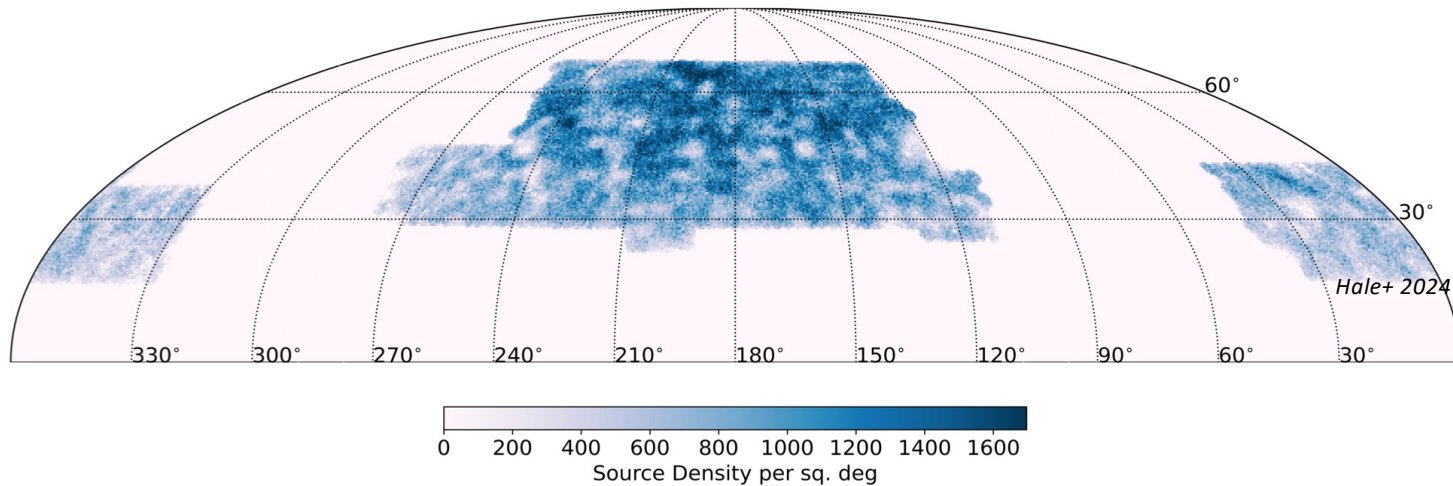
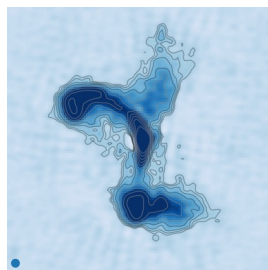
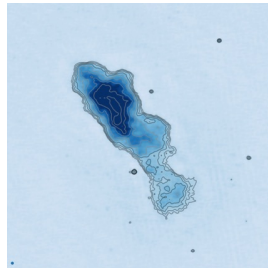
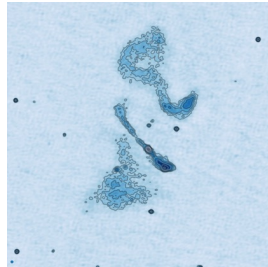
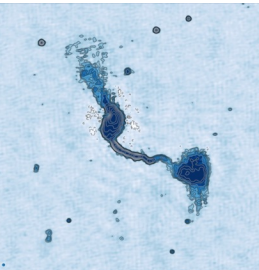
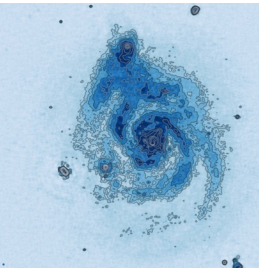
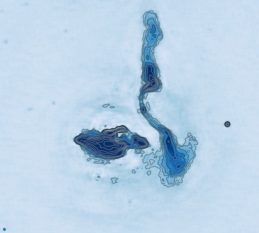


# Cosmological Studies with the LOFAR Two-metre Sky Surveys

Images from Shimwell+ 2019



*\*Notably:*

*S. Nakoneczny,  
L. Böhme,  
J. Zheng,  
M. Pashapour-  
Ahmadabadi*

**Catherine Hale**  
*University of Oxford*

*On behalf of members in the LOFAR Surveys Cosmology Team\**

THE UNIVERSITY OF EDINBURGH

LEVERHULME TRUST

UNIVERSITY OF OXFORD

[catherine.hale@physics.ox.ac.uk](mailto:catherine.hale@physics.ox.ac.uk)

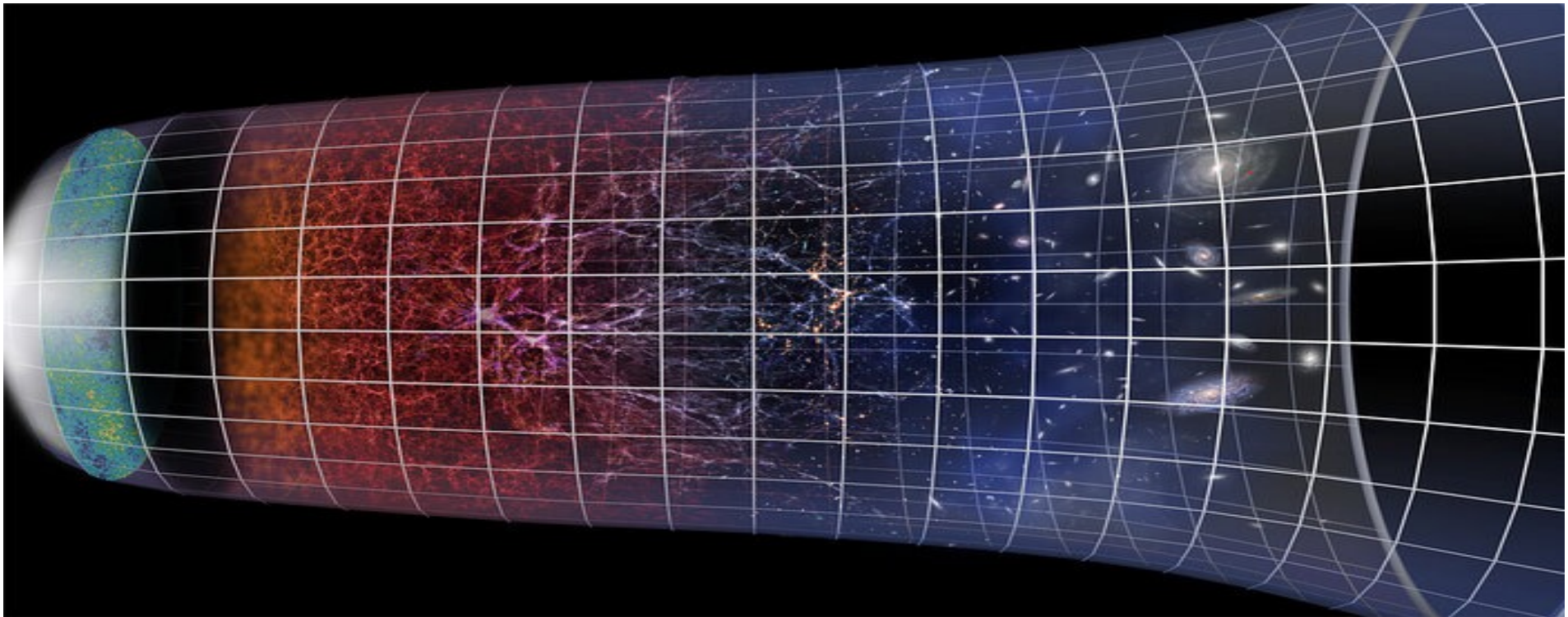
LOFAR Family Meeting, Leiden 2024

# Overview

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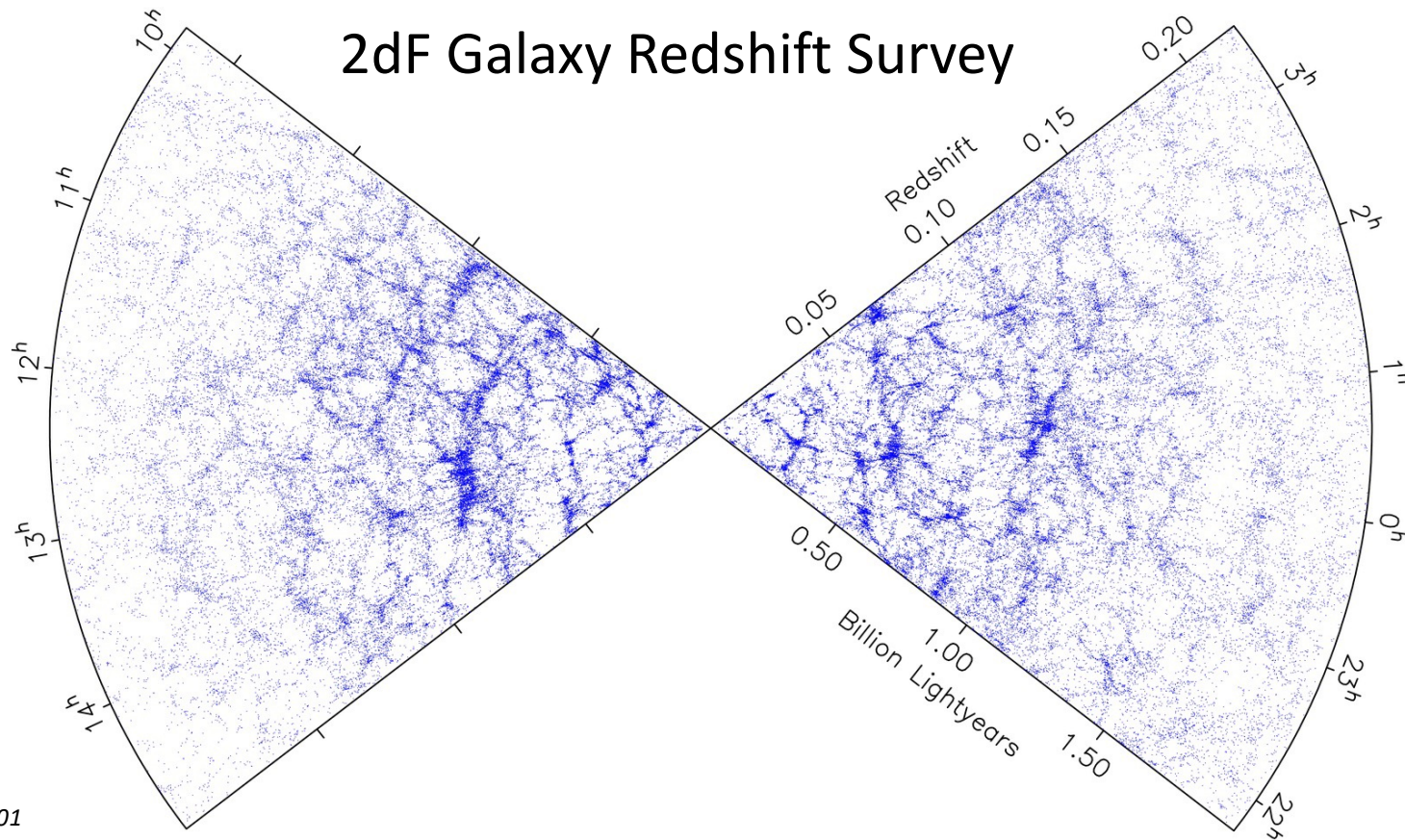
- Tracing Large Scale Structure with galaxy surveys
- LOFAR surveys: Systematics and observational biases
- Cosmology with LoTSS-DR2:
  - Angular Clustering (*Hale et al. 2024*)
  - One-Point statistics (*Pashapour-Ahmadabadi et al. in prep*)
  - Cosmic Dipole (*Böhme et al. in prep*)
  - Cross-Correlation with CMB (*Nakoneczny et al. 2024*) and eBOSS (*Zheng et al. in prep*)
  - Flux dependent Clustering (*Bhardwaj+ in press*)
- Bias evolution of AGN and SFGs in the LOFAR Deep Fields
  - *Hale et al. in prep*
- Future for cosmology studies with LOFAR

# Tracing Large Scale Structure with galaxy surveys



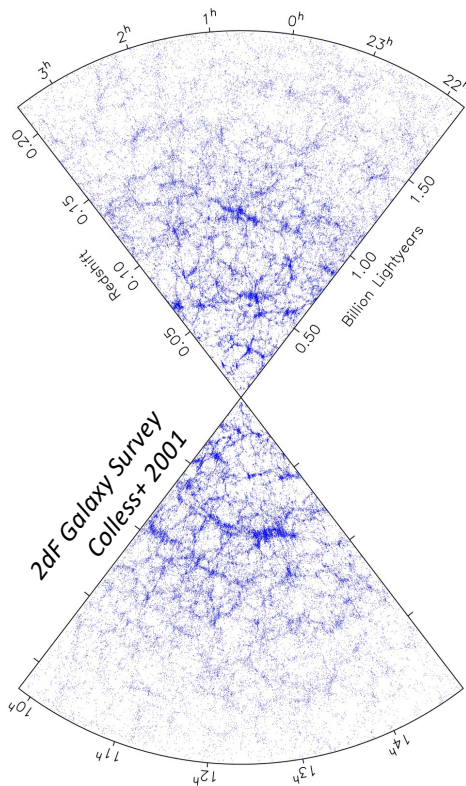
**Credit:** ESO/M. Kornmesser

# Large-Scale Structure of the Universe



2dF Galaxy Survey; Colless+ 2001

# Tracing Large Scale Structure with galaxy surveys



Large **spectroscopic surveys** provide an **excellent opportunity** to trace the **large-scale structure** of the Universe

*See e.g. 2dFGS (Colless+ 2001), SDSS (York+ 2000), GAMA (Driver+ 2011)*

Using accurate redshifts allows **precise observation** of the **location** of galaxies and to **observe clusters, filaments and voids**

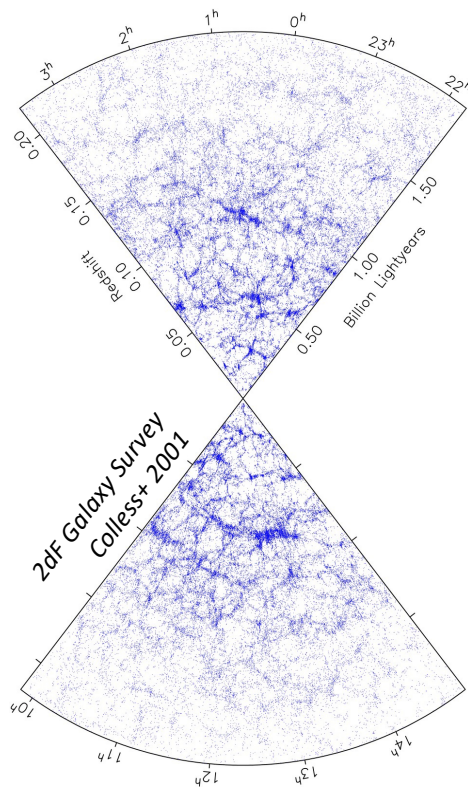
One way to quantify the large-scale structure is by tracing **how clustered** galaxies appear in the survey at **different scales** compared to if there was no large-scale structure

This can be quantified by the **two-point correlation function**

*See e.g. Hauser & Peebles 1980, Peebles+ 1980, Davis & Peebles 1983*

# Tracing Large Scale Structure with galaxy surveys

See e.g. Peebles+ 1980



## Two-Point Correlation Function

$$dP = n[1 + \xi(r)]dV$$

Probability to observe galaxy pairs at a given separation

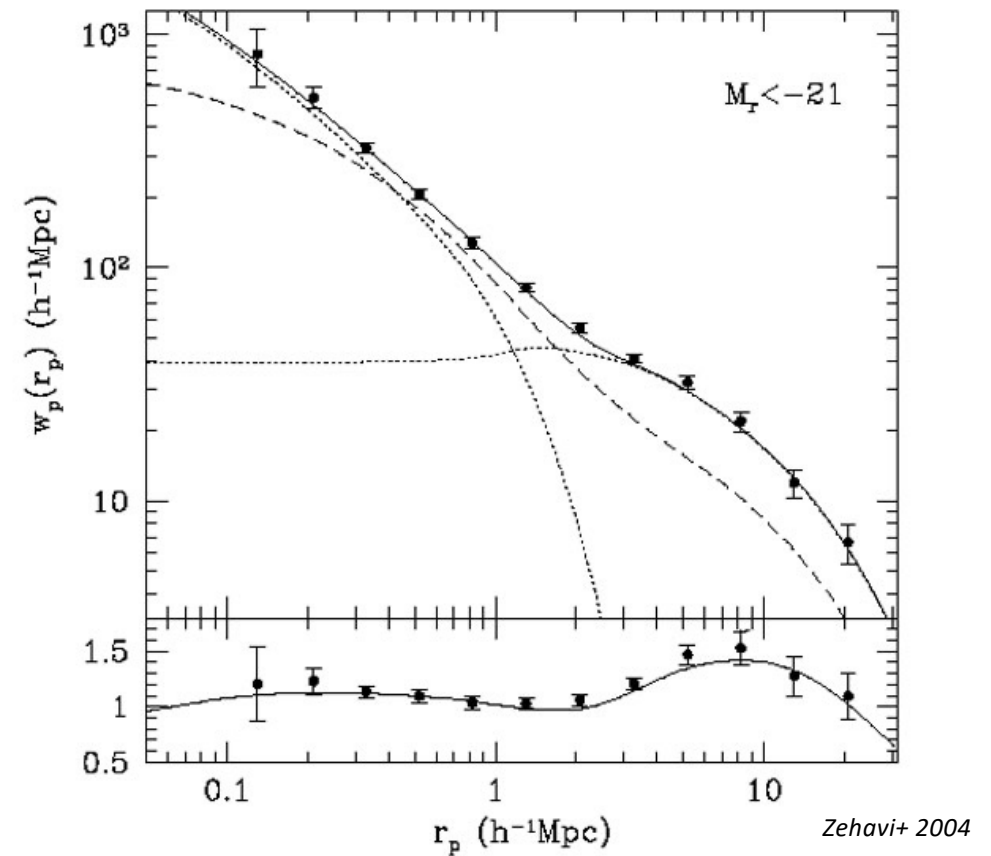
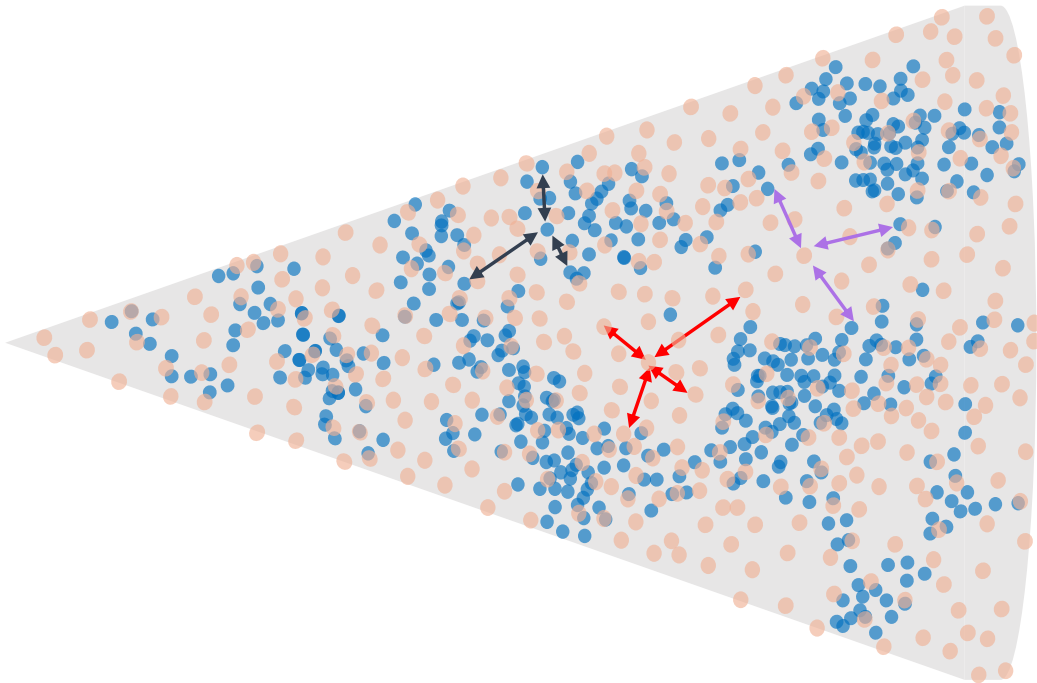
Mean number density

