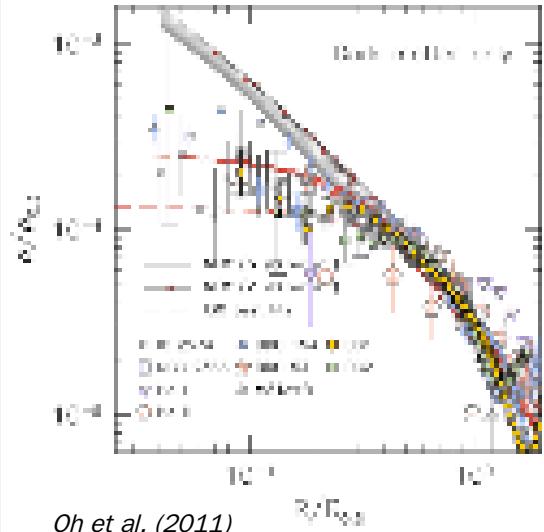


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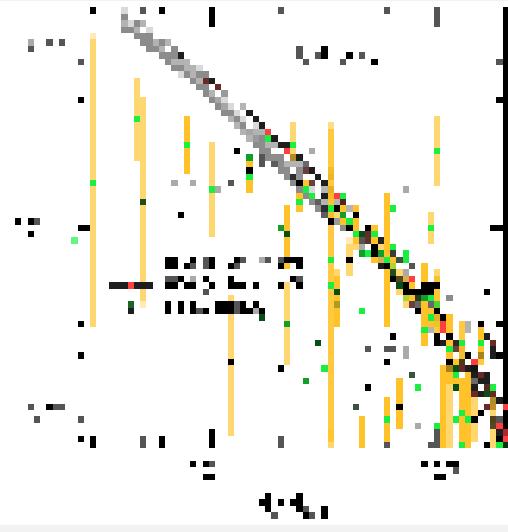
Dark matter density profiles of THINGS & LITTLE THINGS

7 THINGS + new SPH simulations



Oh et al. (2011)

15 LITTLE THINGS



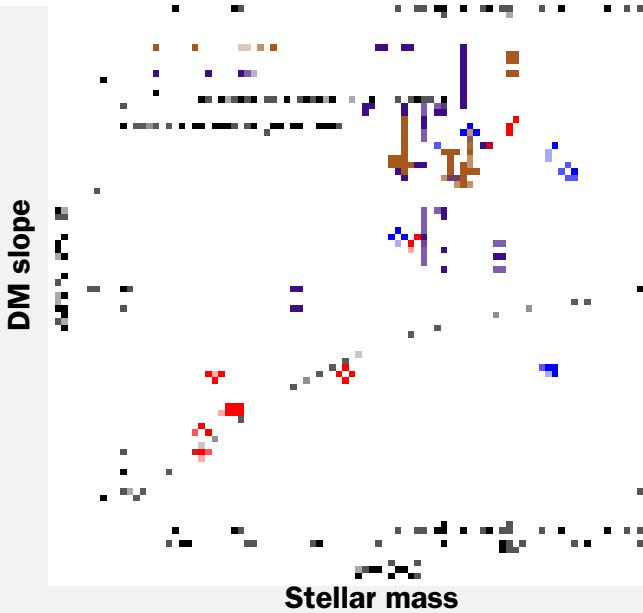
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DM slope as a function of stellar mass



- Gas outflows get less efficient in smaller galaxies so cores at fixed radius get smaller...

- SN driven gas outflows in the early Universe can be a solution for the “cusp/core” controversy

Oh et al. in prep.

