

# Radio luminosity function below the detection threshold

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# Radio luminosity functions

- Luminosity function is the number of sources in a luminosity interval over a given volume.
- Luminosity being intrinsic can give clues about the nature of the sources.
- We use the radio luminosity function to:
  - Probe the nature of radio emission from radio quiet quasars.
  - Study the cosmic star-formation history.
- All the previous generation of large radio surveys have detections above 1mJy at 1.4 GHz, where radio-quiet quasars and star-forming galaxies start to dominate.

# Bayesian stacking

- Need axillary data (e.g optical).
- Extract radio flux at axillary position.
- Bin the sources  $[S_{m_i}, S_{m_i} + \Delta s_{m_i}]$ .
- Assuming the number of sources in the flux bin follows a Poisson distribution then the likelihood is,

$$\mathcal{L}_i(k_i|\theta) = \frac{I_i^{k_i} e^{-I_i}}{k_i!},$$

$k_i$  : no: of sources

$I_i$  : mean no: of source

$$I_i = \int_{S_{min}}^{S_{max}} dS \frac{dN(S)}{dS} \int_{S_{m_i}}^{S_{m_i} + \Delta S_{m_i}} dS_m \frac{1}{\sigma_n \sqrt{2\pi}} e^{-\frac{(S - S_m)^2}{2\sigma_n^2}}.$$

$S$  : Flux

$S_m$  : Noisy Flux

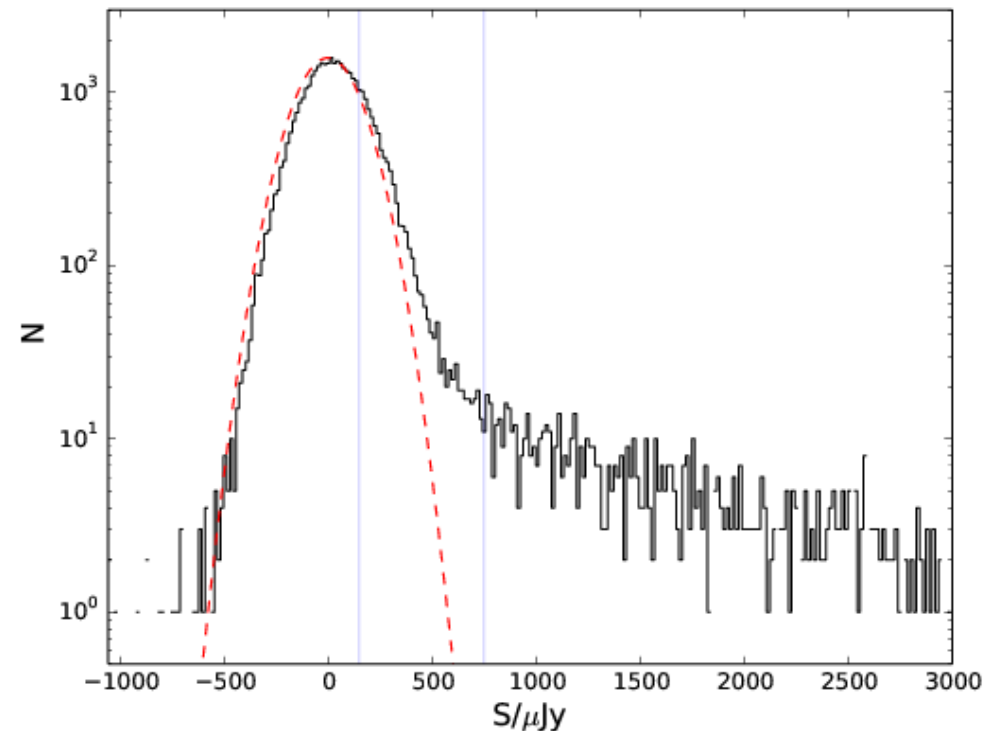
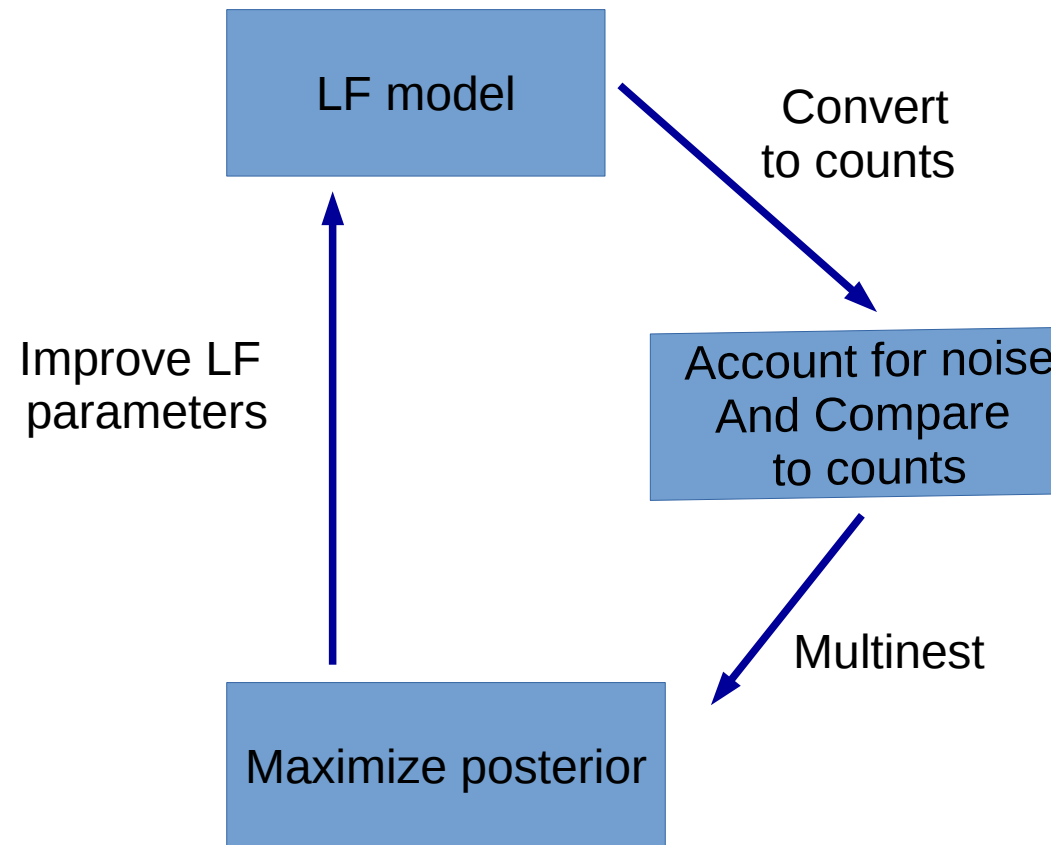
$dN/dS$  : Source counts