Spatial two-point correlation function

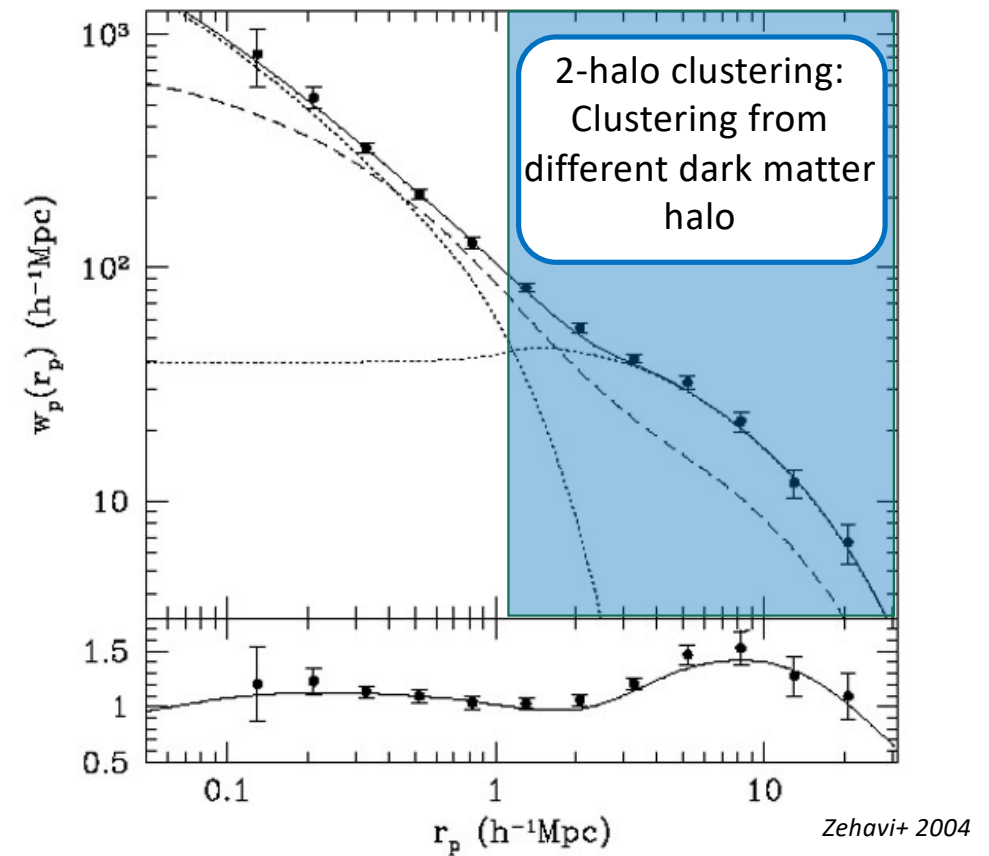
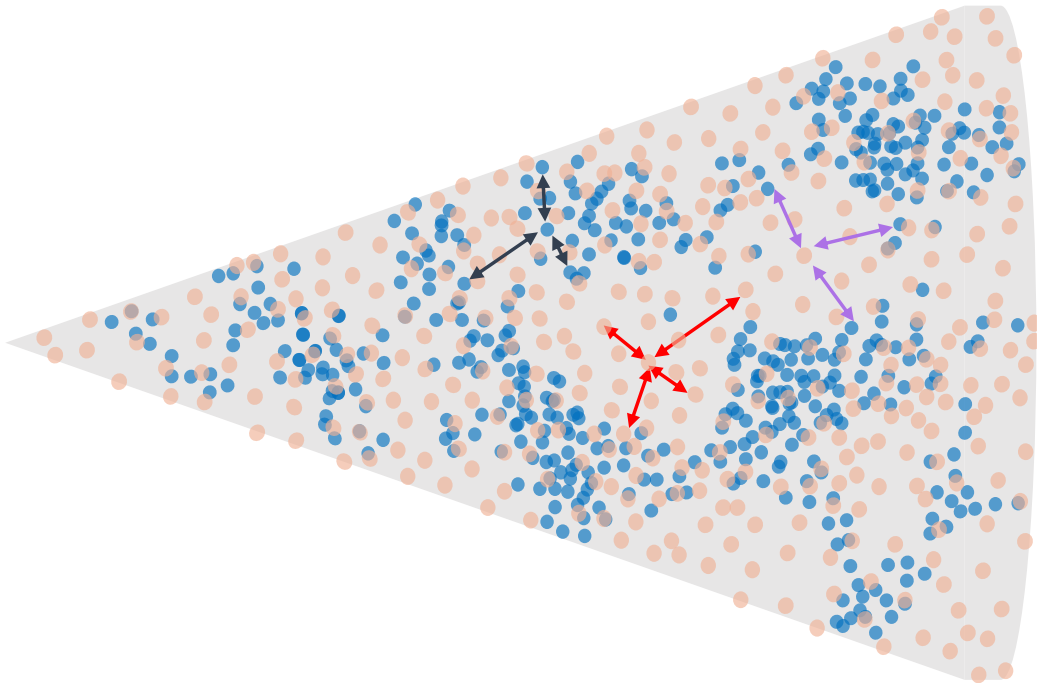
Volume element

If we measure  $\xi(r)$  then we quantify the excess probability to observe galaxies at a given separation.

# Large-Scale structure of the Universe

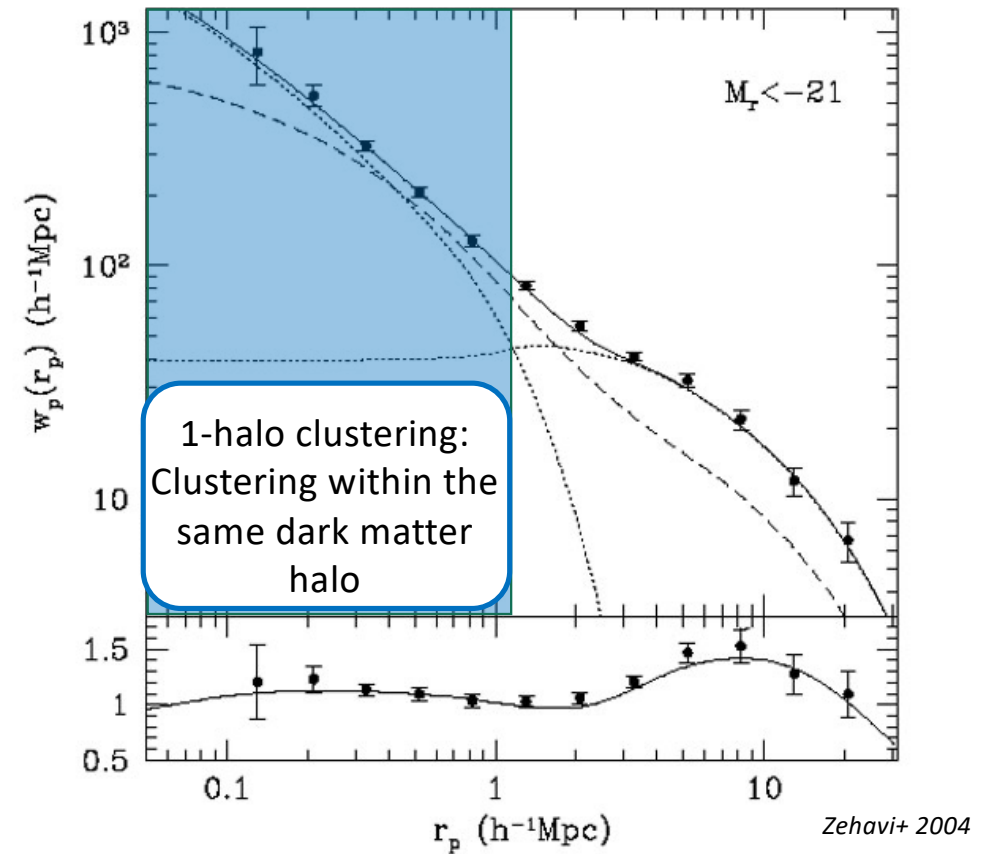
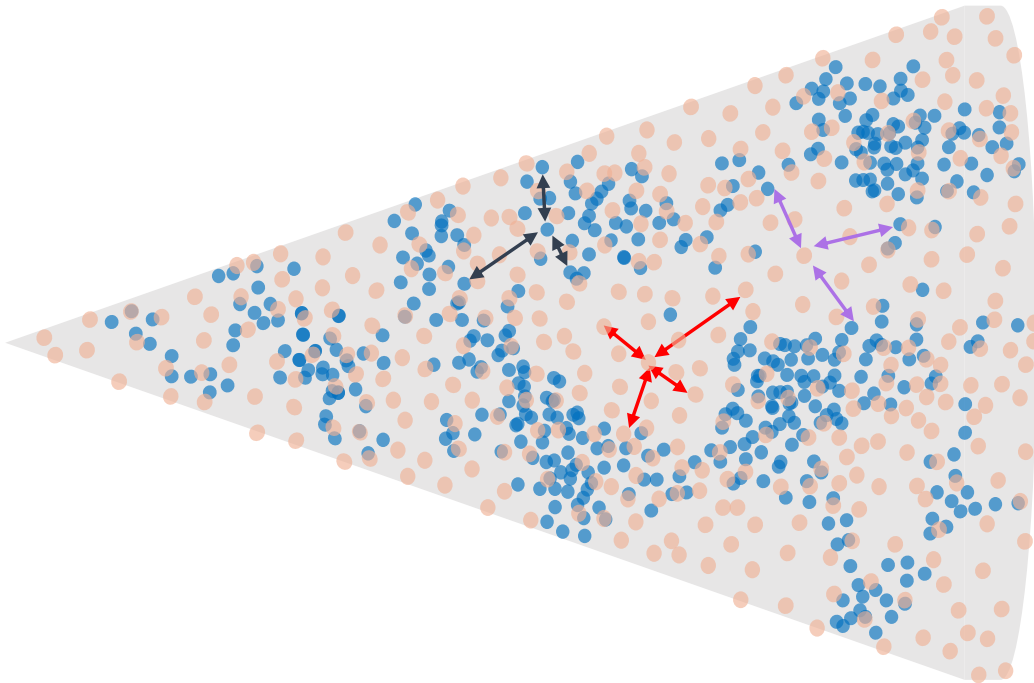


# Large-Scale structure of the Universe





# Large-Scale structure of the Universe



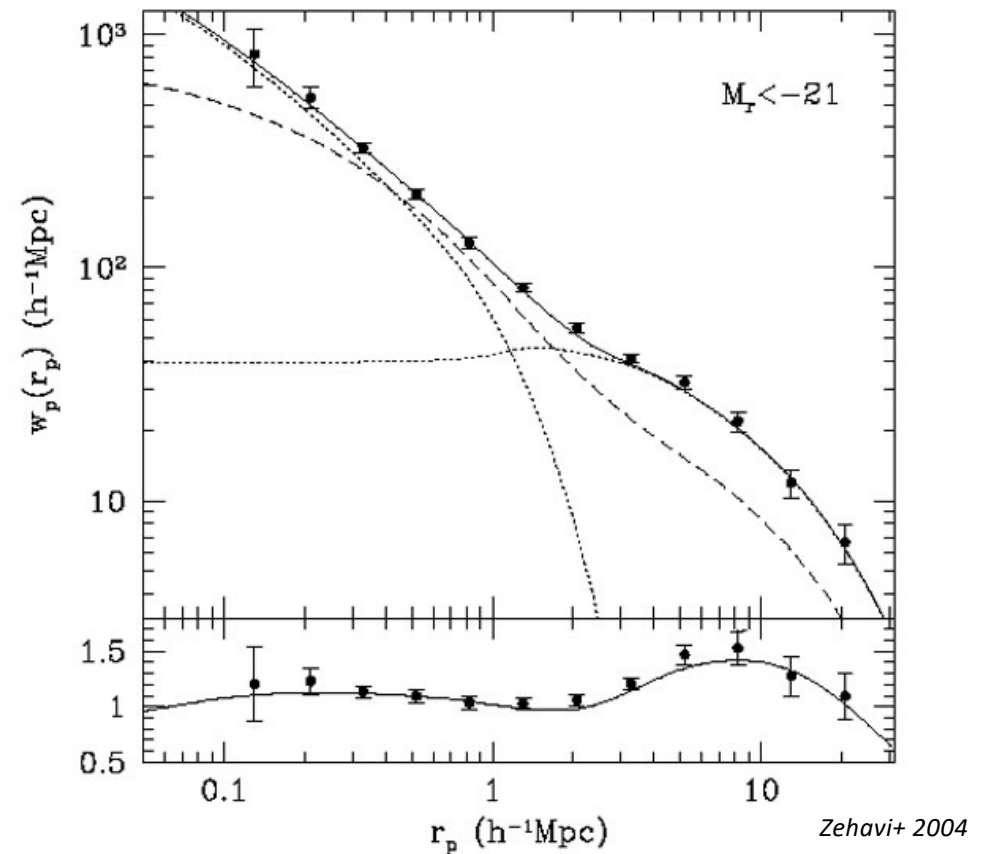
# Large-Scale structure of the Universe


- Galaxies form in **dark matter haloes** and are “**biased**” tracers of the underlying matter (Kaiser+ 1984)
- Can quantify **galaxy bias** by looking at **two-point correlation function** of galaxies and compare to that for the **underlying matter**

$$\text{Galaxy bias, } b_g = \frac{\delta_g}{\delta_M} = \sqrt{\frac{\xi_g}{\xi_M}}$$

Ratio of mean mass density of galaxies c.f. underlying dark matter field

Relates to spatial clustering of galaxies



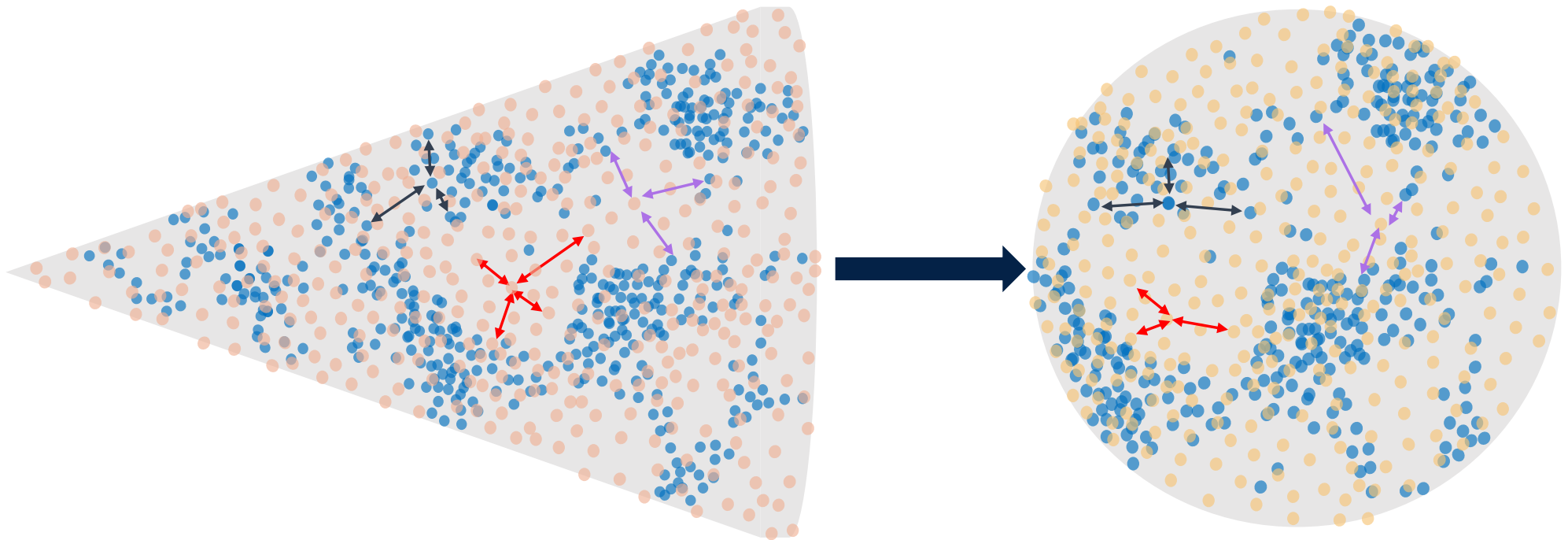


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But radio continuum surveys can't provide redshifts, so we typically rely on photometric redshifts from multi-wavelength catalogues and measure the angular clustering