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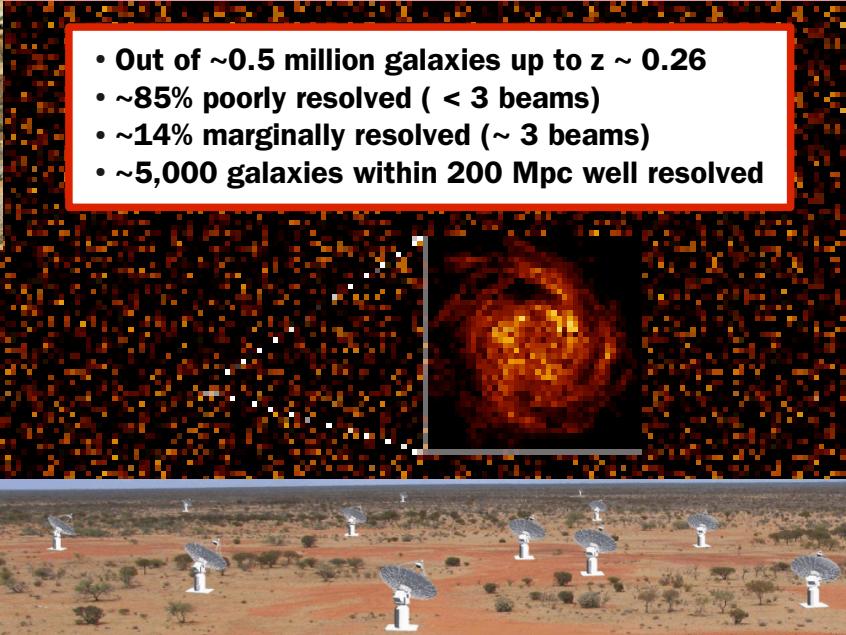
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ASKAP WALLABY survey

(Widefield ASKAP L-band Legacy All sky Blind surveY)

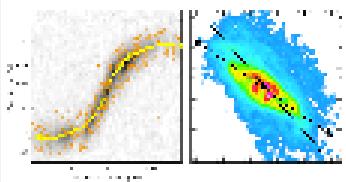


How to derive rotation curves of the
resolved WALLABY galaxies?

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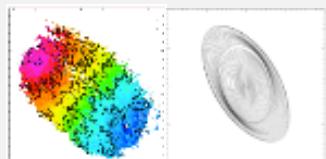
Se-Heon Oh

Deriving rotation curves of galaxies



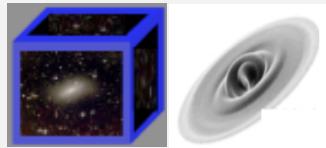
- **1-D : long slit observations**

- position-velocity diagram
- major axis cut
- affected by systematic effects (e.g., non-circular motions, beam smearing etc.)



- **2-D : velocity fields**

- tilted-ring model ("rotcur", Rogstad et al. 1974)
- flat disk model ("velfit", Spekkens et al. 2007)
- suited for well-resolved galaxies with moderate inclinations

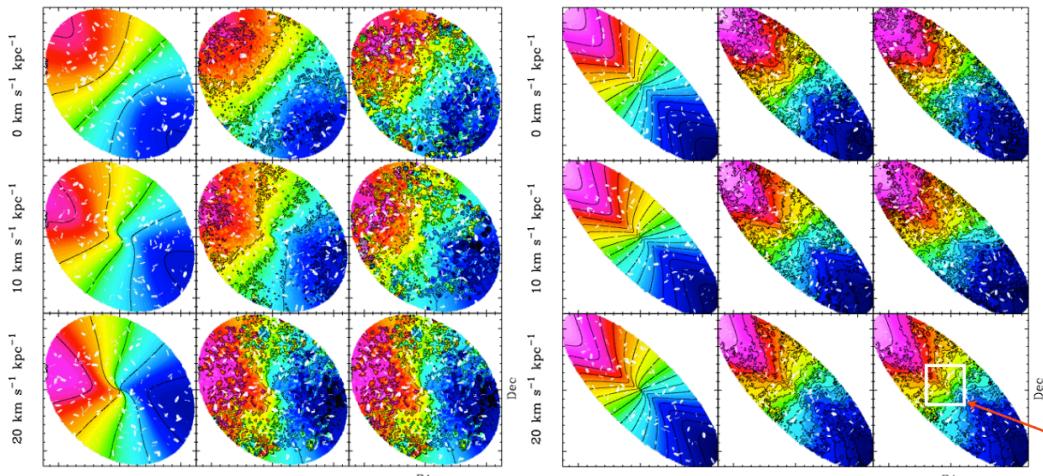


- **3-D : data cubes**

- direct fits to data cubes
(e.g., "TiRiFiC", Jozsa et al. 2007)
- fits a larger class of galaxies

Performance comparison of RC programs : Artificial data cubes

- Based on THINGS (e.g., HI column density, velocity dispersion, rotation curves etc.), a suite of model data cubes created..