$\sigma$  : Noise rms

$$\mathcal{P}(\Theta|\mathbf{D}, H) = \frac{\mathcal{L}(\mathbf{D}|\Theta, H) \Pi(\Theta|H)}{\mathcal{Z}(\mathbf{D}|H)}.$$

# Counts to luminosity functions

$$\mathcal{L}_i(k_i|\boldsymbol{\theta}) = \frac{I_i^{k_i} e^{-I_i}}{k_i!},$$

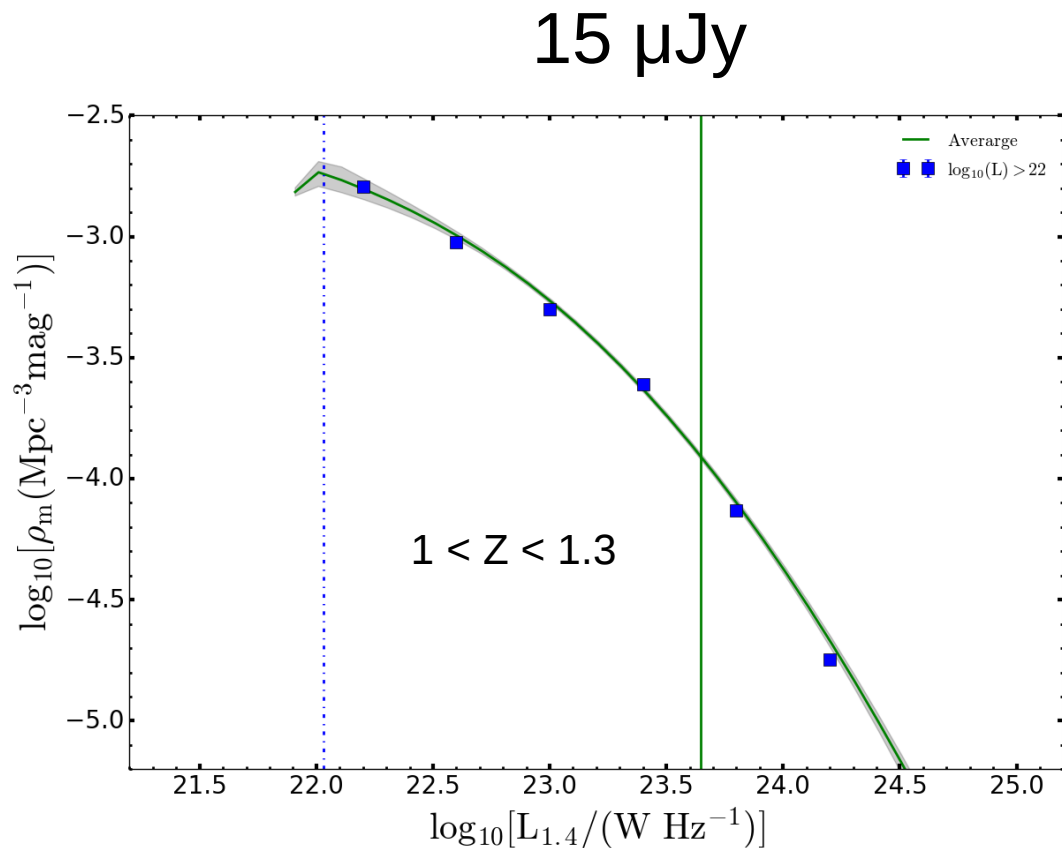
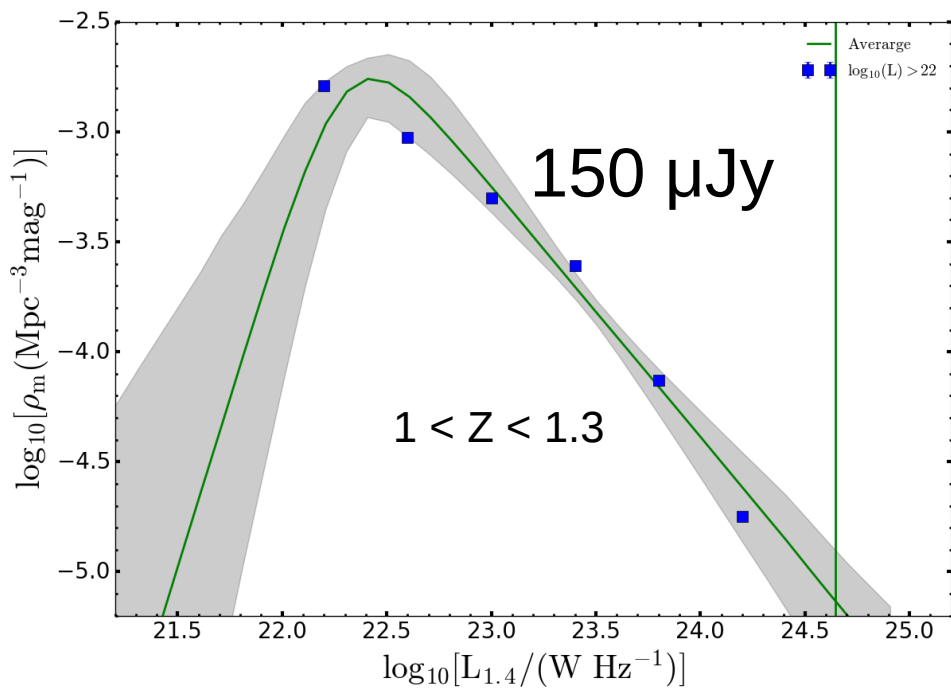


$$\mathcal{P}(\boldsymbol{\Theta}|\mathbf{D}, H) = \frac{\mathcal{L}(\mathbf{D}|\boldsymbol{\Theta}, H) \Pi(\boldsymbol{\Theta}|H)}{\mathcal{Z}(\mathbf{D}|H)}.$$