# Angular Clustering

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# Angular Clustering

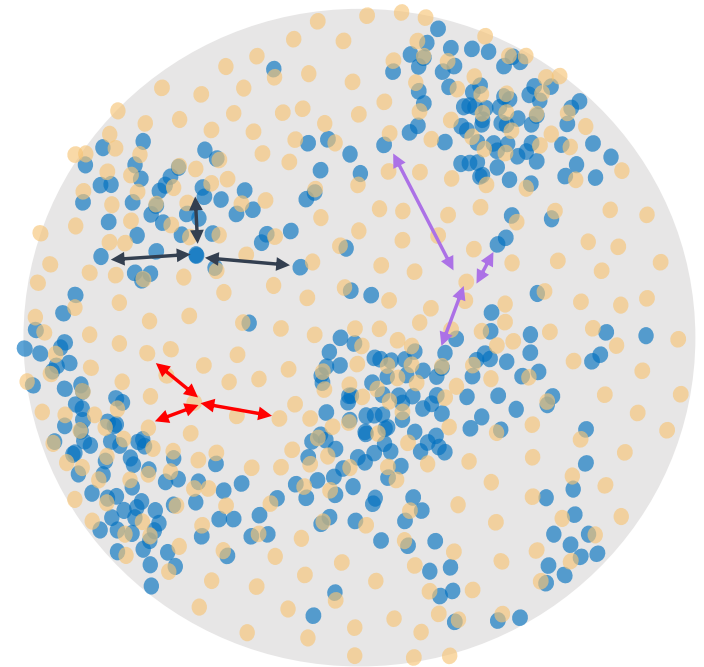
To calculate this we use:

$$\omega(\theta) = \frac{DD(\theta) + RR(\theta) - 2DR(\theta)}{RR(\theta)}$$

*Landy & Szalay 1993*

Normalised pairs of galaxies in the *data* (*randoms* or *data-to-randoms*) in an angular separation

To link angular clustering to galaxy bias we need to know redshift distribution and can use this to de-project the clustering.



# Angular Clustering

To calculate this we use:

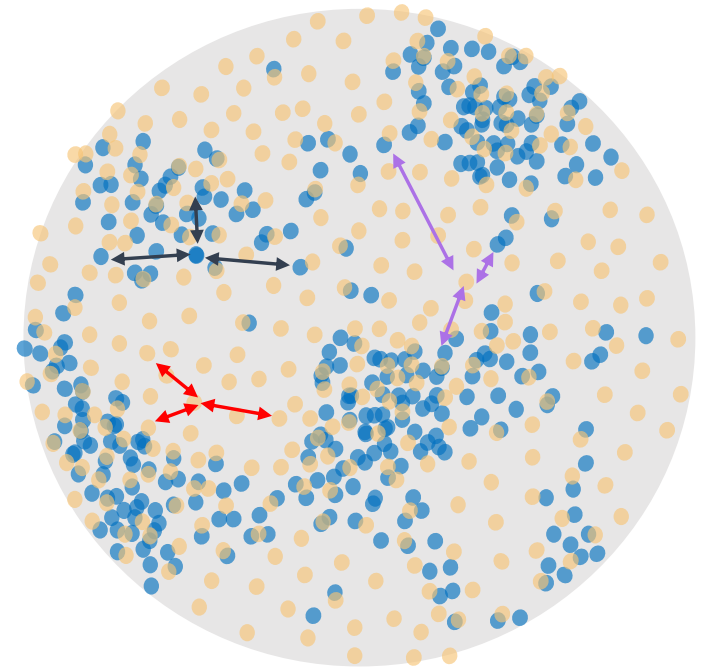
$$\omega(\theta) = \frac{DD(\theta) + RR(\theta) - 2DR(\theta)}{RR(\theta)}$$

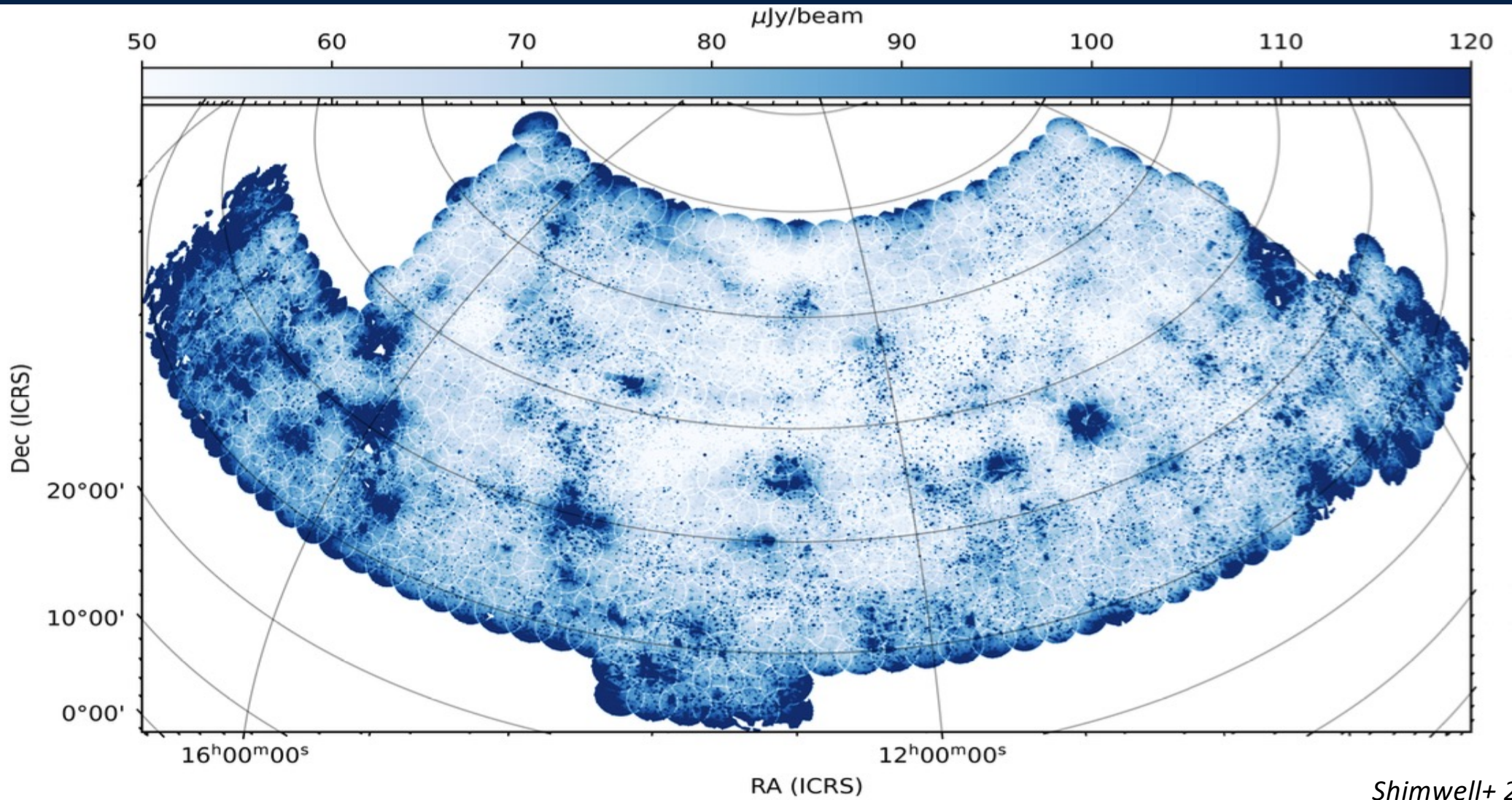
Landy & Szalay 1993

Normalised pairs of galaxies in the *data* (*randoms* or *data-to-randoms*) in an angular separation

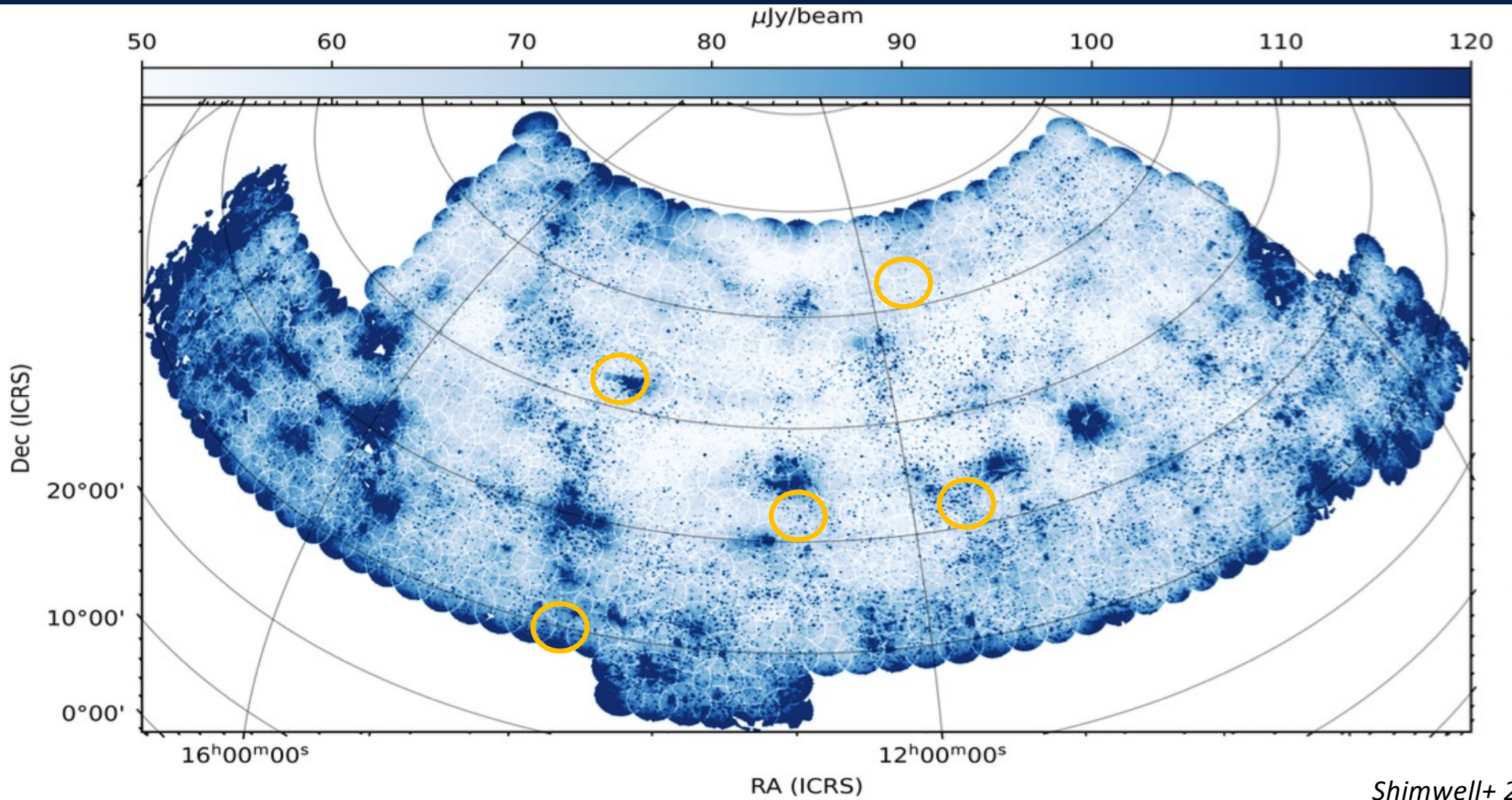
To link angular clustering to galaxy bias we need to know redshift distribution and can use this to de-project the clustering.

Creating accurate random catalogues are crucial to this work!





*Shimwell+ 2022*



Shimwell+ 2022



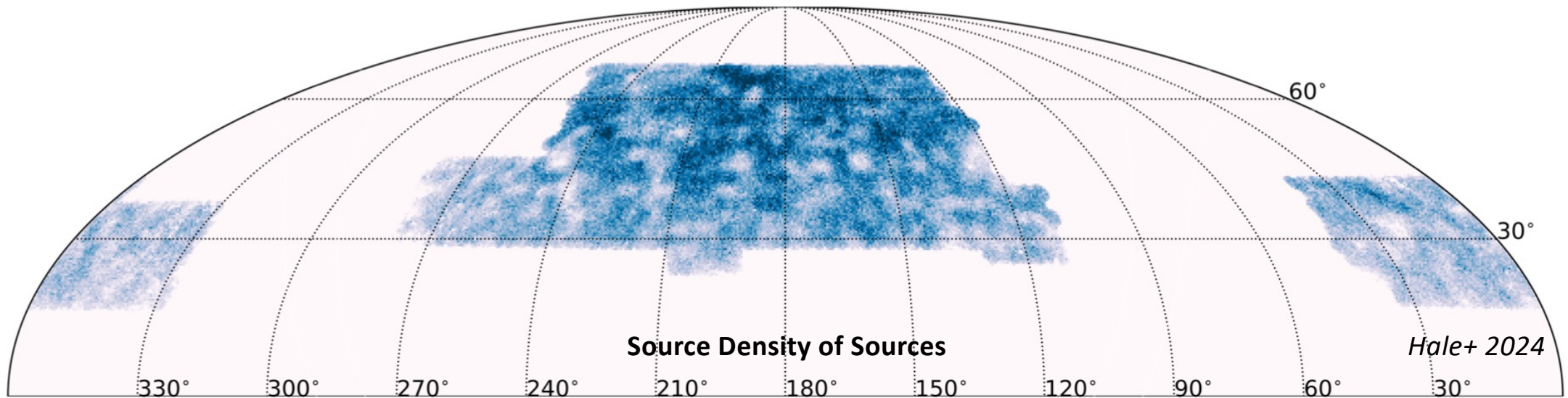
# LOFAR Two-metre Sky Survey (LoTSS) Wide Area

## Data Release 2 (Shimwell+ 2022):

- 5600 sq. degrees
- ~4 million sources
- ~70-100uJy/beam rms

Distribution of sources are very non-Uniform due to a combination of observational factors  
e.g. loss of sensitivity with elevation, bright sources, mosaicking effects.

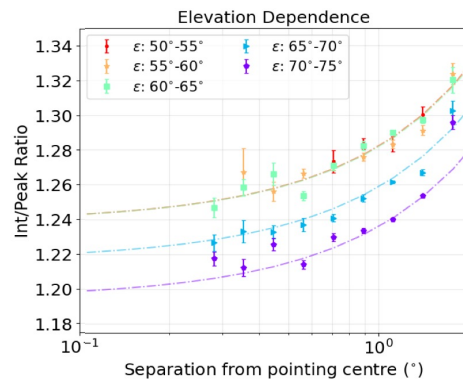
Need to account for such observational biases in the generation of random catalogues



# Systematics to Account For

Take **simulated** catalogues of radio sources and account for:

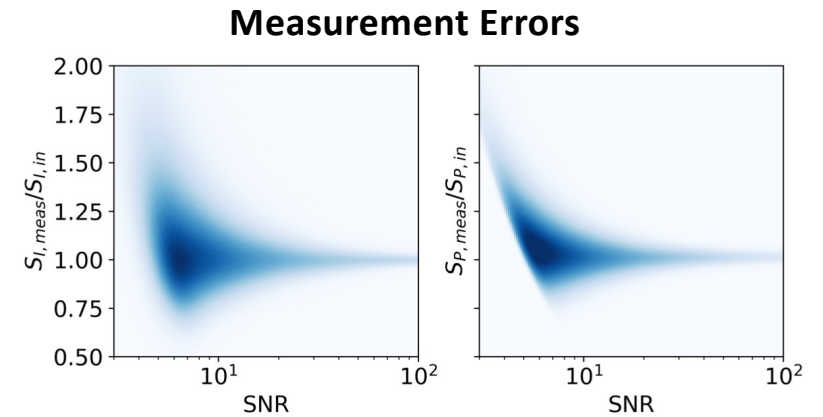
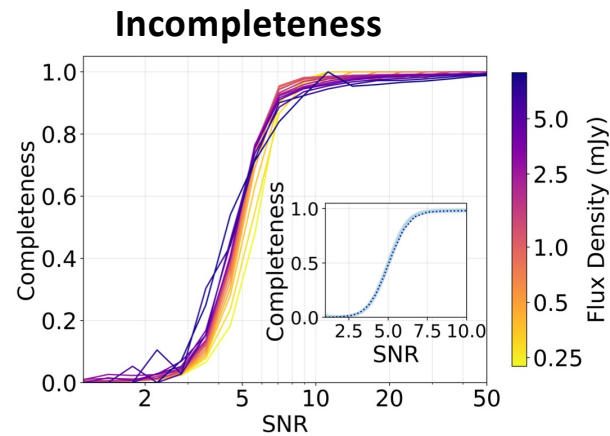
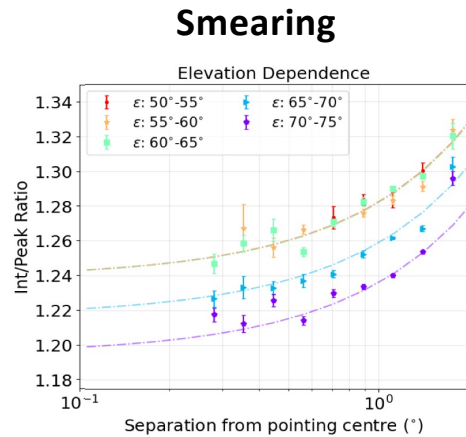
## Smearing