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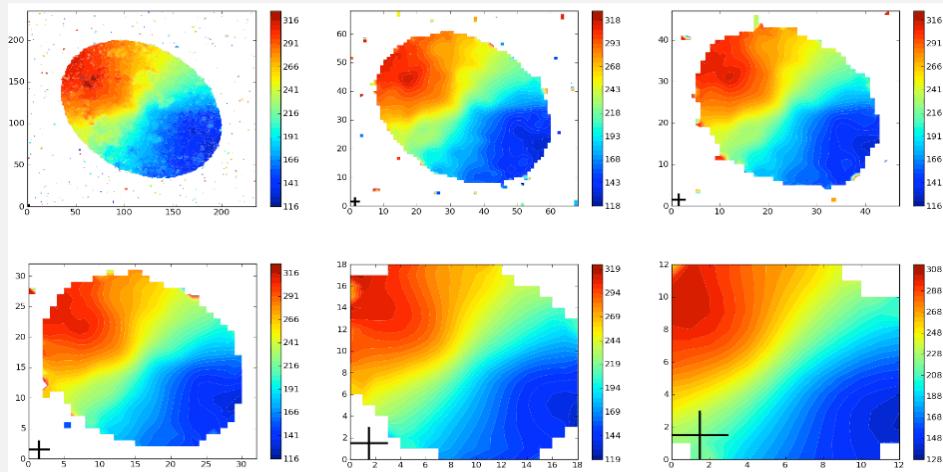
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Shifting the model galaxies to 6 redshifts

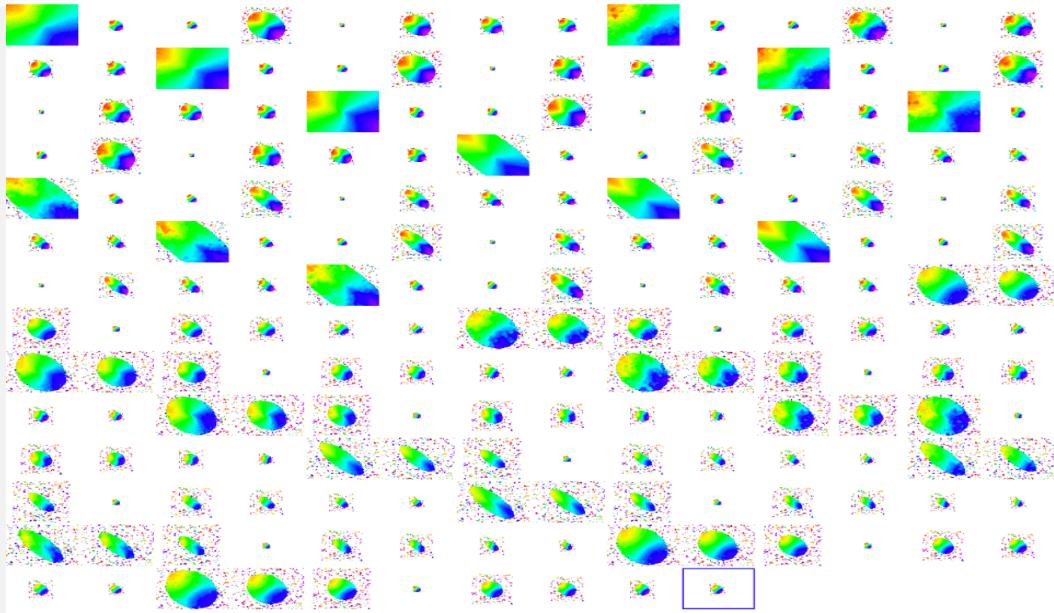
- Re-observe the model data cubes with the ASKAP beam ($30''$) and shift them to 6 different redshifts, and derive rotation curves...