# SKA Design Studies: Simulated Skies (SKADS)

Wilman et al 2010

- 20 deg<sup>2</sup>
- Over 320 million sources
- Down to 1nJy



$$\Phi(L) = \frac{\Phi_*/L_*}{(L/L_*)^\alpha + (L/L_*)^\beta}$$

$$\Phi(L) = \Phi_2^* \left( \frac{L}{L_2^*} \right)^{1-\delta} \exp \left[ -\frac{1}{2\sigma^2} \log^2 \left( 1 + \frac{L}{L_2^*} \right) \right]$$

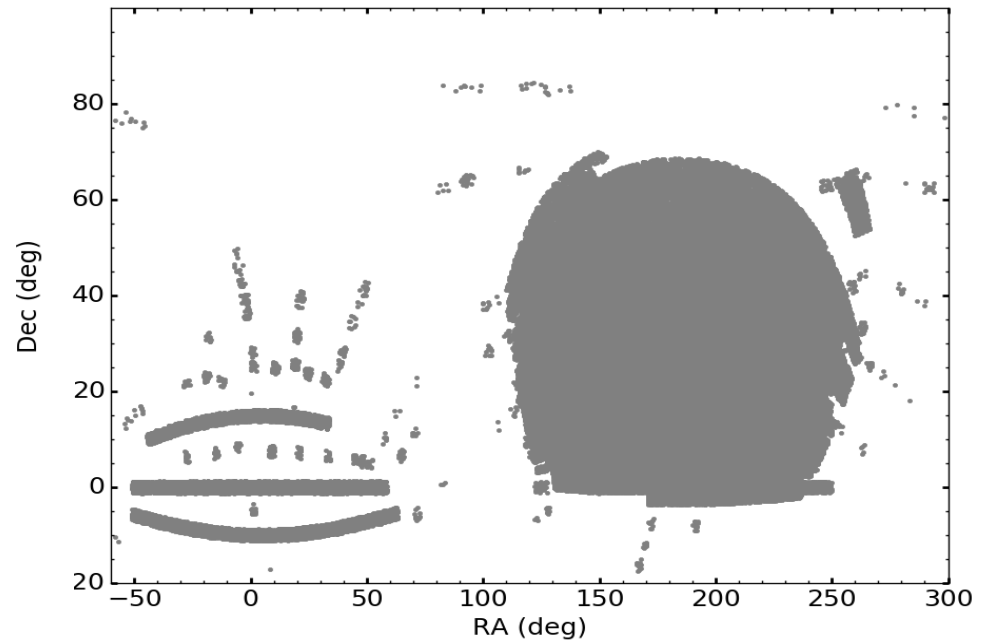
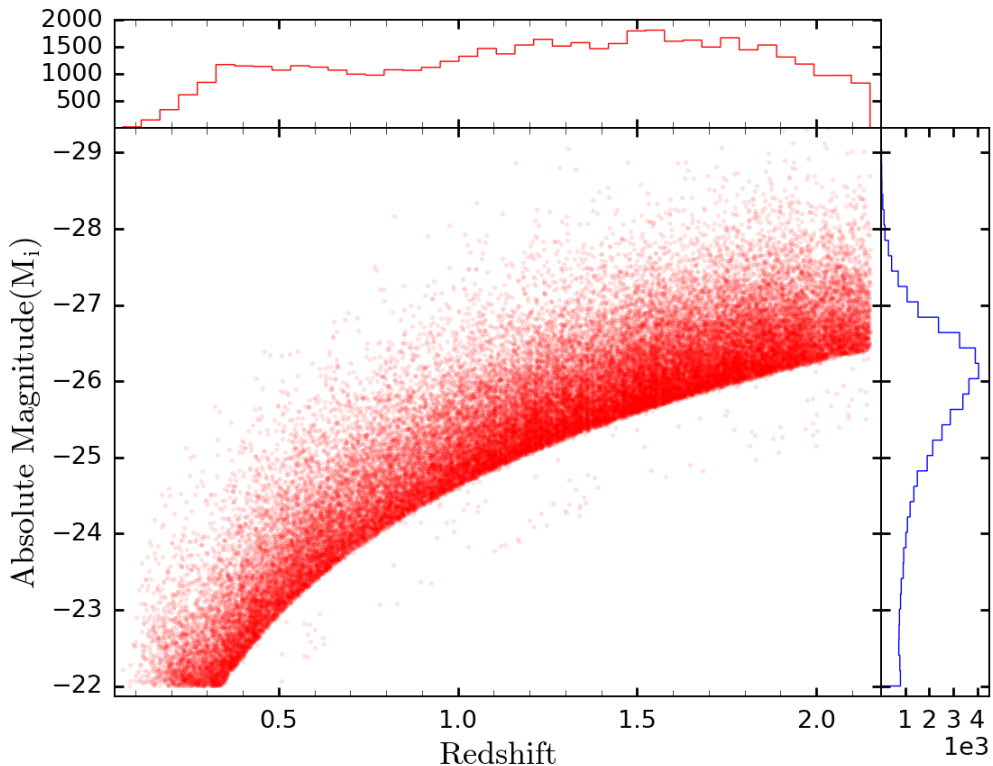
# Emission of radio quiet quasars

The nature of radio-quiet quasars has been debated for for a long time.

- Are they powered by AGN like radio-loud quasars?
- Or are they powered by star-formation?

# SDSS quasars

- Quasars taken from SDSS II DR7. Contains  $\sim 105\,700$  sources over  $\sim 6600 \text{ deg}^2$ .
- We use a uniform selection of source over the footprint ( $\sim 47\,000$ ).