Use comparisons with **FIRST** (Helfand+ 2015) to account for **smearing** in the sources as a function of **elevation**

# Systematics to Account For

Take **simulated** catalogues of radio sources and account for:



Use comparisons with **FIRST** (Helfand+ 2015) to account for **smearing** in the sources as a function of **elevation**

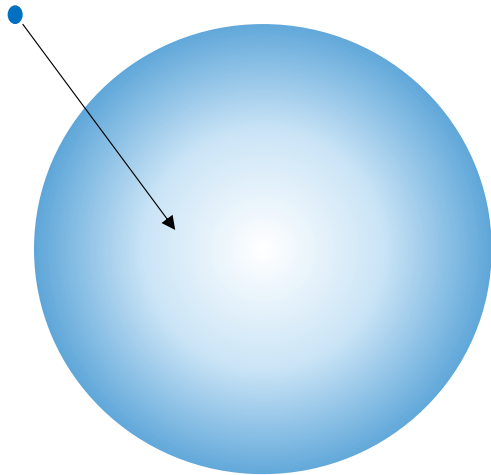
- Use **simulations** from **Shimwell+ 2022** to investigate:
- **Incompleteness** (as a function of SNR)
  - Differences between **simulated** and **measured** flux densities

# Generation of Randoms

---

## 1) **Simulated** radio source

- Integrated and peak **flux density** from Wilman+ 2008
- Assign **random position** in the DR2 area
- Obtain **rms** from **map**

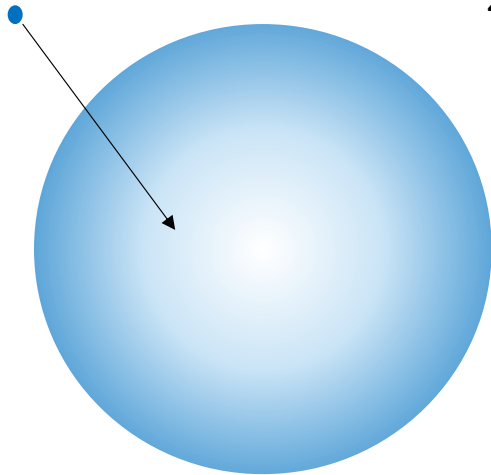


# Generation of Randoms

---

## 1) **Simulated** radio source

- Integrated and peak **flux density** from Wilman+ 2008
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- Obtain **rms** from **map**



## 2) Apply **systematics**

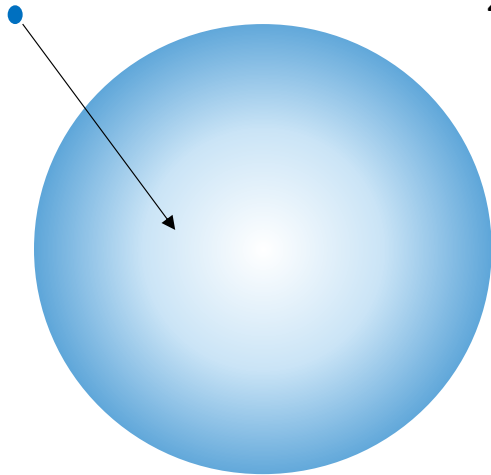
- Use **smearing** vs **elevation** to determine the peak flux density of the source
- Use this to obtain a **SNR** of the source
- Measure the **completeness** and sample to determine if the source is **detected**
- For detected sources determine the **measured** integrated and peak **flux densities**

# Generation of Randoms

---

## 1) **Simulated** radio source

- Integrated and peak **flux density** from Wilman+ 2008
- Assign **random position** in the DR2 area
- Obtain **rms** from **map**



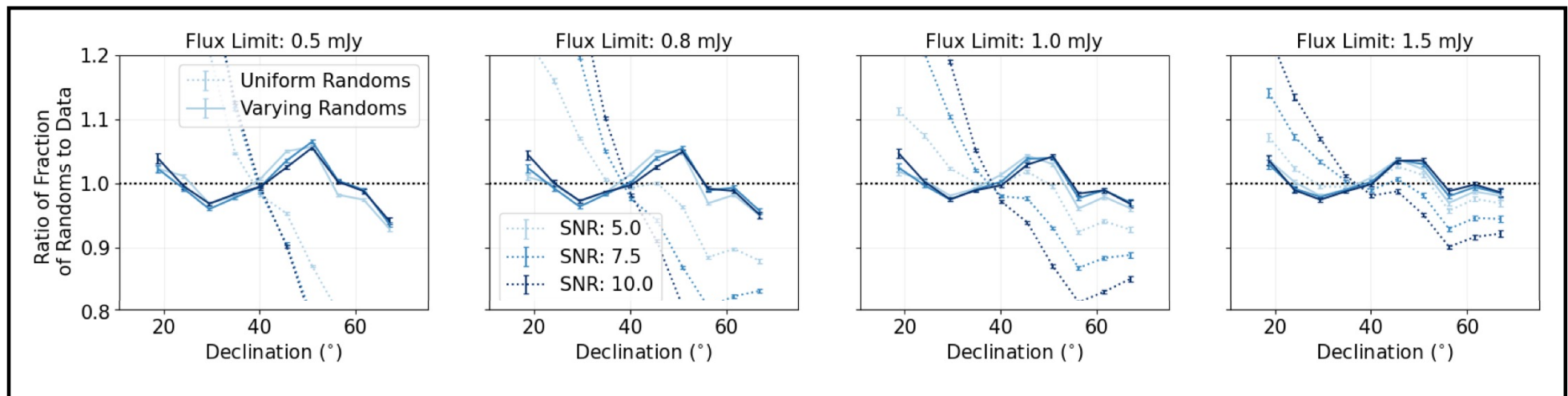
## 2) Apply **systematics**

- Use **smearing** vs **elevation** to determine the peak flux density of the source
- Use this to obtain a **SNR** of the source
- Measure the **completeness** and sample to determine if the source is **detected**
- For detected sources determine the **measured** integrated and peak **flux densities**

## 3) Apply **additional** cuts

- Apply additional **SNR** and flux density cuts on the **measured properties** and the data

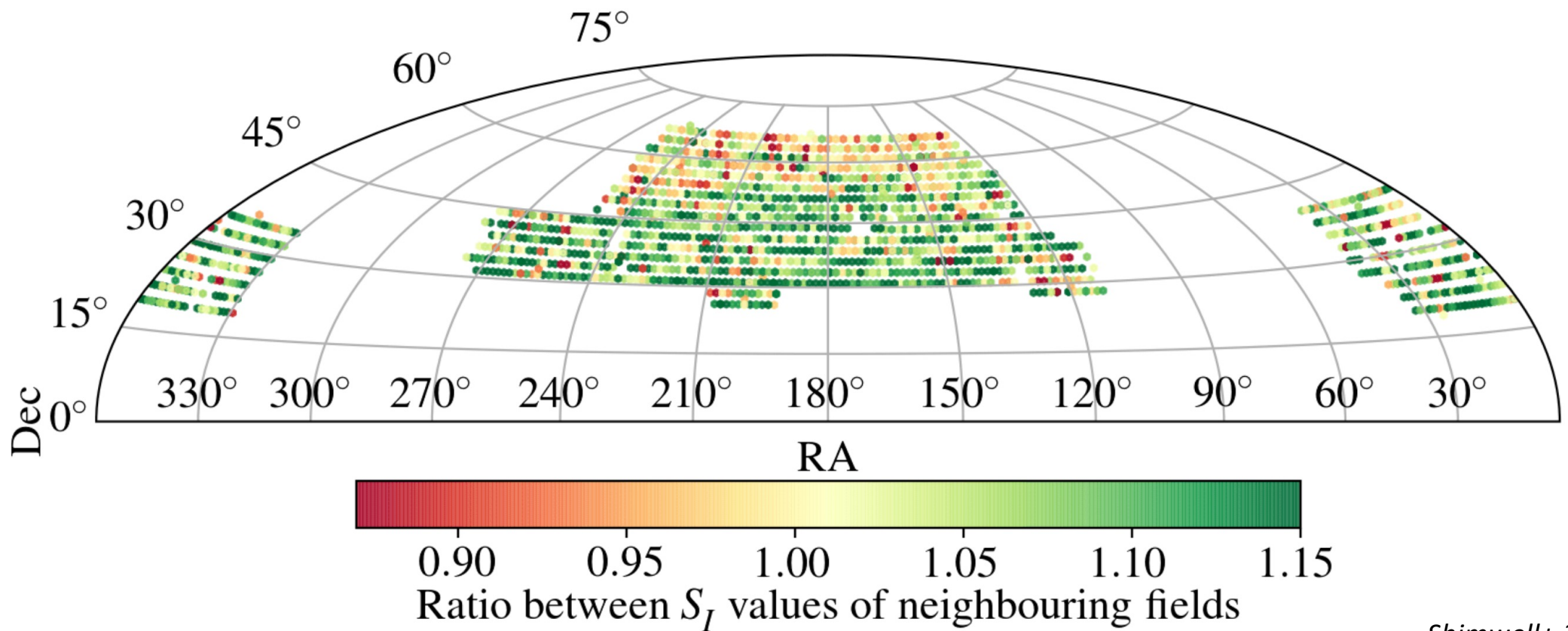
# Simulated Random Catalogues



Dotted lines = Random sources uniformly distributed (i.e. not accounting for systematics)

Solid lines = Random sources accounting for systematics

# Flux Density Scale



*Shimwell+ 2022*

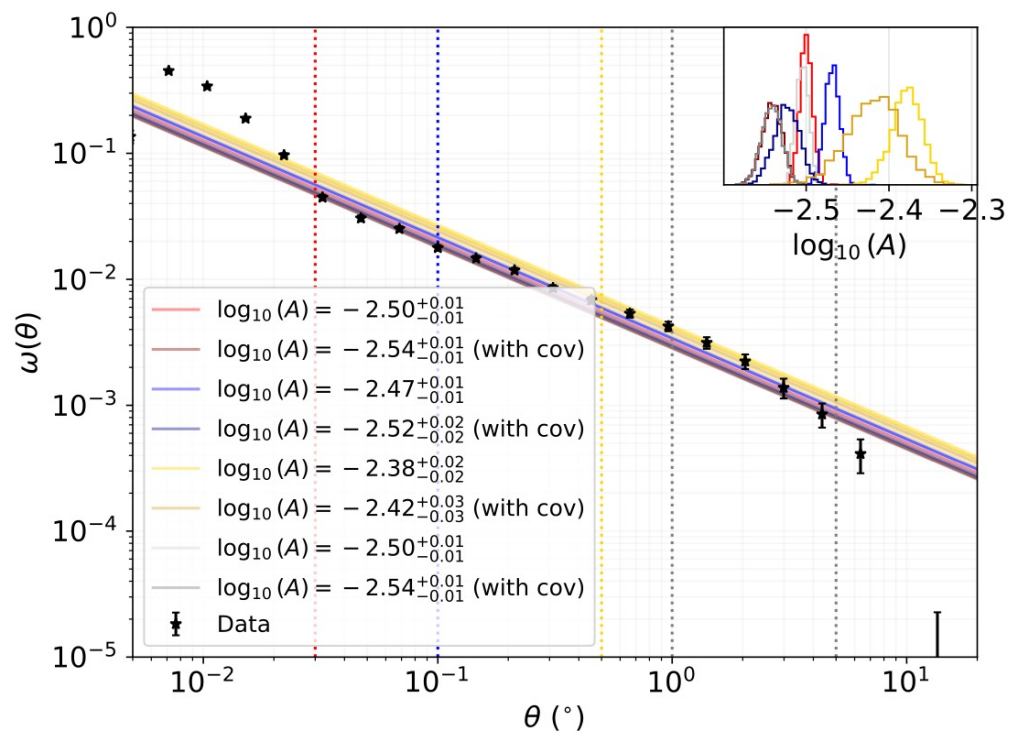




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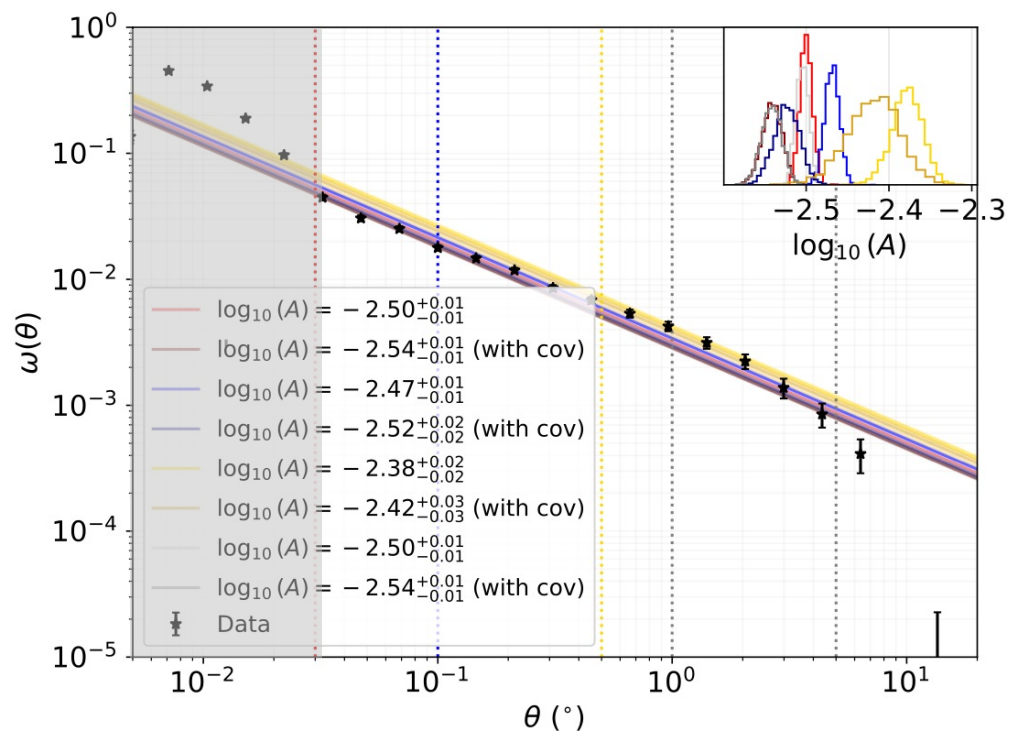
# Cosmology Studies with LoTSS-DR2

# Angular Two-Point Correlation Function (Hale+ 2024)



$\geq 1.5$  mJy,  $\geq 7.5\sigma$

# Angular Two-Point Correlation Function (Hale+ 2024)



$\geq 1.5$  mJy,  $\geq 7.5\sigma$

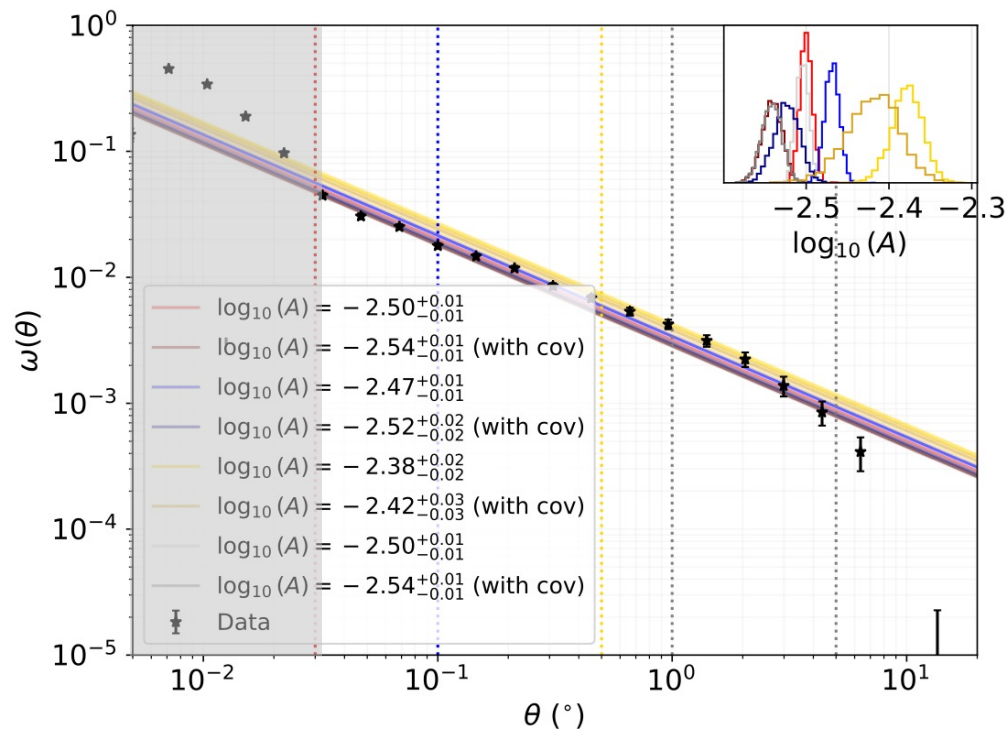
At the smallest angular scales there is an uptick in the angular two-point correlation function

This likely has a significant contribution from multi-component radio sources.

The value-added catalogue (Hardcastle+ 2023, i.e. with cross-matched multi-component sources) is for  $>8$  mJy sources.

Therefore, cannot fit below  $\sim 0.03$  degree.