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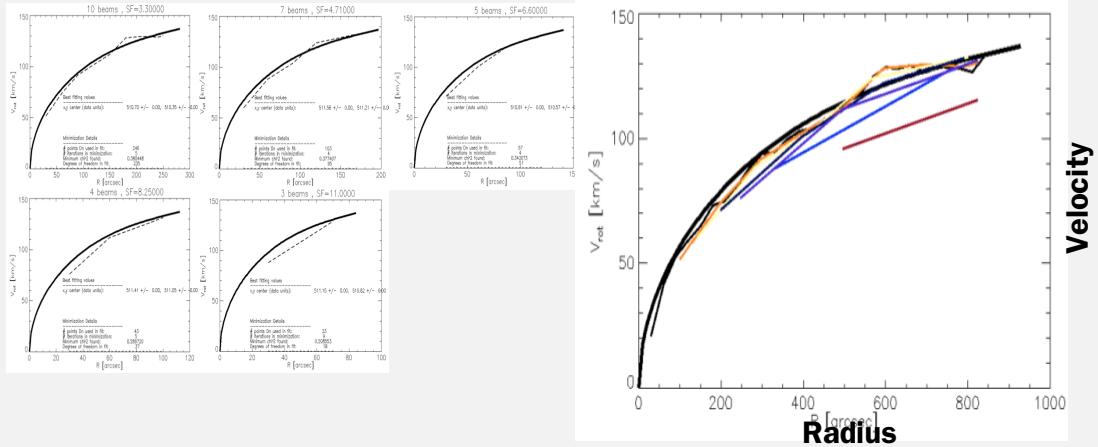
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196 model data cubes shifted



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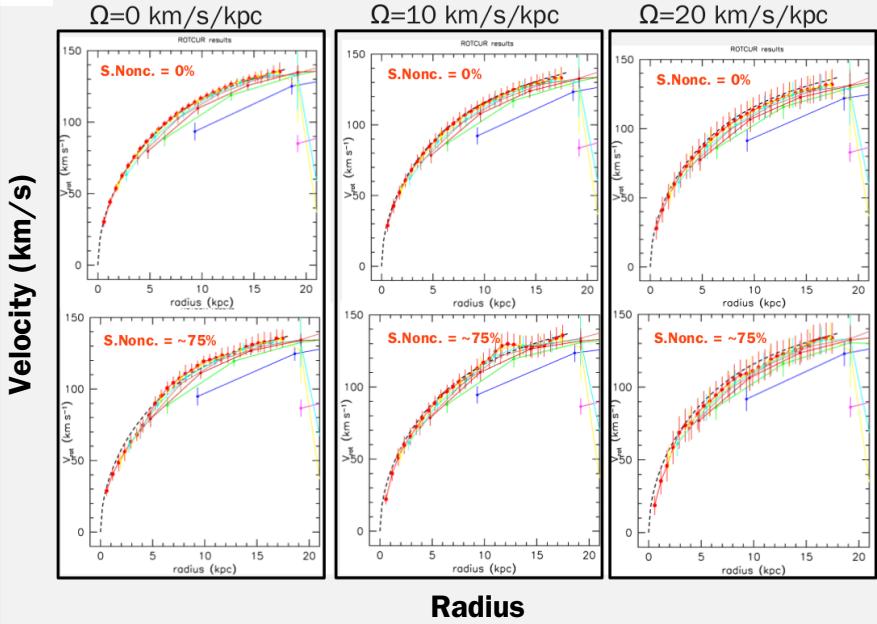
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Performance comparison of RC programs : rotcur