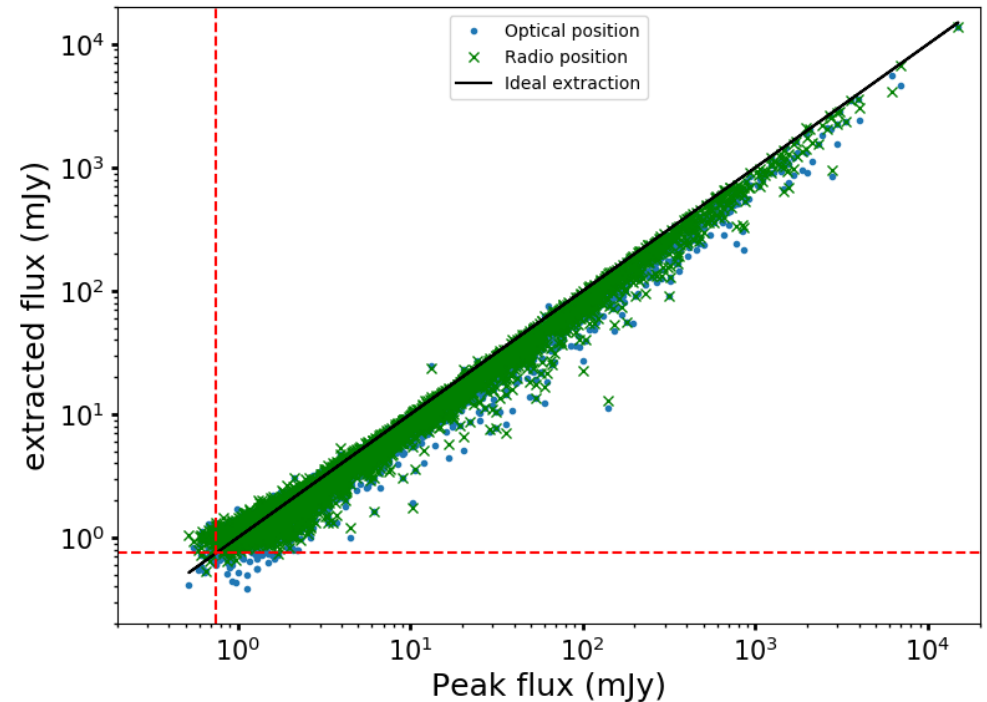
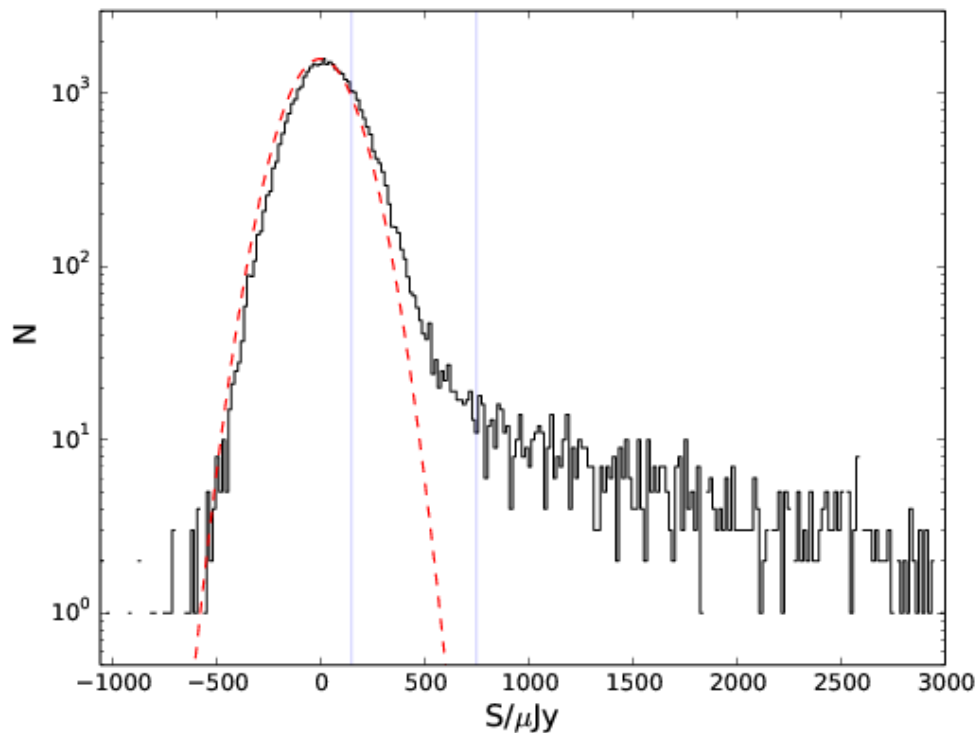


Divide the source into 7 redshift bins to avoid evolutionary effects.

We apply an absolute magnitude cut to each bin to ensure completeness.

# Radio data

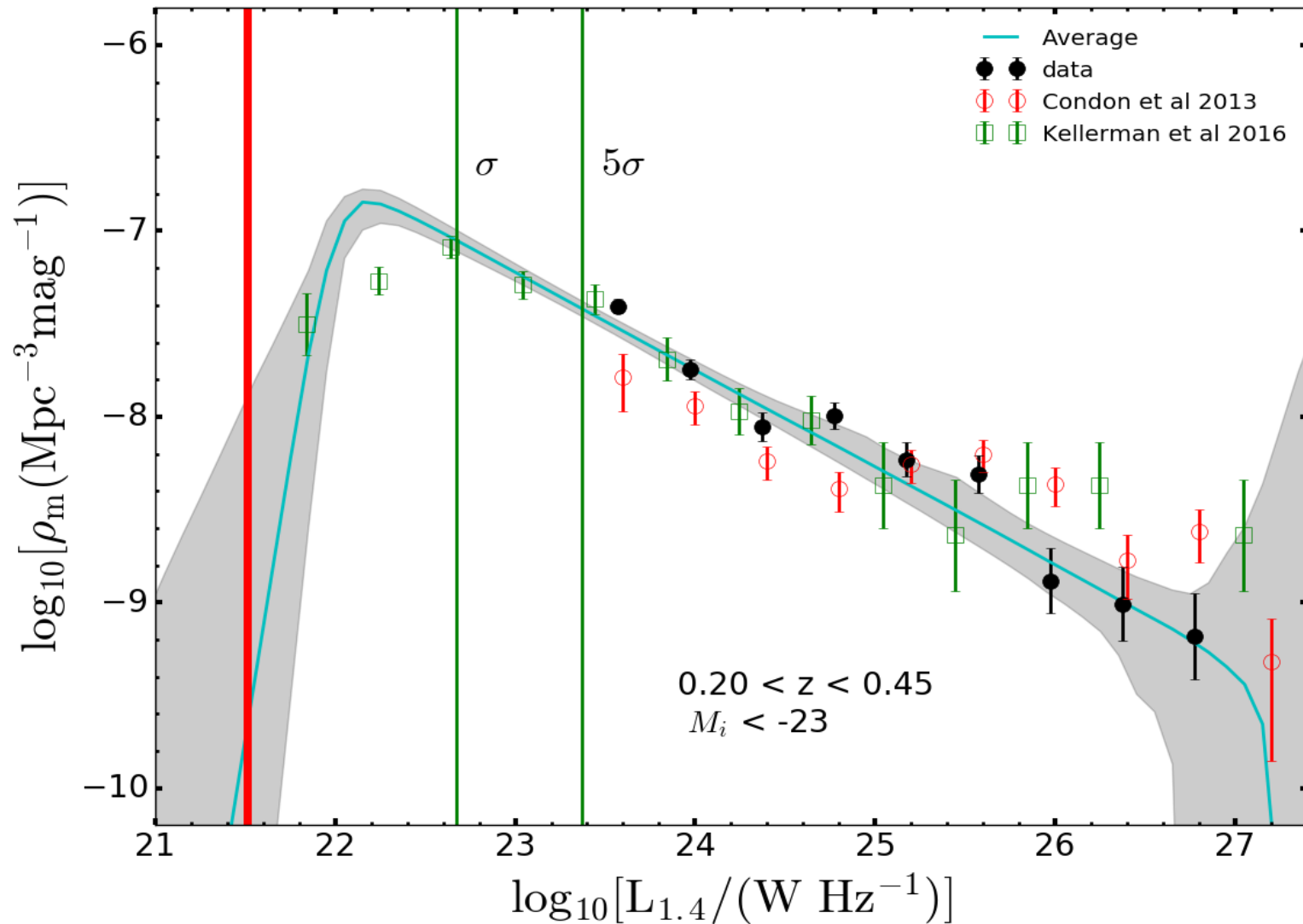
- FIRST survey is taken by the Very Large Array (VLA) at 1.4 GHz. Covers  $\sim 10\,000\text{ deg}^2$ .