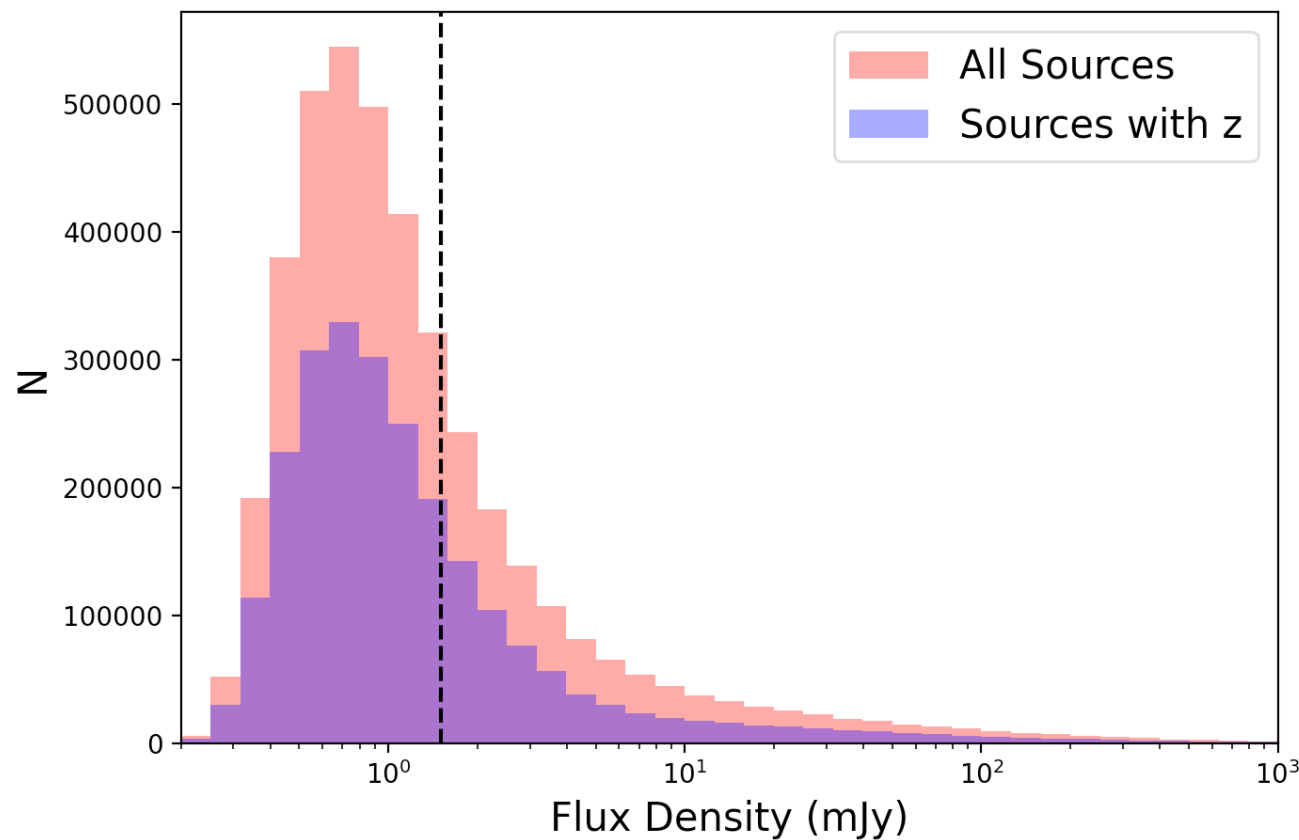
# Angular Two-Point Correlation Function (Hale+ 2024)



+ Use Redshift Distributions to model the clustering and infer galaxy bias using PyCCL (Chisari+ 2019)

$\geq 1.5$  mJy,  $\geq 7.5\sigma$

# Redshift Distribution of Sources



Cross-matched catalogue from Hardcastle+ 2023 provides host ID and redshifts for a large fraction of sources

40-50% of sources do not have redshifts

We don't know how these may be preferentially biased e.g. are we missing high redshift sources, or certain populations

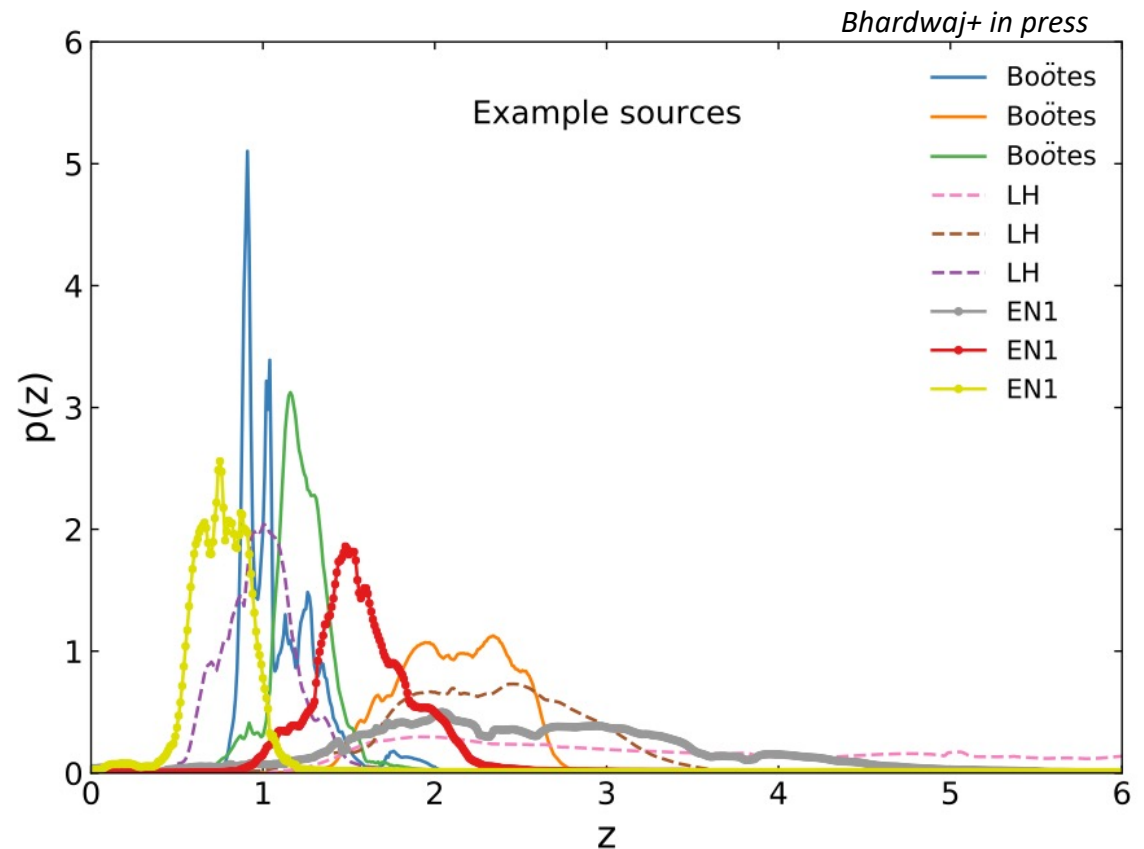
We therefore use the more complete LOFAR Deep Fields data (Duncan+ 2022)

# Redshift Distribution of Sources

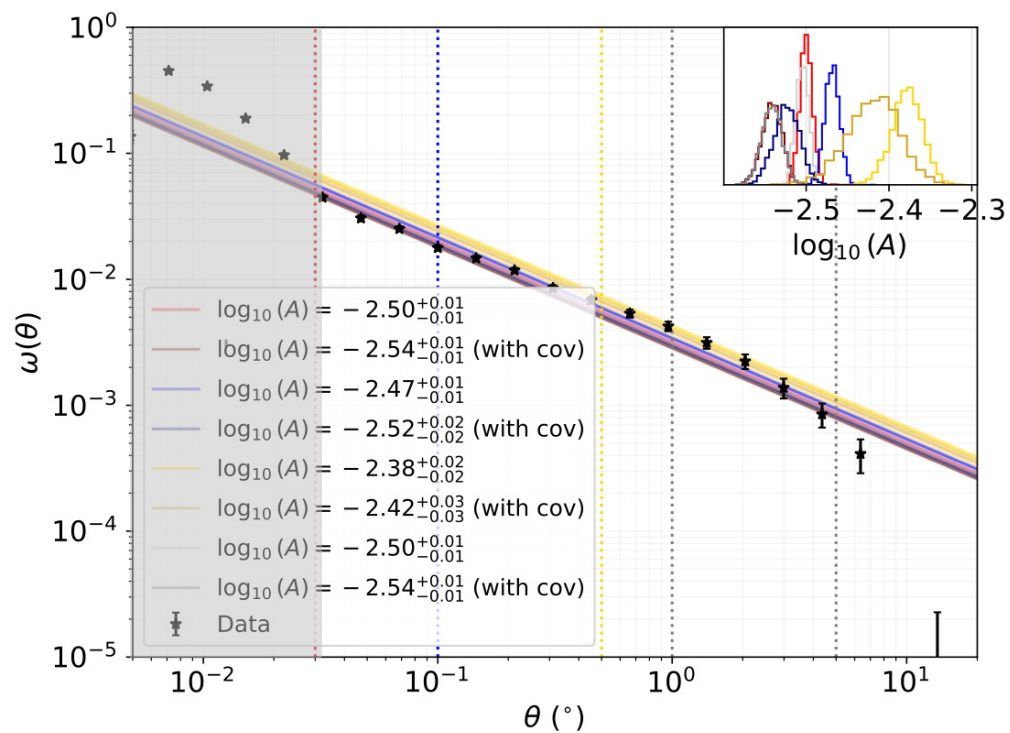
Deep Fields data have **Z\_Best** values in the catalogues but can have **wide ranging p(z)** distribution.

Therefore, we create **resampled full p(z)** by random sampling from the p(z) of the sources in the three fields which are above the flux limit being considered.

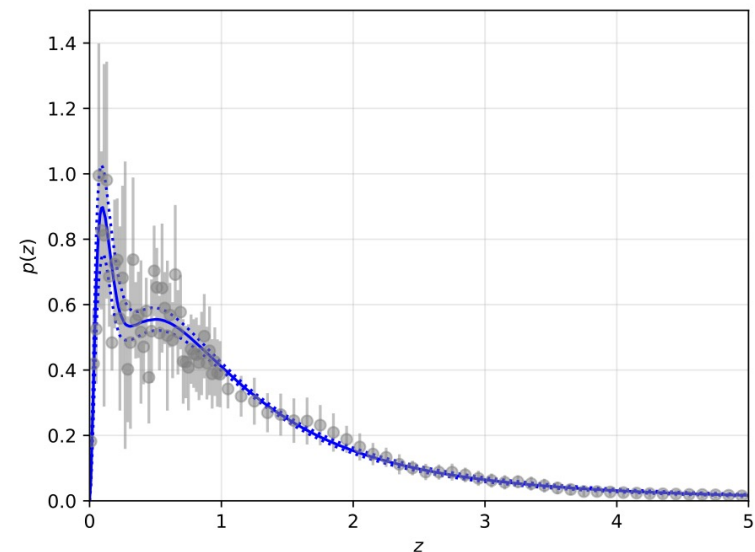
We **repeat** this numerous times and use the spread in the p(z) to give **uncertainties** to the p(z).



# Angular Two-Point Correlation Function (Hale+ 2024)

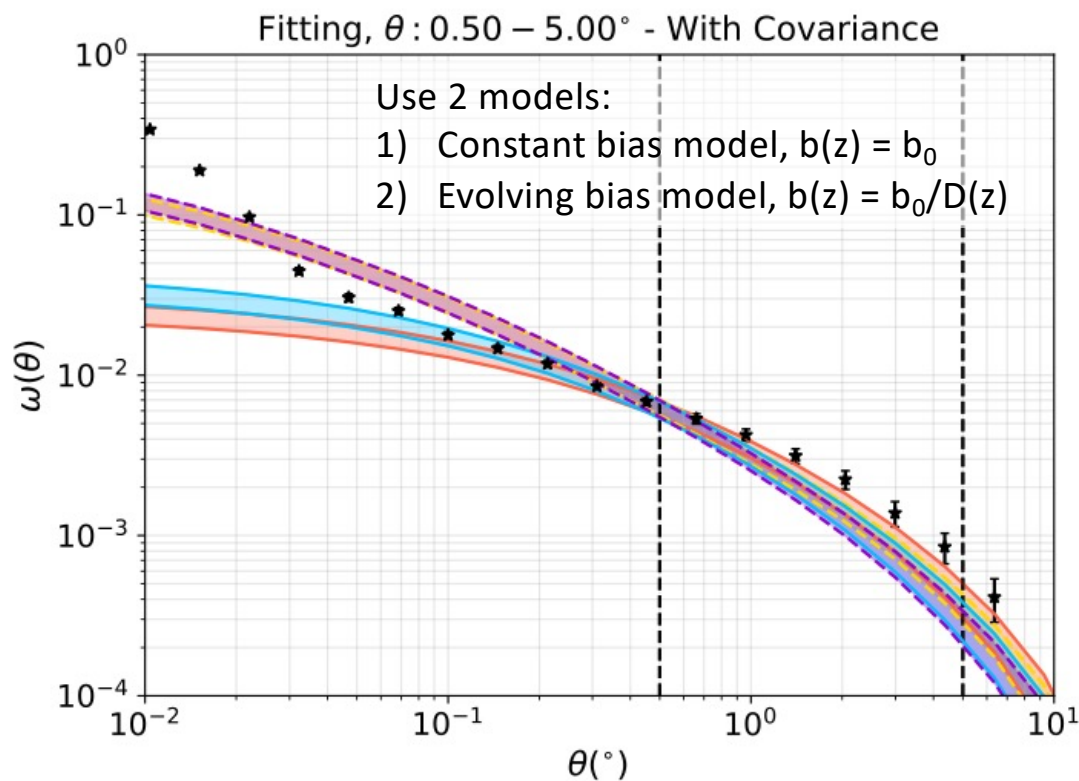


+ Use Redshift Distributions to model the clustering and infer galaxy bias using PyCCL (Chisari+ 2019)

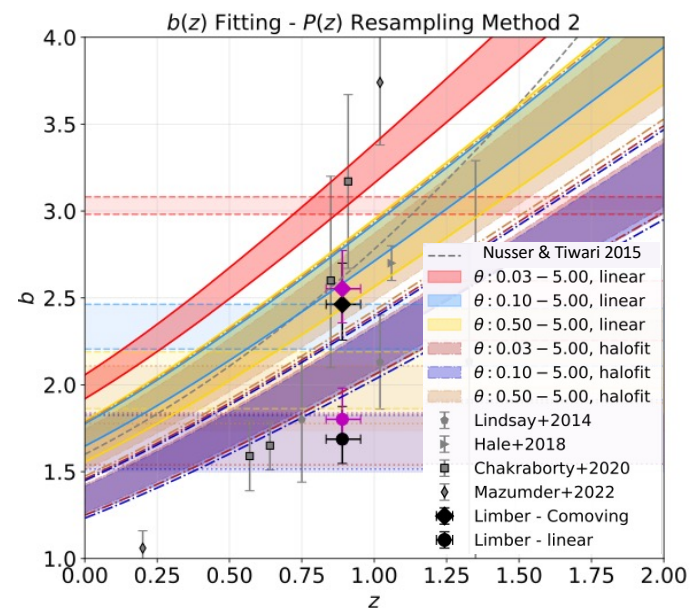


$\geq 1.5$  mJy,  $\geq 7.5\sigma$

# Angular Two-Point Correlation Function (Hale+ 2024)



To agree with  $N(z)$  predictions from previous cross correlations with CMB (Alonso+ 2020) we must have evolving bias model



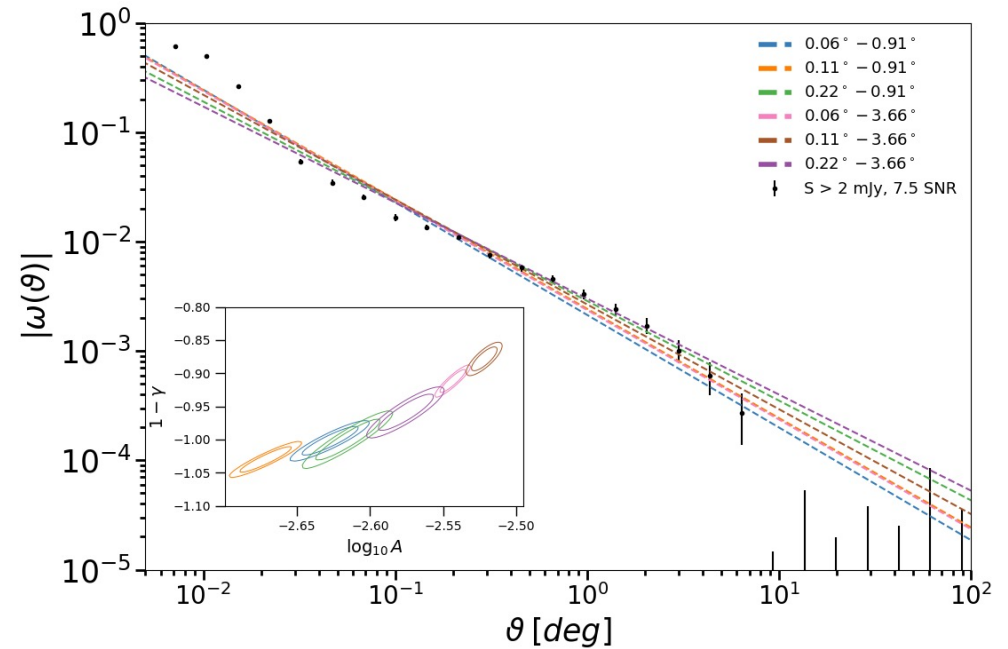
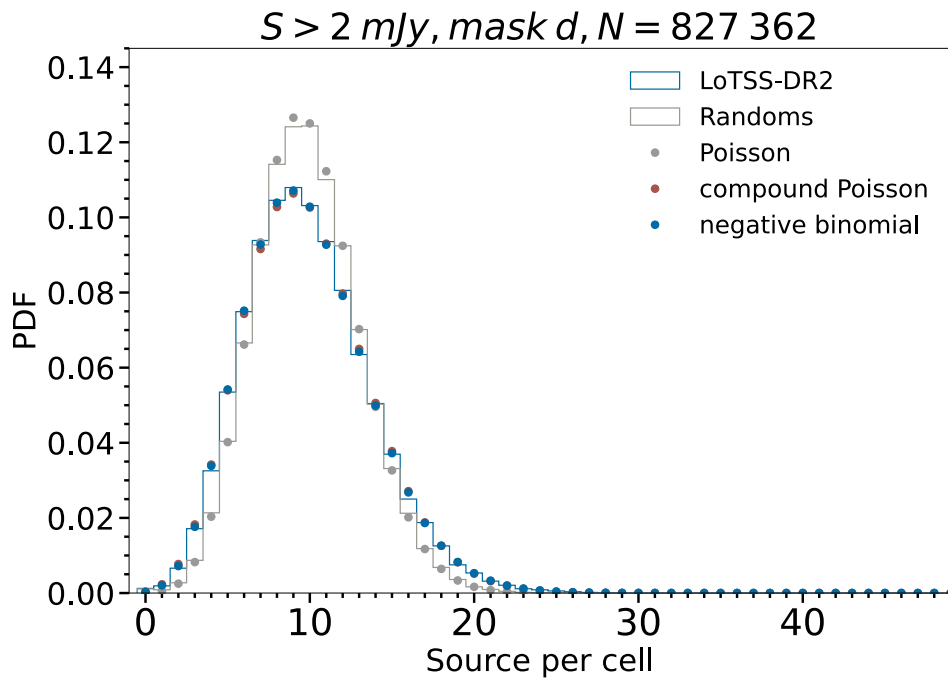