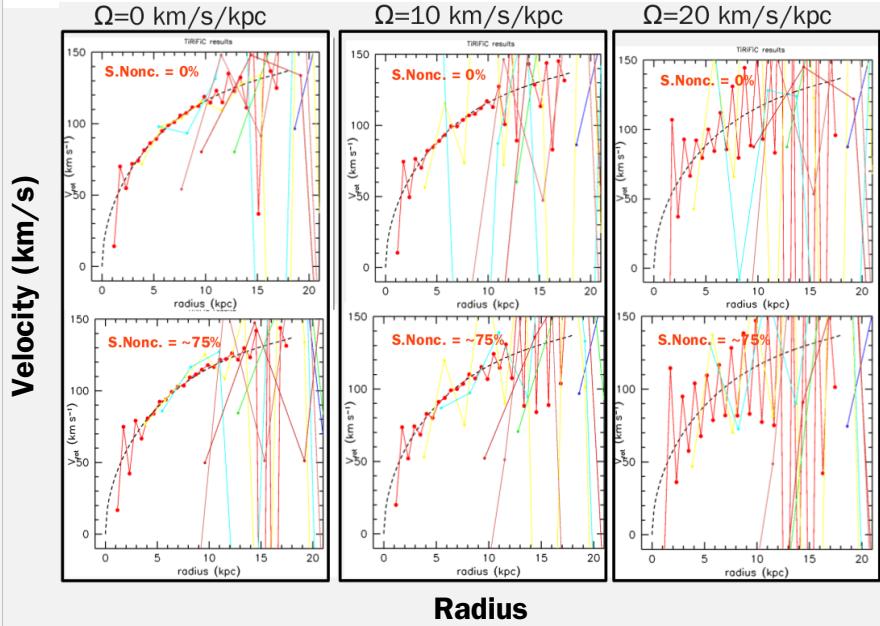


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Performance comparison of RC programs

: tirific

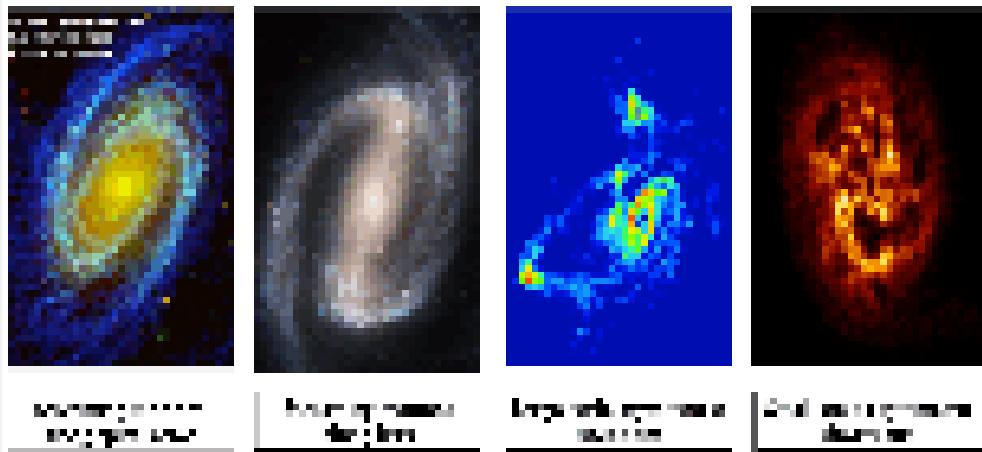


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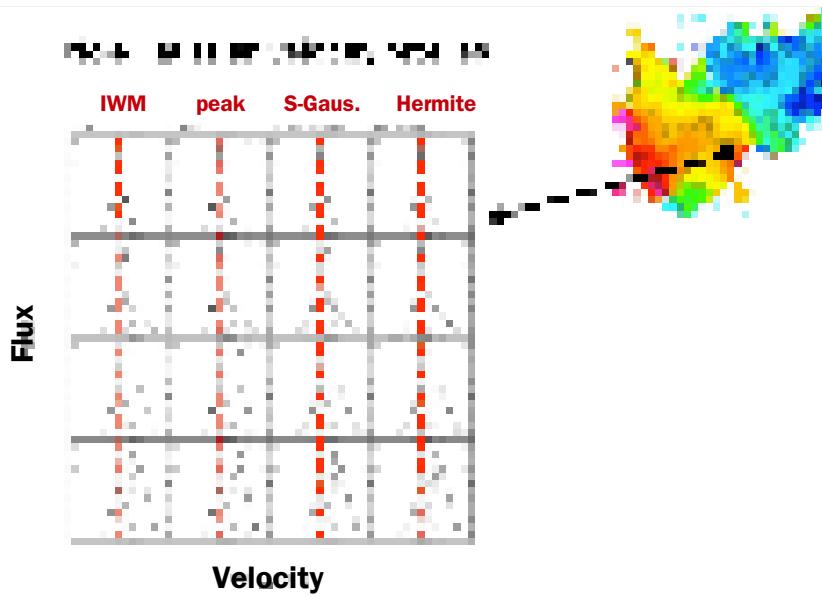
- **We now have a machinery in place that will allow us to do:**
 - autonomously produce (realistic) model data cubes
 - autonomously parameterise (rotation curves) galaxies
- **We will further expand the parameter space of the model data cube (e.g., inclinations, maximum rotation velocities, sizes etc.)**