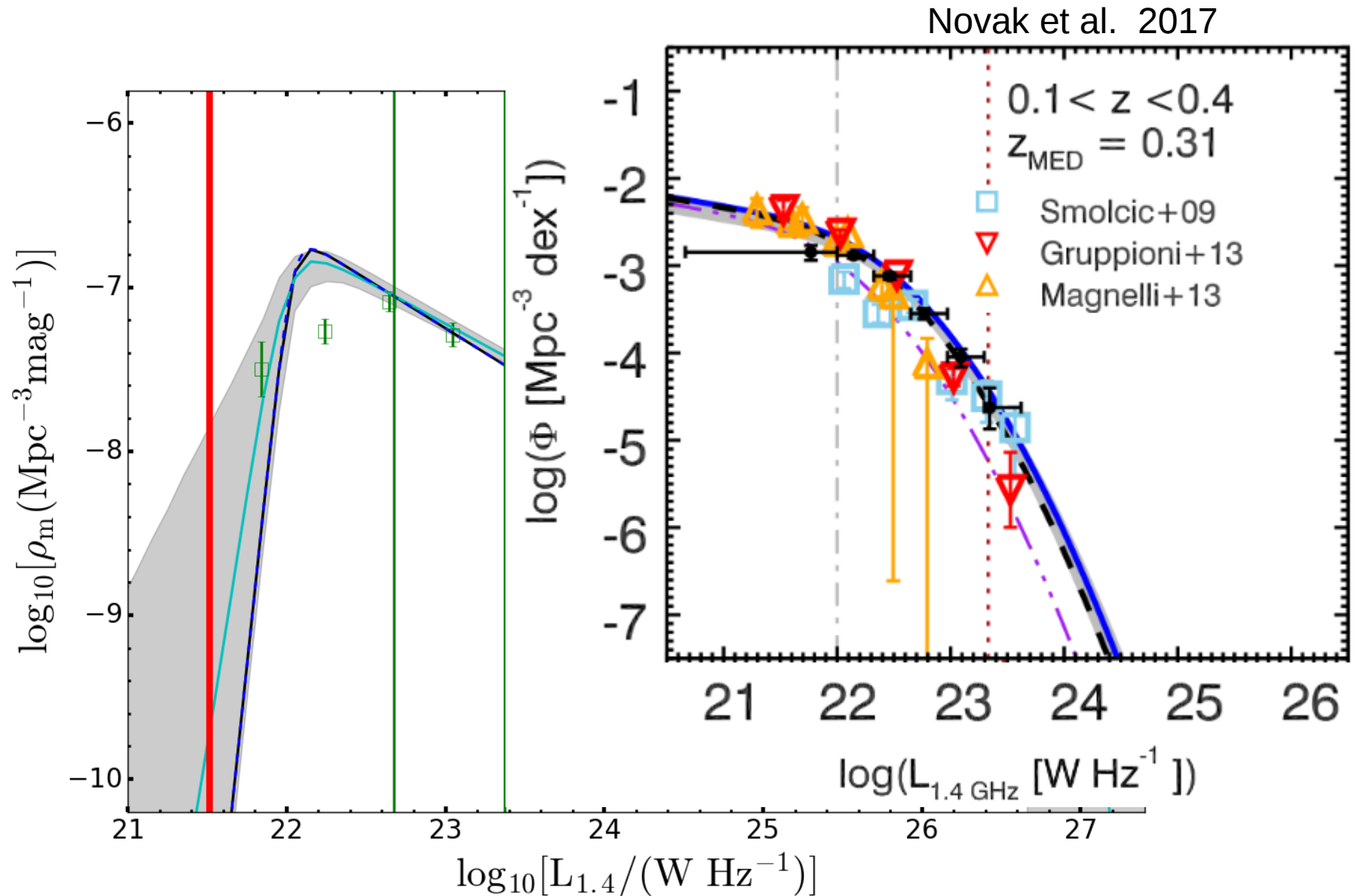
- Radio flux of the quasars extracted at the position of the SDSS quasars.
- $\sim 3800$  of the 47 000 have radio counter-parts.