# One-point statistics (Pashapour-Ahmadabadi et al. in prep)

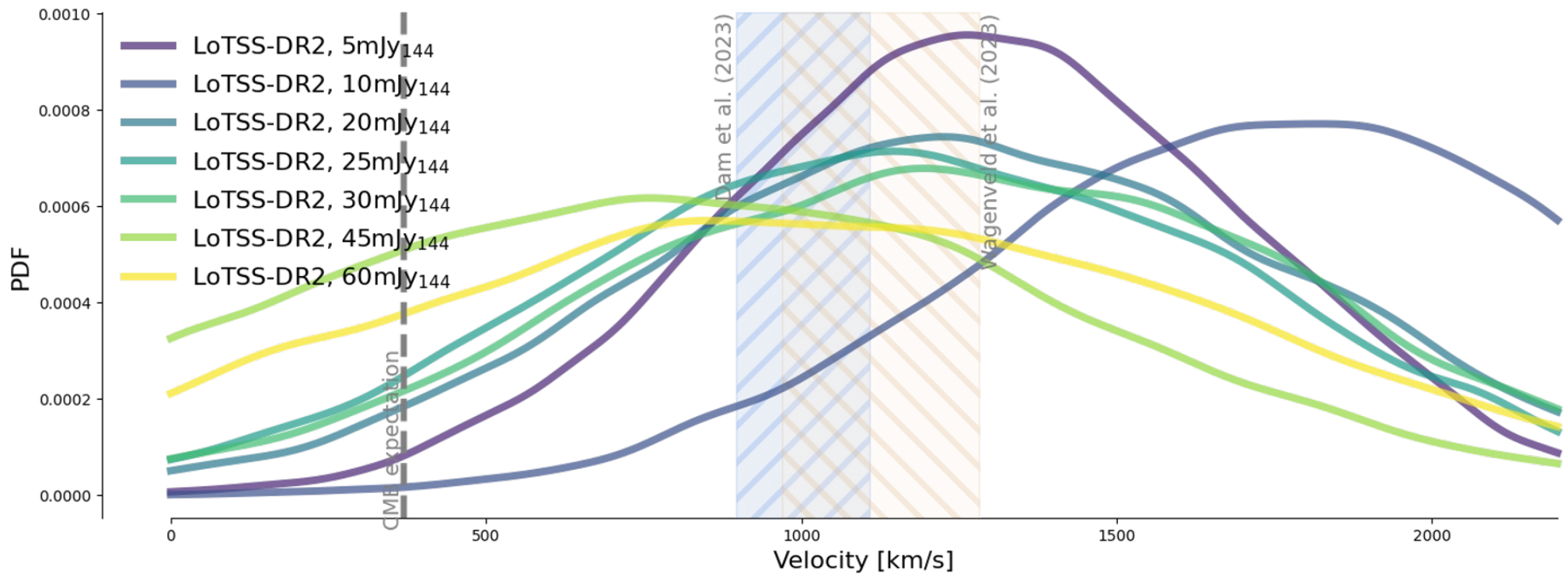
Use the counts of radio sources in cells to investigate the distribution of sources and see it is not well modelled by a Poisson process alone.

Can use counts in cell to estimate the angular clustering, assuming a power law

See Morteza's poster in the coffee/lunch breaks!

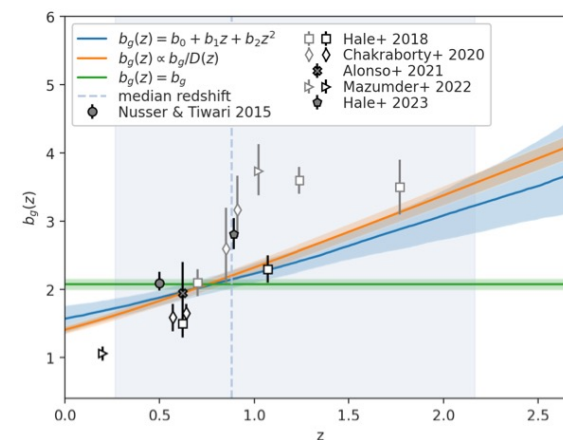
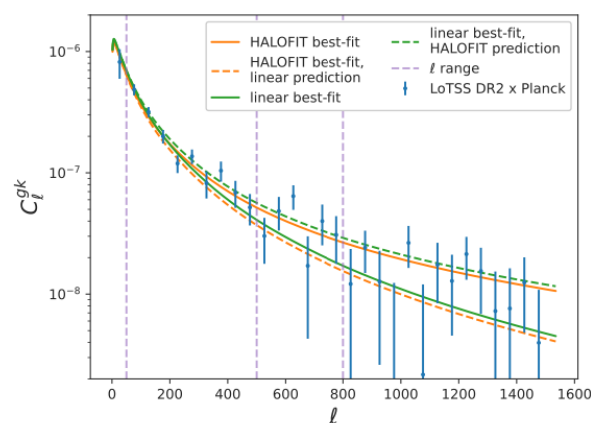
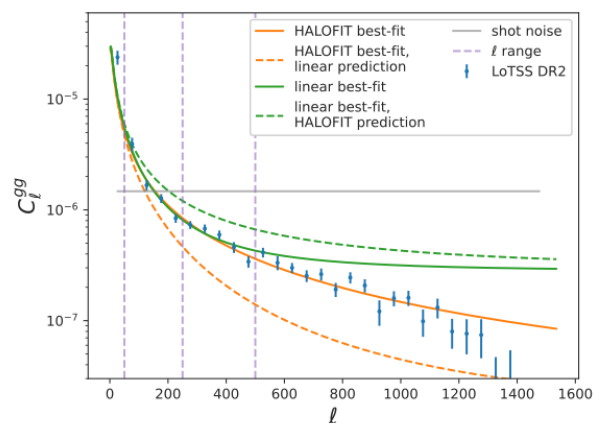


# Radio Dipole (Böhme+ in prep)

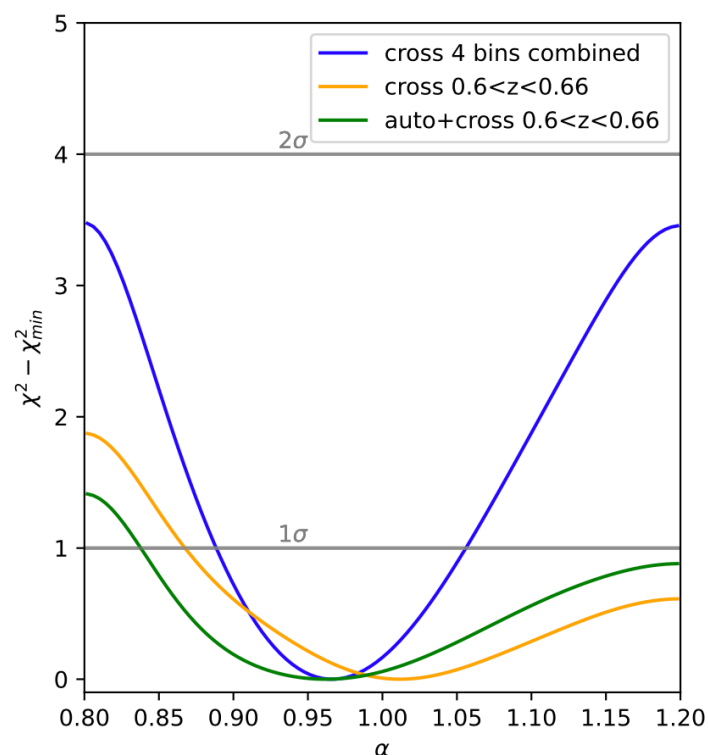


# Cross-Correlation with CMB (Nakoneczny+ 2024)

- Combine LoTSS-DR2 with **CMB lensing maps** from Planck (Planck Collaboration+ 2020) to measure **power spectrum**
- Use this to place constraints on **bias evolution models** by using cross correlations helping to avoid any potential remaining systematics in the radio data.
- By fixing certain parameters, was also able to place constraints on  $\sigma_8$



# Cross-correlating with eBOSS (Zheng+ in prep)



(Represents how the BAO wiggles in the power spectrum shift with scale)

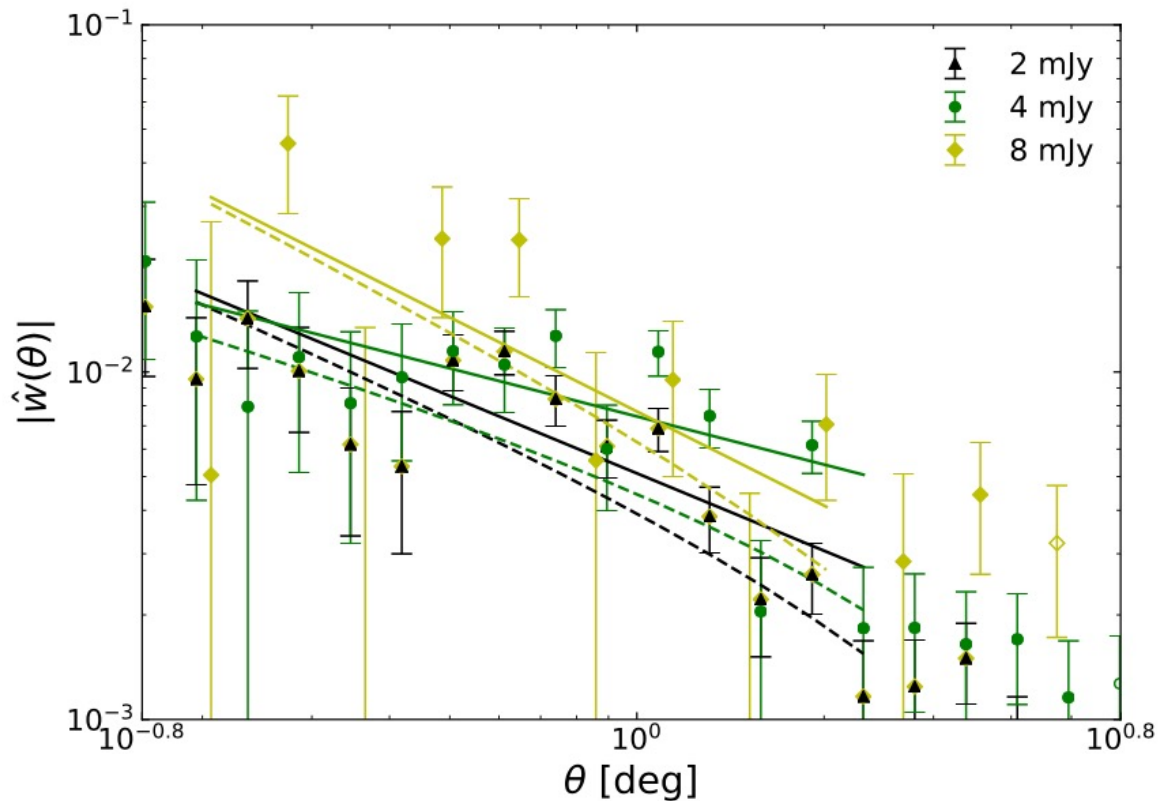
Cross-correlate **luminous red galaxies** from **eBOSS** (Ross+ 2020) with LoTSS-DR2 in different eBOSS redshift bins

Use this to put constraint on the **angular BAO parameter** and **bias evolution**

Using cross-correlations helps **reduce systematics** in both fields and improve constraints on cosmological parameters

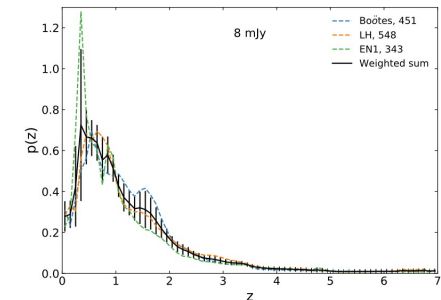
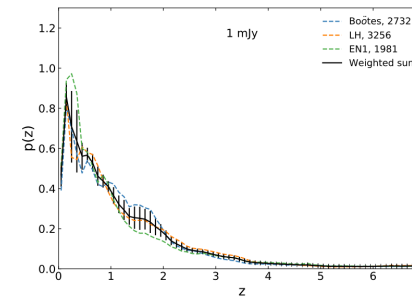
Jinglan presented this earlier in the week!

# Flux Dependent Clustering (Bhardwaj+ in press)



Investigate the flux dependent clustering of LoTSS DR1 using the cosmological analysis of Siewert+ 2020.

Using the method to obtain redshift distributions from resampling the  $p(z)$  this can see how spatial clustering models varies with flux density



# Limitations in bias constraints from LoTSS-DR2

# Limitations in bias constraints from LoTSS-DR2

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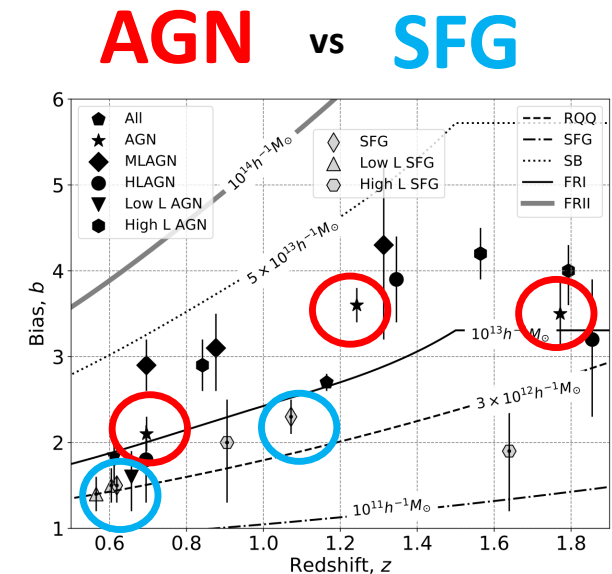
The study into the angular clustering relies on a number of assumptions:

- 1) The bias evolves using one of the two models considered
- 2) The SFGs and AGN have similar bias evolution over time

# Limitations in bias constraints from LoTSS-DR2

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- 1) The bias evolves using one of the two models considered
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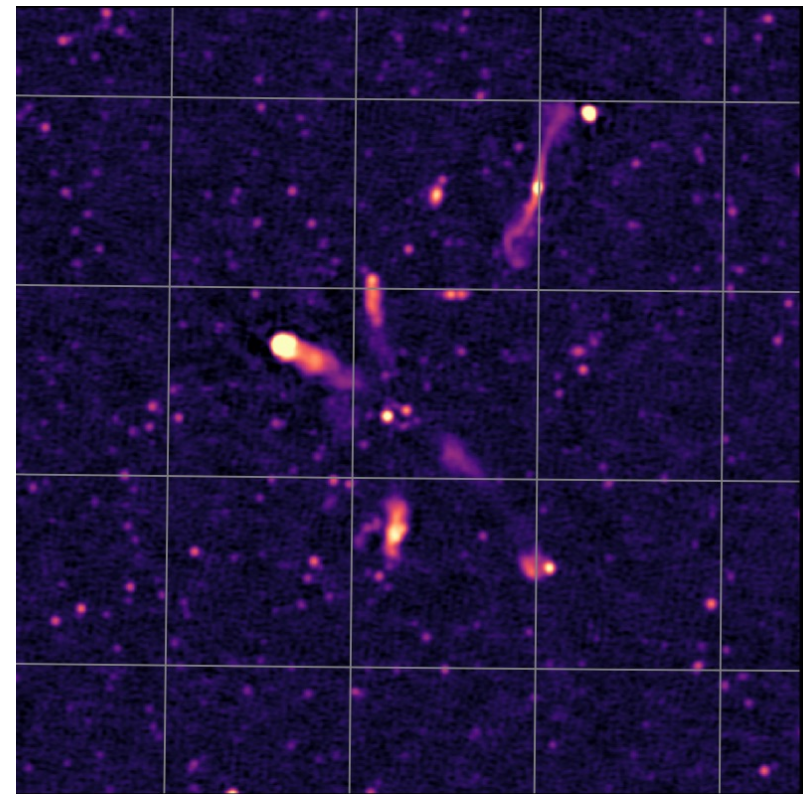
Hale+ 2018



# LOFAR Deep Fields

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- Deep ( $\sim 20\text{-}30$   $\mu\text{Jy}/\text{beam}$ ) observations over 3 deep fields: ELAIS-N1, Lockman Hole, Boötes (Sabater+ 2021, Tasse+ 2021)
- Source association presented in Kondapally+ 2021
- Redshifts/Stellar masses in Duncan+ 2021
- Source Classifications in Best+ 2023