The effect of non-circular motions on velocity fields





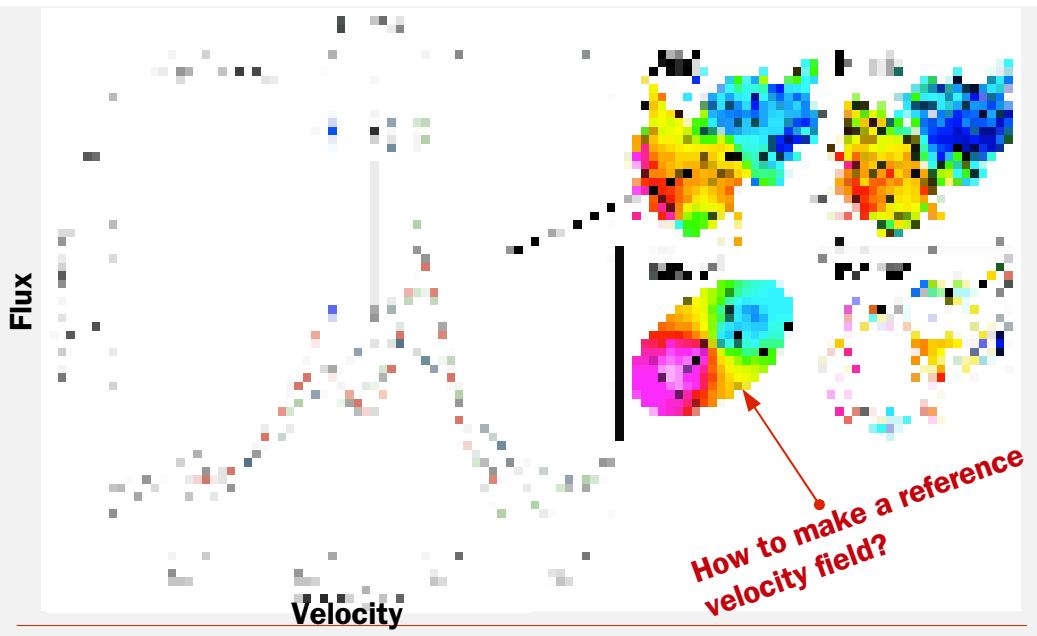
Non-Gaussian velocity profiles





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Bulk velocity field



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- **fit a set of general galaxy disk models**

(e.g., Spekkens et al. 2007)

- **Solid body model :**

$$V_{\text{model}} = V_{\text{sys}} + \sin i (\bar{V}_t \cos \theta)$$



- **Radial model :**

$$V_{\text{model}} = V_{\text{sys}} + \sin i (\bar{V}_t \cos \theta + \bar{V}_r \sin \theta)$$



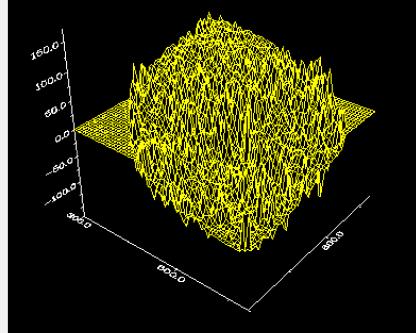
- **Bisymmetric model :**

$$V_{\text{model}} = V_{\text{sys}} + \sin i [\bar{V}_t \cos \theta - V_{2,t} \cos (2\theta_b) \cos \theta - V_{2,r} \sin (2\theta_b) \sin \theta].$$