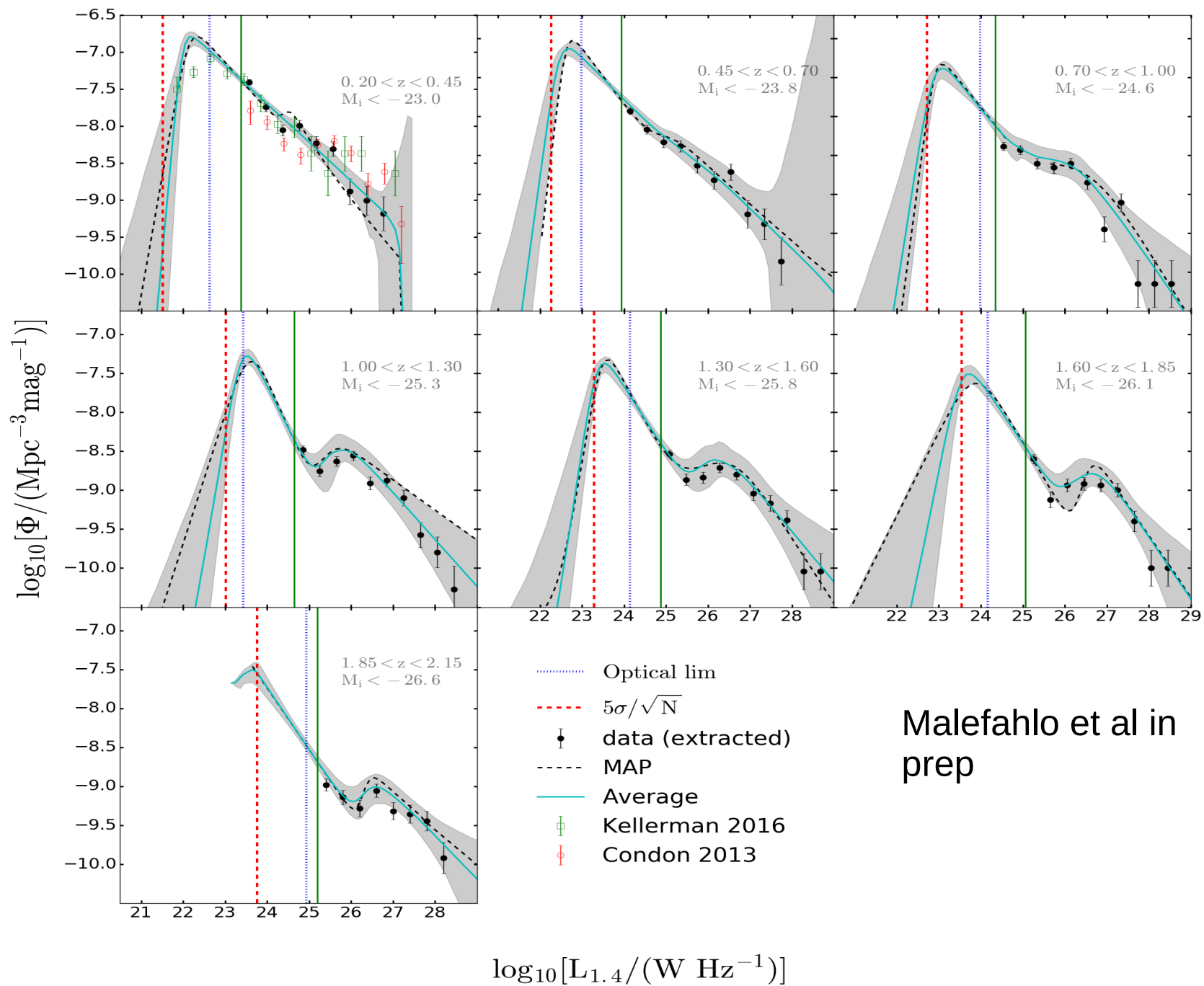
# Optically selected quasar radio luminosity function