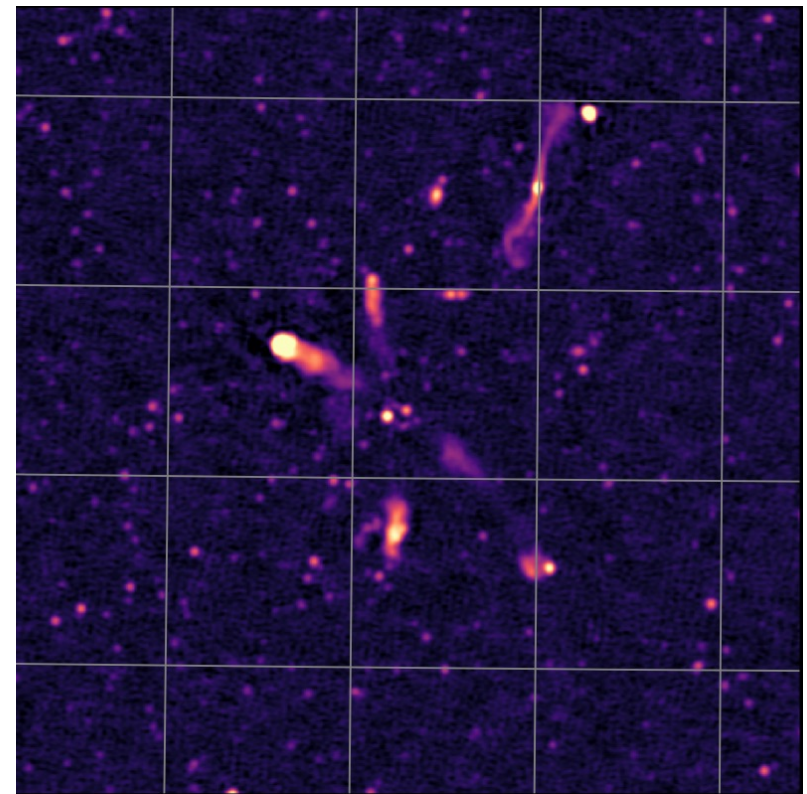


# LOFAR Deep Fields

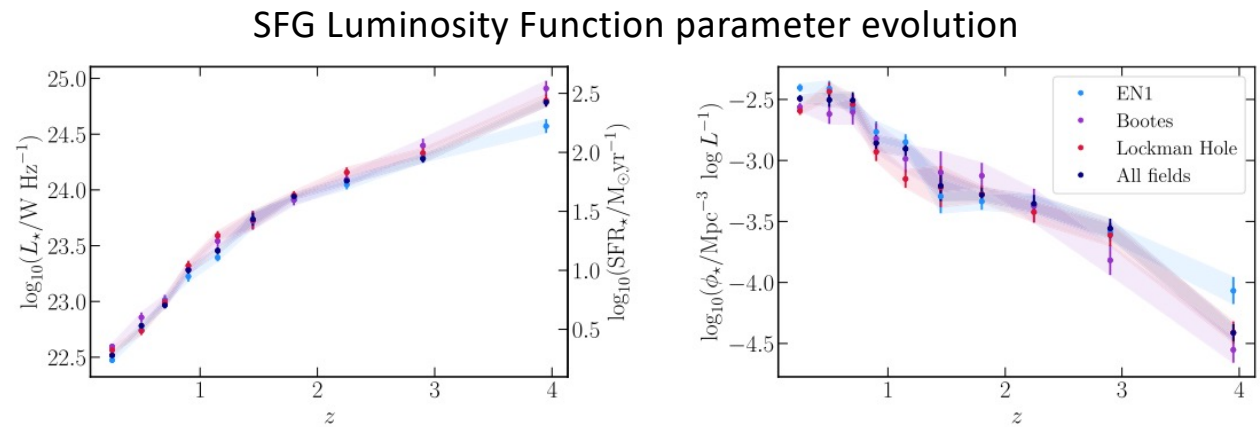
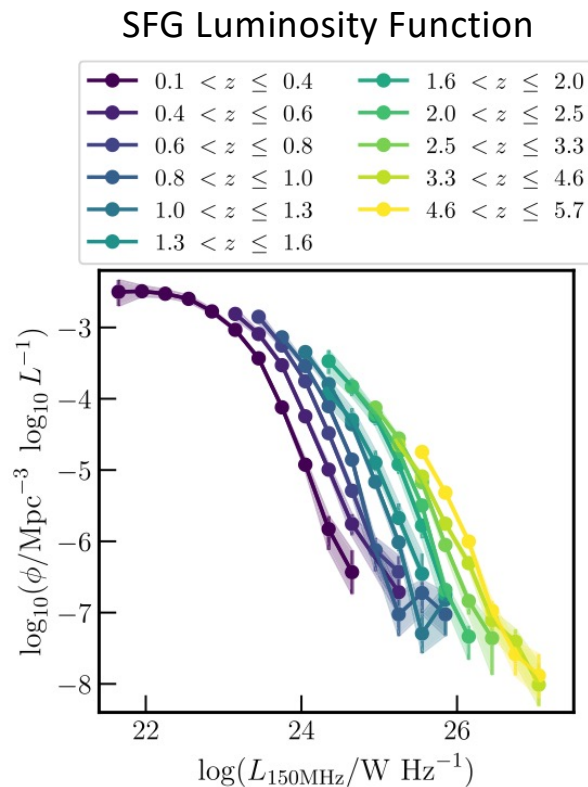
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- Source association presented in Kondapally+ 2021
- Redshifts/Stellar masses in Duncan+ 2021
- Source Classifications in Best+ 2023

No small-scale clustering from multi-component sources, only 1-halo

Split source populations and investigate bias evolution



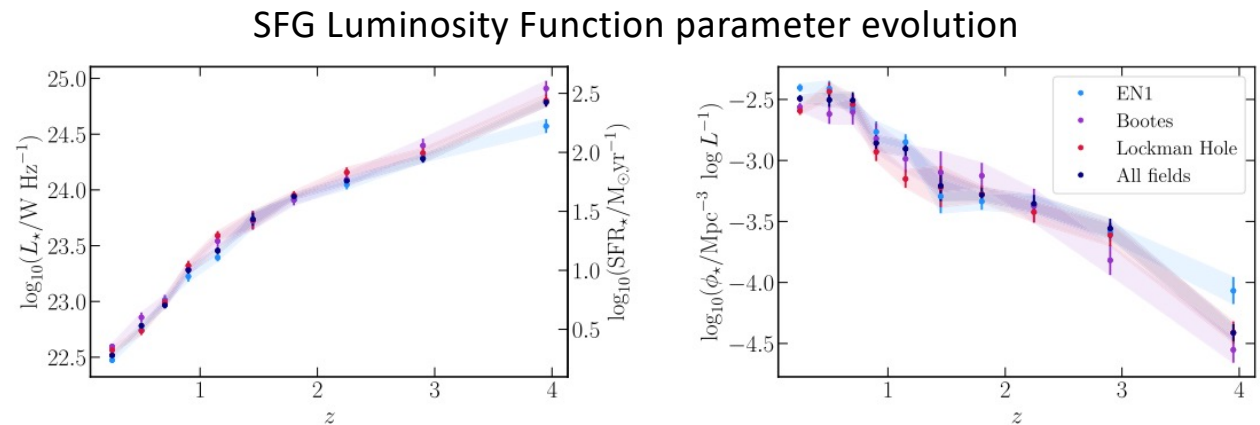
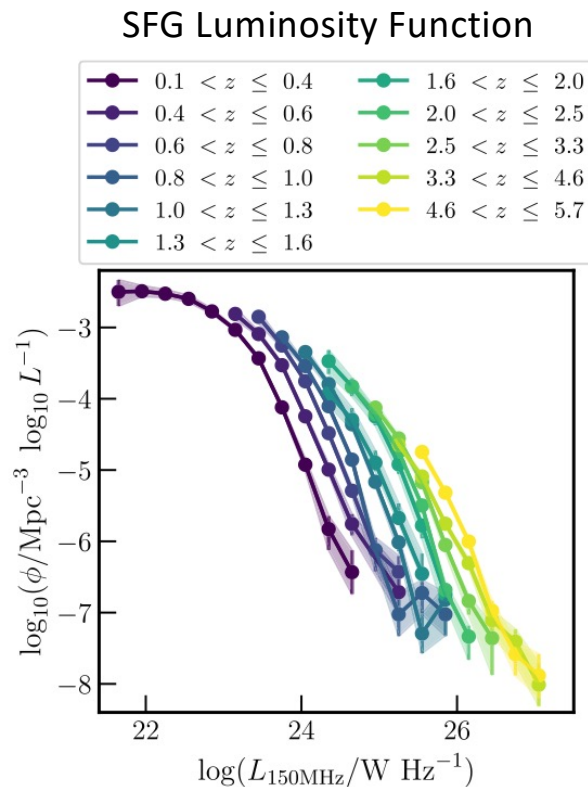
# Randoms per Source Type



- Use modelling of **LOFAR luminosity function (LF)**; Kondapally+ 2022, Cochrane+ 2023) parameters to construct LFs in small  $z$  bins ( $dz = 0.025$ )

Figures from Cochrane+ 2023

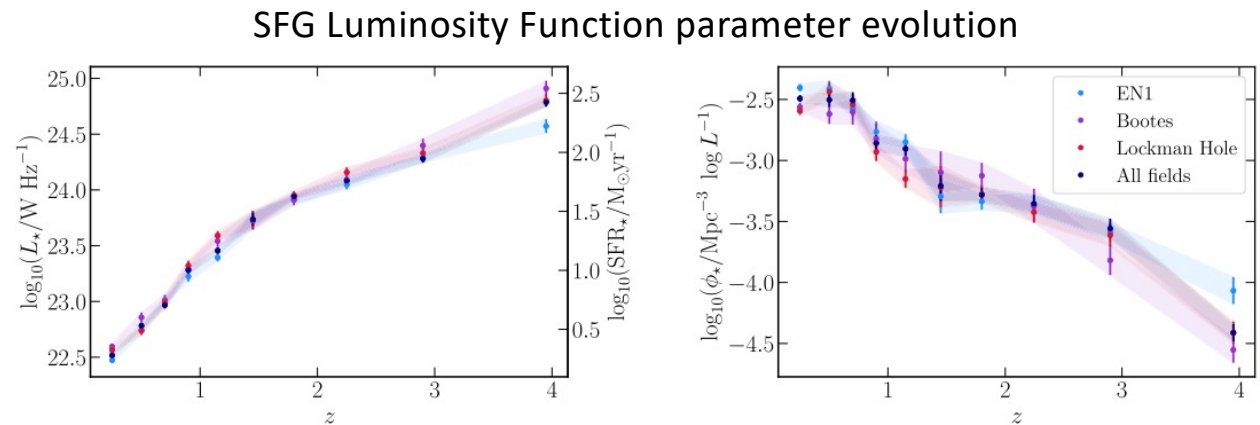
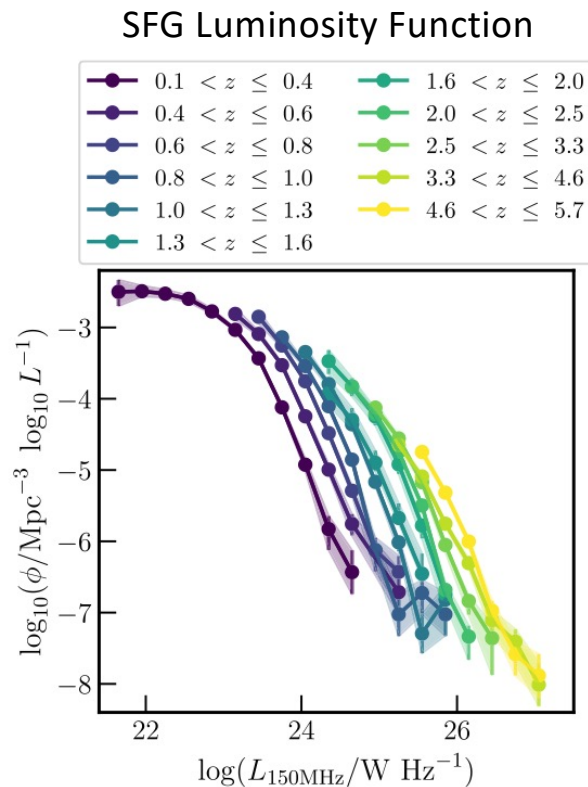
# Randoms per Source Type



- Use modelling of **LOFAR luminosity function (LF; Kondapally+ 2022, Cochrane+ 2023)** parameters to construct LFs in small  $z$  bins ( $dz = 0.025$ )
- **Down sample** the LF from the input random catalogue so they agree with **the model LF**

Figures from Cochrane+ 2023

# Randoms per Source Type

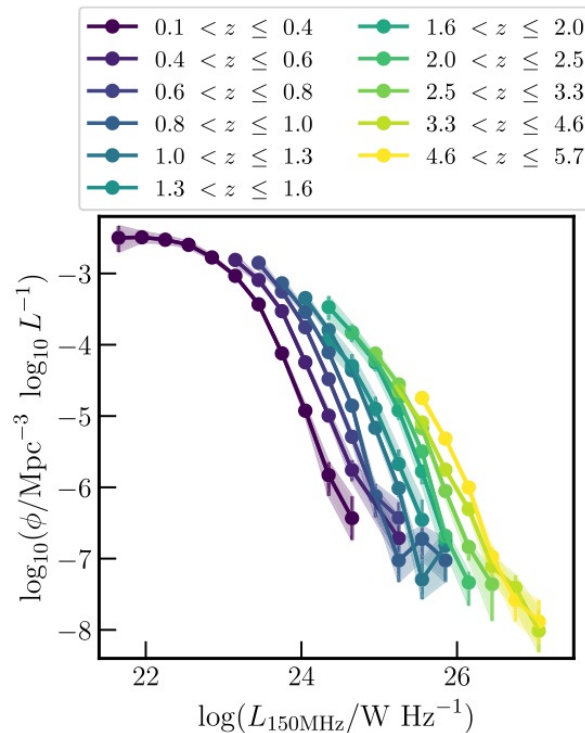


- Use modelling of **LOFAR luminosity function (LF)**; (Kondapally+ 2022, Cochrane+ 2023) parameters to construct LFs in small z bins ( $dz = 0.025$ )
- **Down sample** the LF from the input random catalogue so they agree with **the model LF**
- **Combine** the z bins together to get randoms over the **full z range** ( $dz = 0.2-0.5$  depending on source type)

Figures from Cochrane+ 2023

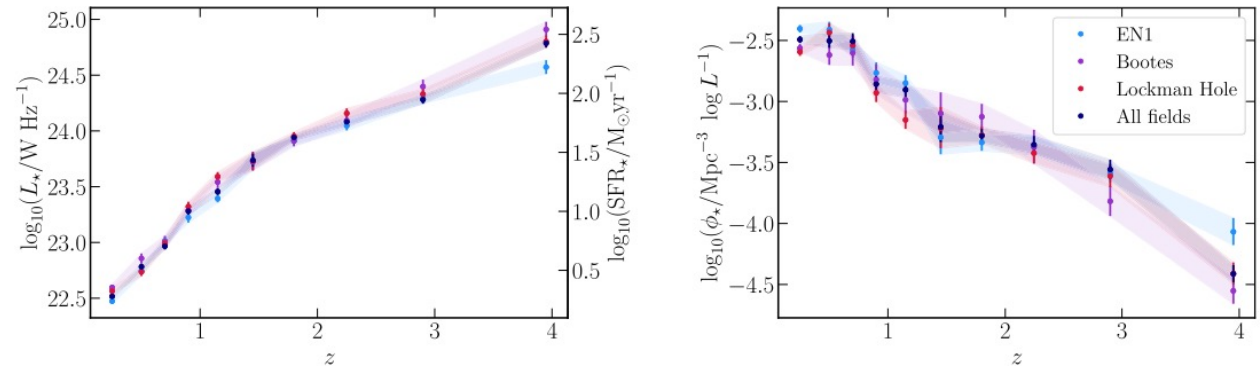
# Randoms per Source Type

SFG Luminosity Function



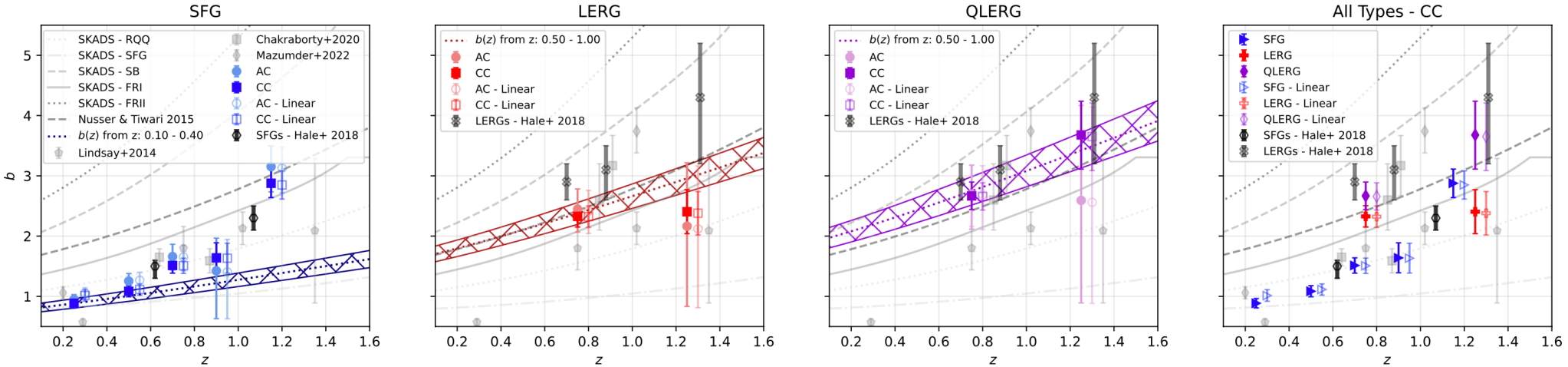
Figures from Cochrane+ 2023

SFG Luminosity Function parameter evolution



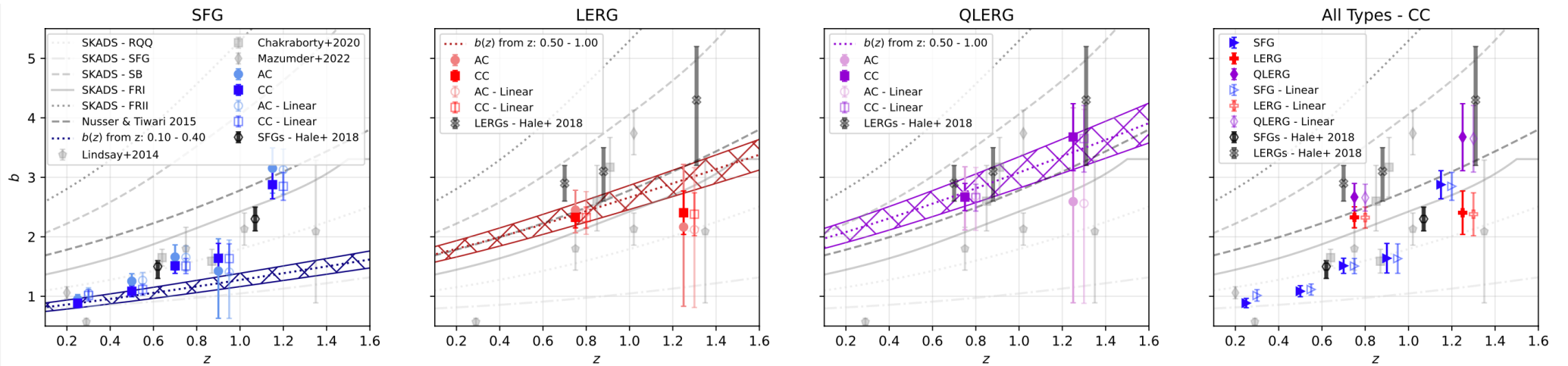
- Use modelling of **LOFAR luminosity function (LF)**; Kondapally+ 2022, Cochrane+ 2023) parameters to construct LFs in small  $z$  bins ( $dz = 0.025$ )
- **Down sample** the LF from the input random catalogue so they agree with **the model LF**
- **Combine** the  $z$  bins together to get randoms over the **full  $z$  range** ( $dz = 0.2-0.5$  depending on source type)
- Gives **input source distribution** with the **LF,  $n(z)$  and  $dN/dS$**  which matches the intrinsic distribution for the given source type in the  $z$  bin