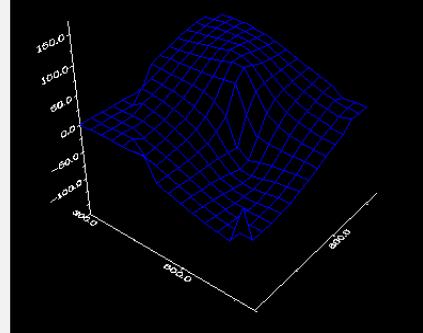


Bayes factor < 1

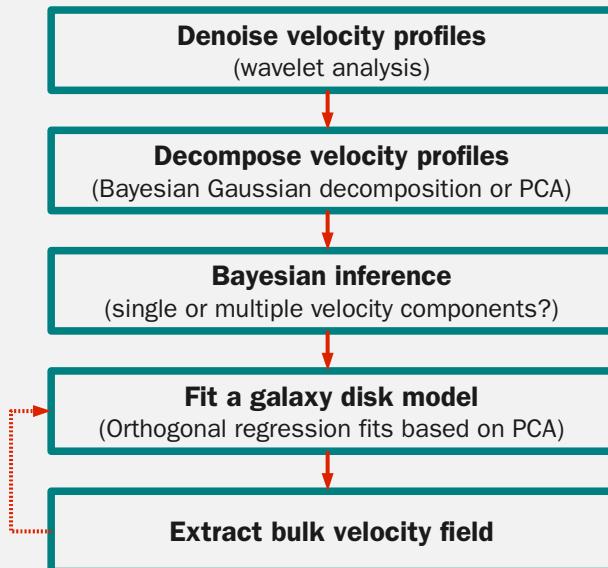
3D plot of the decomposed velocity components



Orthogonal regression surface fit using a solidbody disk model



A schematic flow chart for extracting “bulk” velocity fields



- **Bayesian Gaussian fits**

→ python modules: pymc, pyAstronomy

- **bulk_VF_wallaby_V0.9.py**

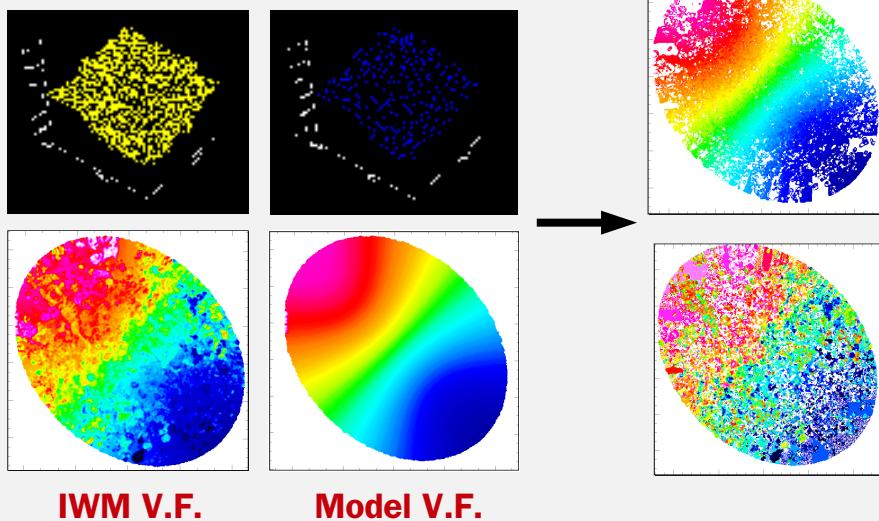
→ [usage] : python bulk_vf_wallaby_v0.9.py cube.fits 2



```
seheon@darkmatter bayesian]$  
seheon@darkmatter bayesian]$  
seheon@darkmatter bayesian]$  
seheon@darkmatter bayesian]$  
seheon@darkmatter bayesian]$ python bulk VF wallaby v0.9.py IA3.14B12X120X20C0050P45I40D00.SS74.B6.fits 2 ]
```

A test with a model data cube

Bayes factor < 1



- The dark matter distribution near the centres of dwarf galaxies are better described by core-like halo models unlike the prediction from dark-matter-only simulations
- New SPH simulations including baryonic feedback processes (e.g., SN-driven gas outflows) are better to explain the shallow DM distribution found in nearby dwarf galaxies
- More tests on rotation curve programs
- More tests on bulk velocity field business
 - C/C++ modules for Bayesian analysis which is computationally expensive
 - Apply PCA techniques for a reliable profile decomposition
 - Develop bulk_VF_wallaby_v1.0.py