# Optically selected quasar radio luminosity function

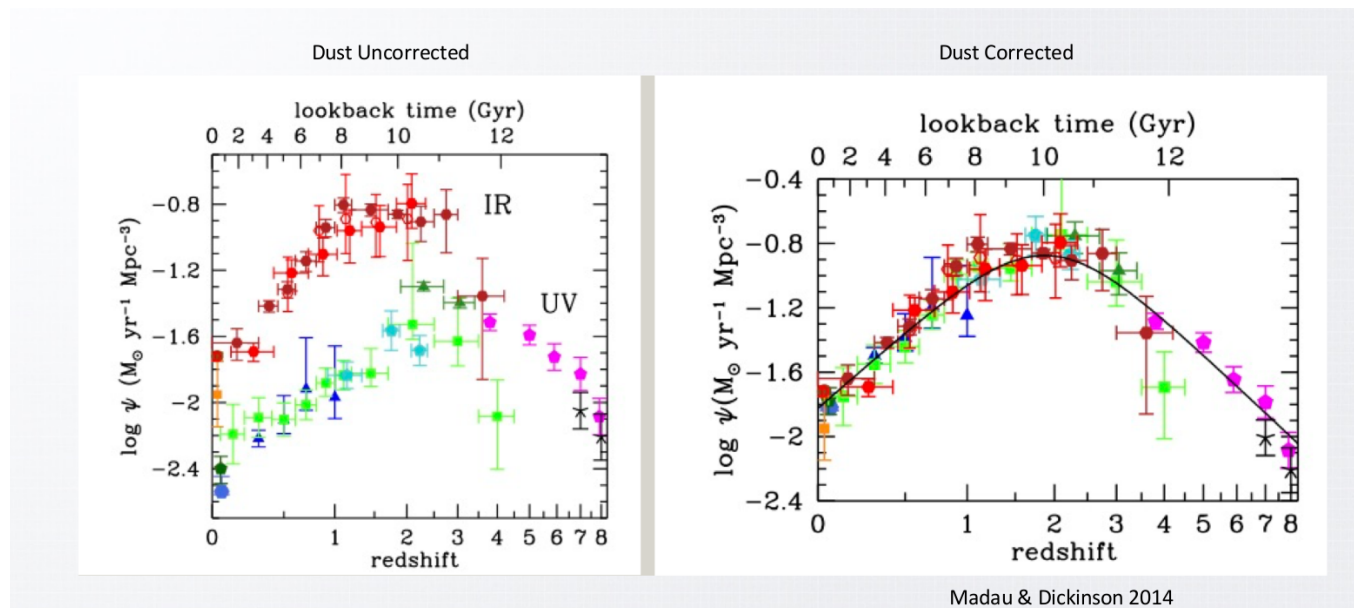


# Evolution of QRLF



# Cosmic star formation history

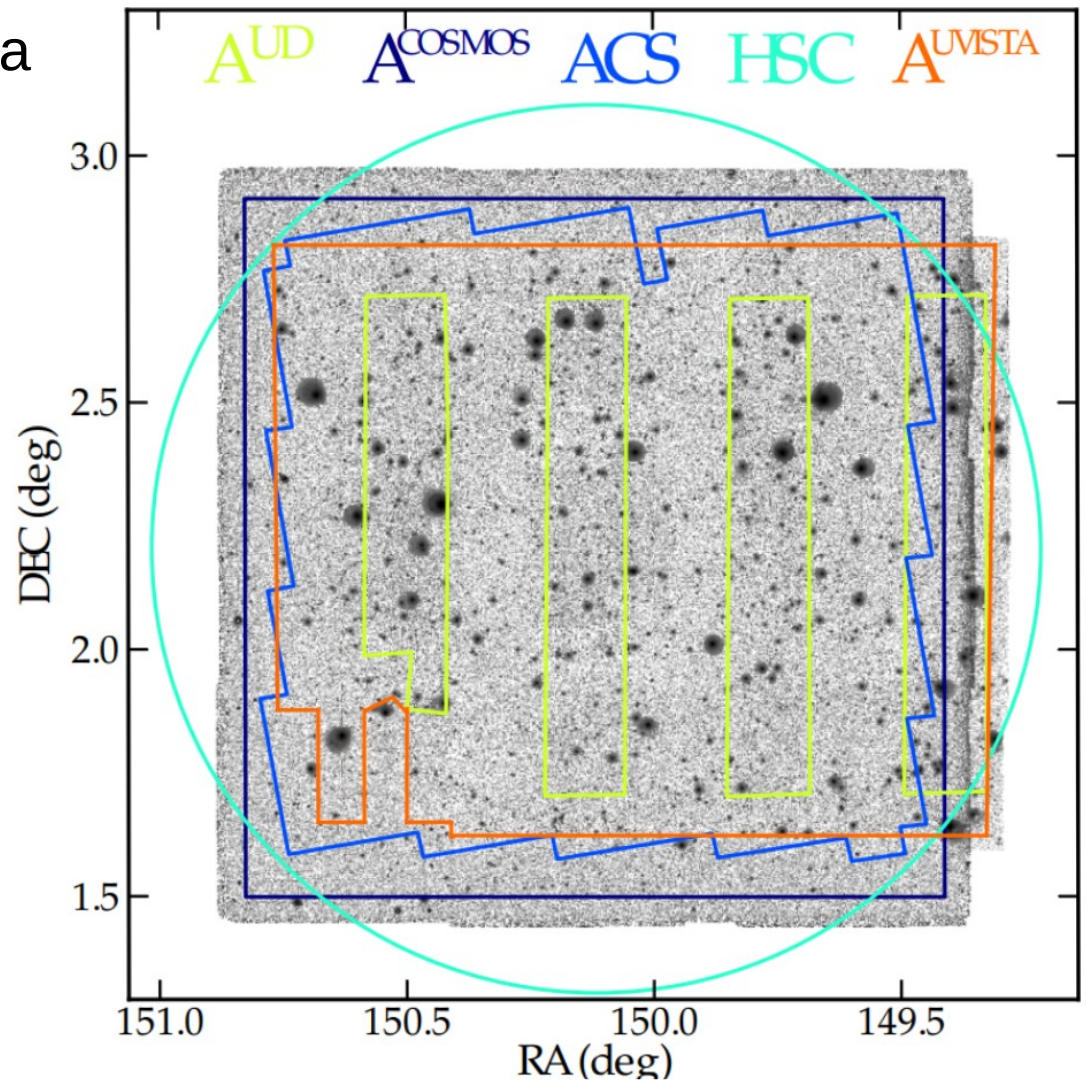
- Important in understanding galaxy evolution.
- Star formation traces: UV, Optical, Far-IR and Radio.
- UV and Optical are obscured by dust.



- Far-IR and Radio are not deep enough.
- Push sensitivity of radio measurements through advanced stacking.

# Cosmos field

- Wealth of Multi-wavelength data
- Axillary data – UltraVista
  - 1.77 deg
  - 606, 887 sources
  - $K_s < 24.7$  ( $3\sigma$ )
- Radio data - JVLA
  - 3 GHz
  - 2.6 deg
  - Average rms  $2.3 \mu\text{Jy}$