# Results



**LERGs appear more clustered than SFGs and quiescent LERGs more clustered than full LERG population.**

# Results

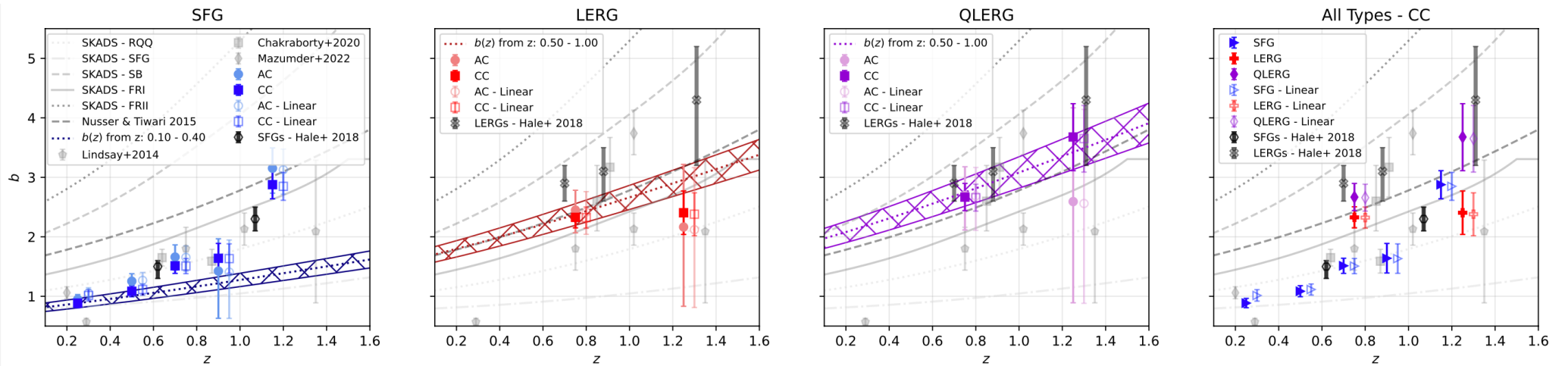


**LERGs appear more clustered than SFGs and quiescent LERGs more clustered than full LERG population.**

**Good agreement between Hale+ 2018 SFGs and this work and Hale+ 2018 LERGs and the QLERGs**  
 (which are more similar based on selection function used in Smolčić+ 2017)



# Results



**LERGs appear more clustered than SFGs and quiescent LERGs more clustered than full LERG population.**

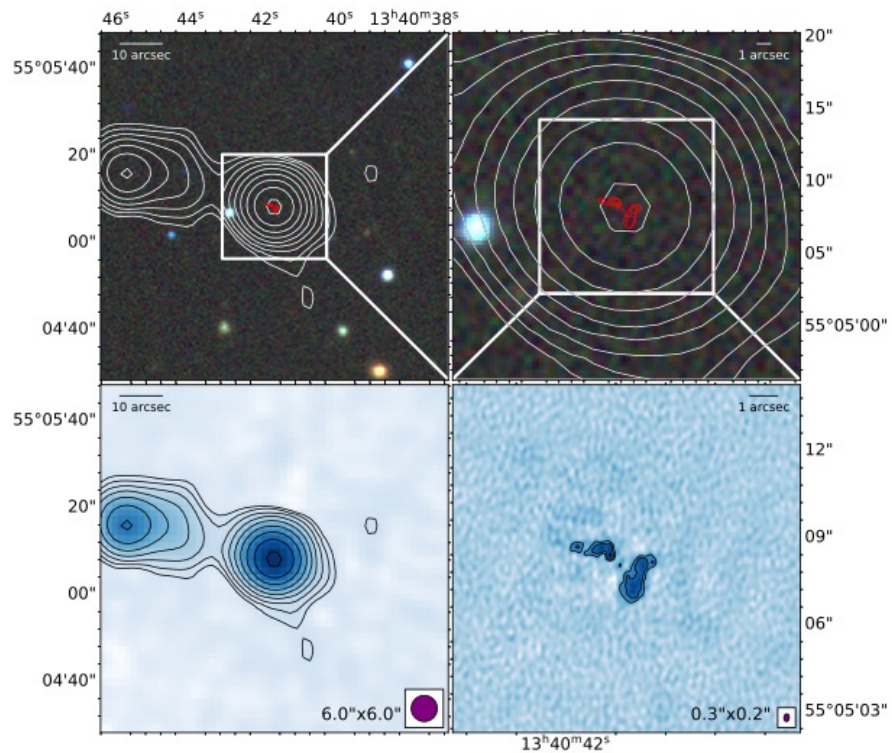
**Good agreement between Hale+ 2018 SFGs and this work and Hale+ 2018 LERGs and the QLERGs**  
 (which are more similar based on selection function used in Smolčić+ 2017)

SFG bias evolution is **steeper** than the **evolving model** assumed for **LoTSS DR2** – but good approximation for LERGs

# Future of Cosmological Studies with LOFAR

# Future with LOFAR

## LOFAR High Resolution



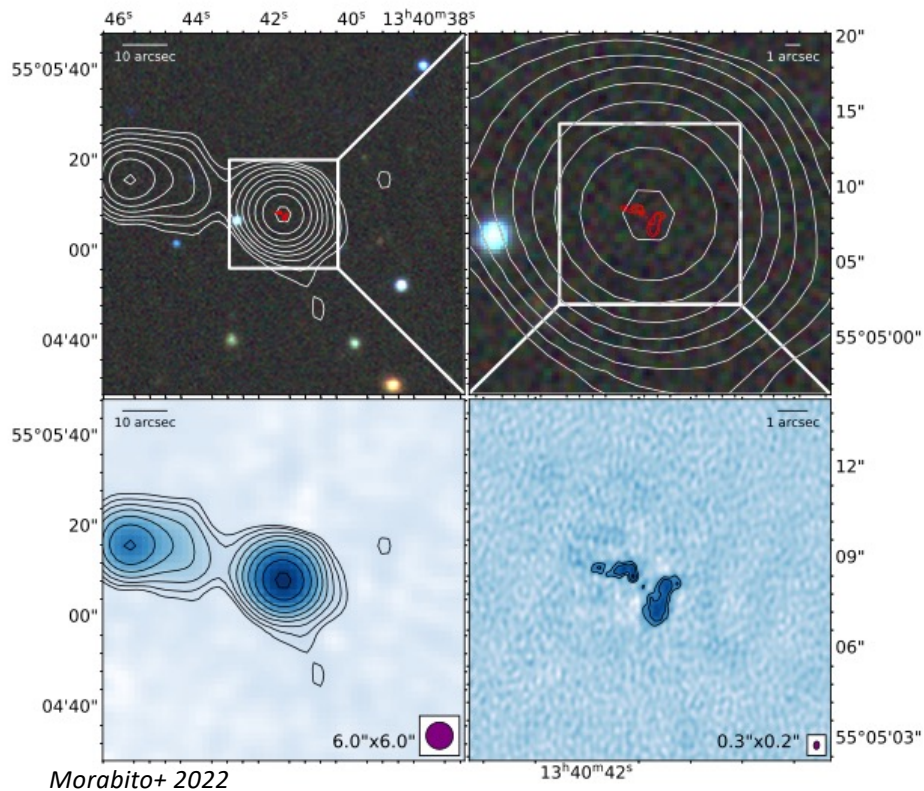
Morabito+ 2022

[catherine.hale@physics.ox.ac.uk](mailto:catherine.hale@physics.ox.ac.uk)

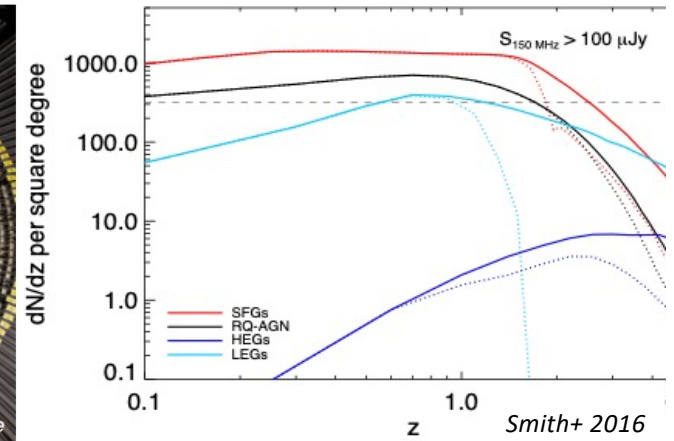
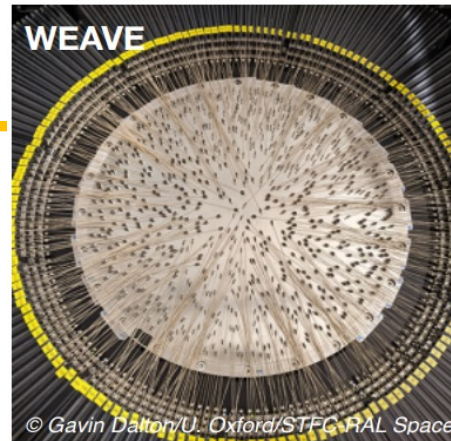
LOFAR Family Meeting, Leiden 2024

# Future with LOFAR

## LOFAR High Resolution

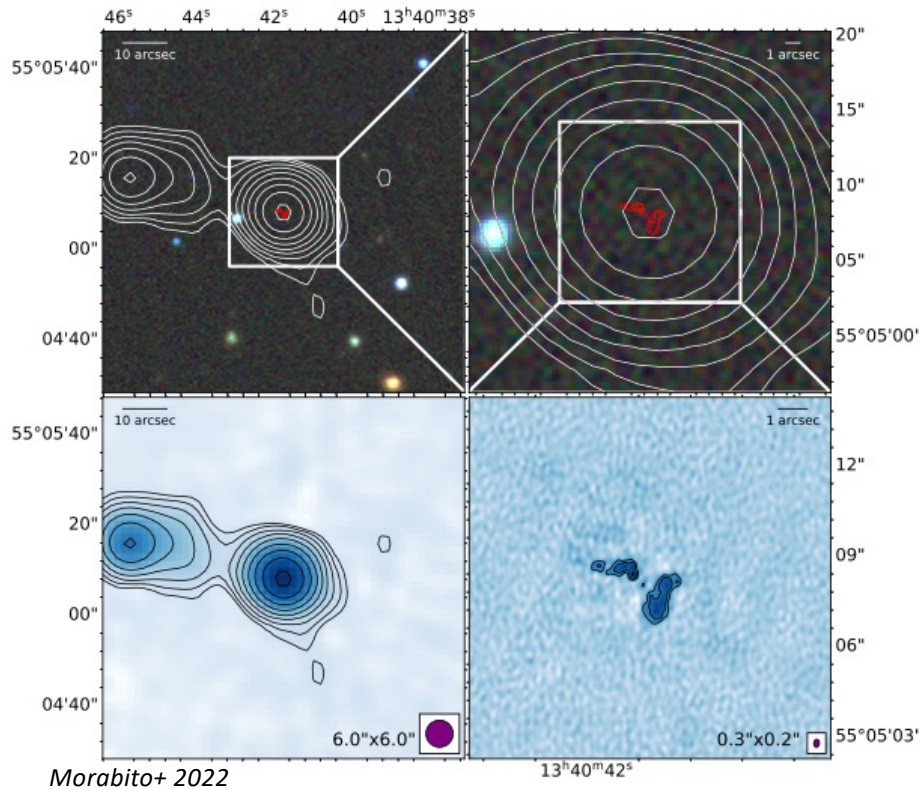


## LOFAR Follow up Redshift Survey: WEAVE-LOFAR

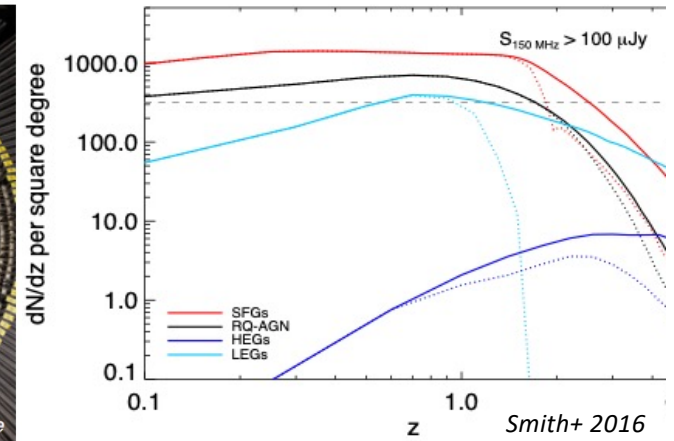
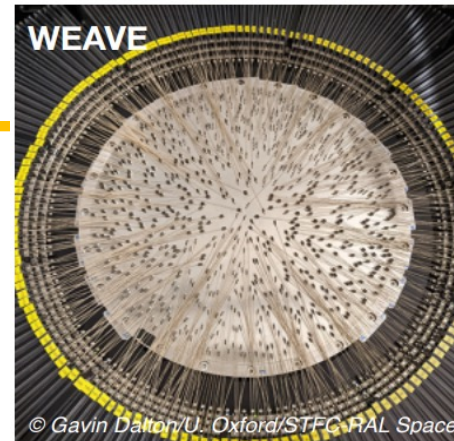


# Future with LOFAR

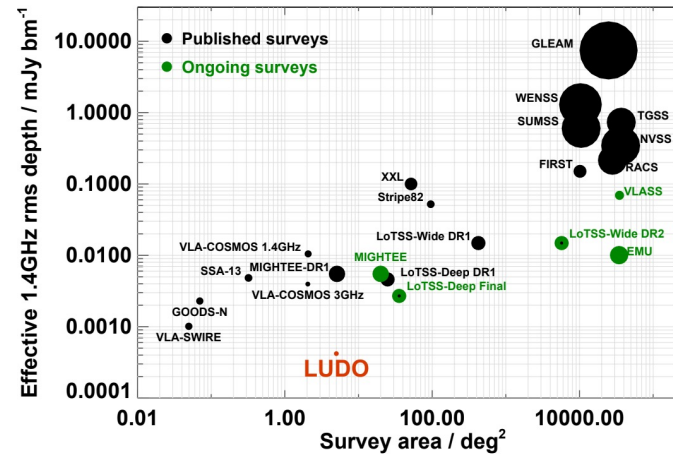
## LOFAR High Resolution



## LOFAR Follow up Redshift Survey: WEAVE-LOFAR



## Combining LOFAR 2.0 with other surveys



LUDO proposal, Best, Morabito et al.

ESA/Euclid/Euclid Consortium/NASA, image processing by J.-C. Cuillandre (CEA Paris-Saclay), G. Anselmi

# Summary

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- Radio Surveys with LOFAR are great for **cosmology** studies:
  - Combination of **large area** observations + **deep fields** with a **wealth of ancillary data**
- **Systematics** are **key** to understand to accurately trace the **large-scale structure**:
  - We use a combination of simulations and account for **systematic effects** e.g. incompleteness, smearing, measurement errors
- Numerous studies of the **evolving bias** in the **LoTSS DR2** wide area survey from the auto-correlation (**Hale+ 2024**) and cross-correlations (**Nakoneczny + 2024, Zheng+ in prep**) with other data to improve such measurements.
- The **deep fields** allow us to more accurately trace the **bias evolution** for different **populations (AGN vs SFGs)**.
- Future is exciting:
  - **Spectroscopic surveys** (i.e. **WEAVE-LOFAR**, Smith+ 2016) will allow us to **directly measure the spatial correlation function**, not use projected angular clustering
  - High resolution and LOFAR 2.0 will improve 1-halo studies and cross-correlating with optical/IR data