Laigle et al 2016

# Star forming galaxies

Removing bad data

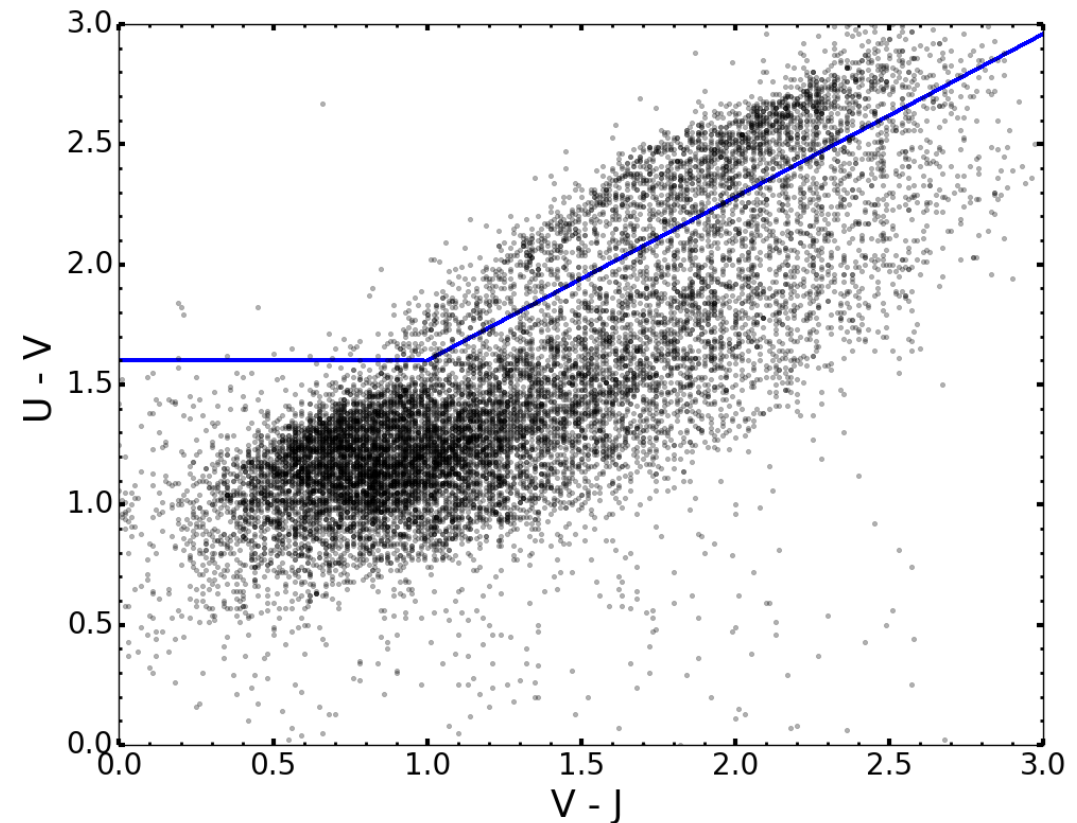
- $Ks\_flag < 0$

Removing stars

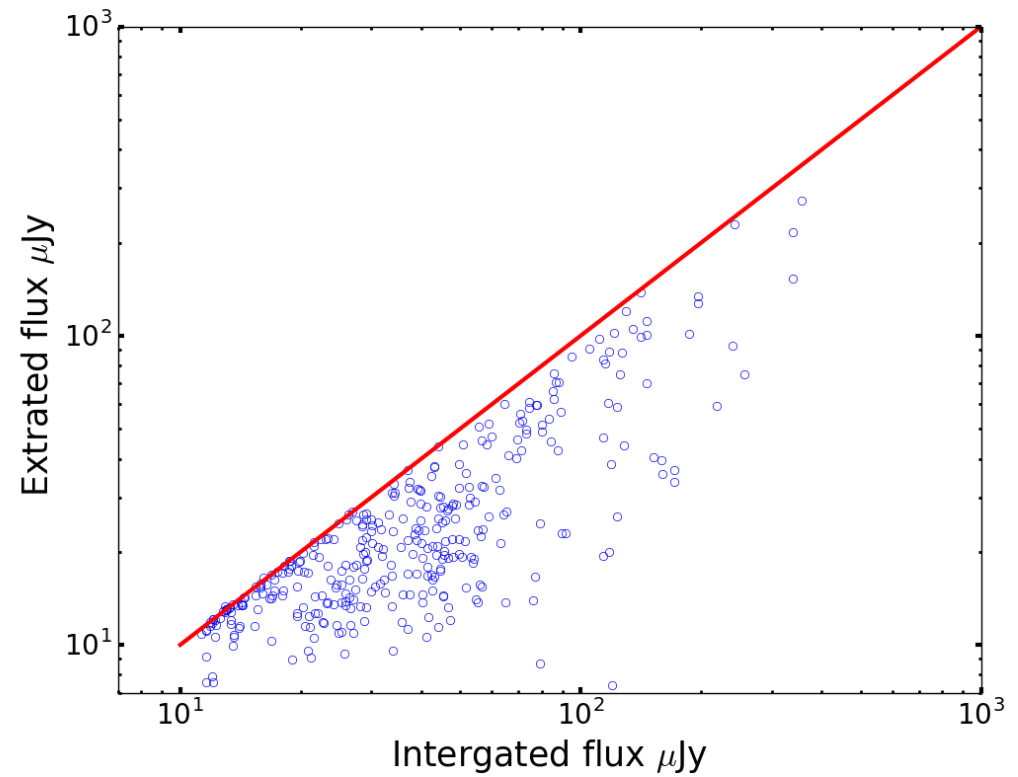
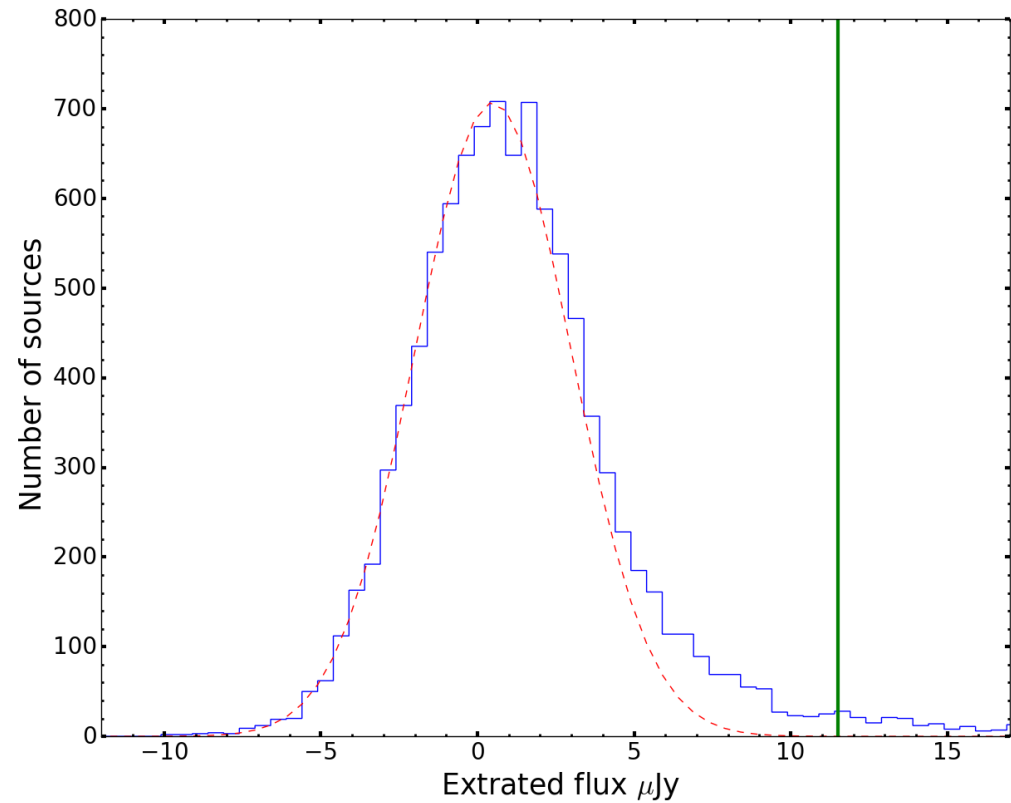
- $P(gal) - P(star) > 0$

Star-forming galaxies

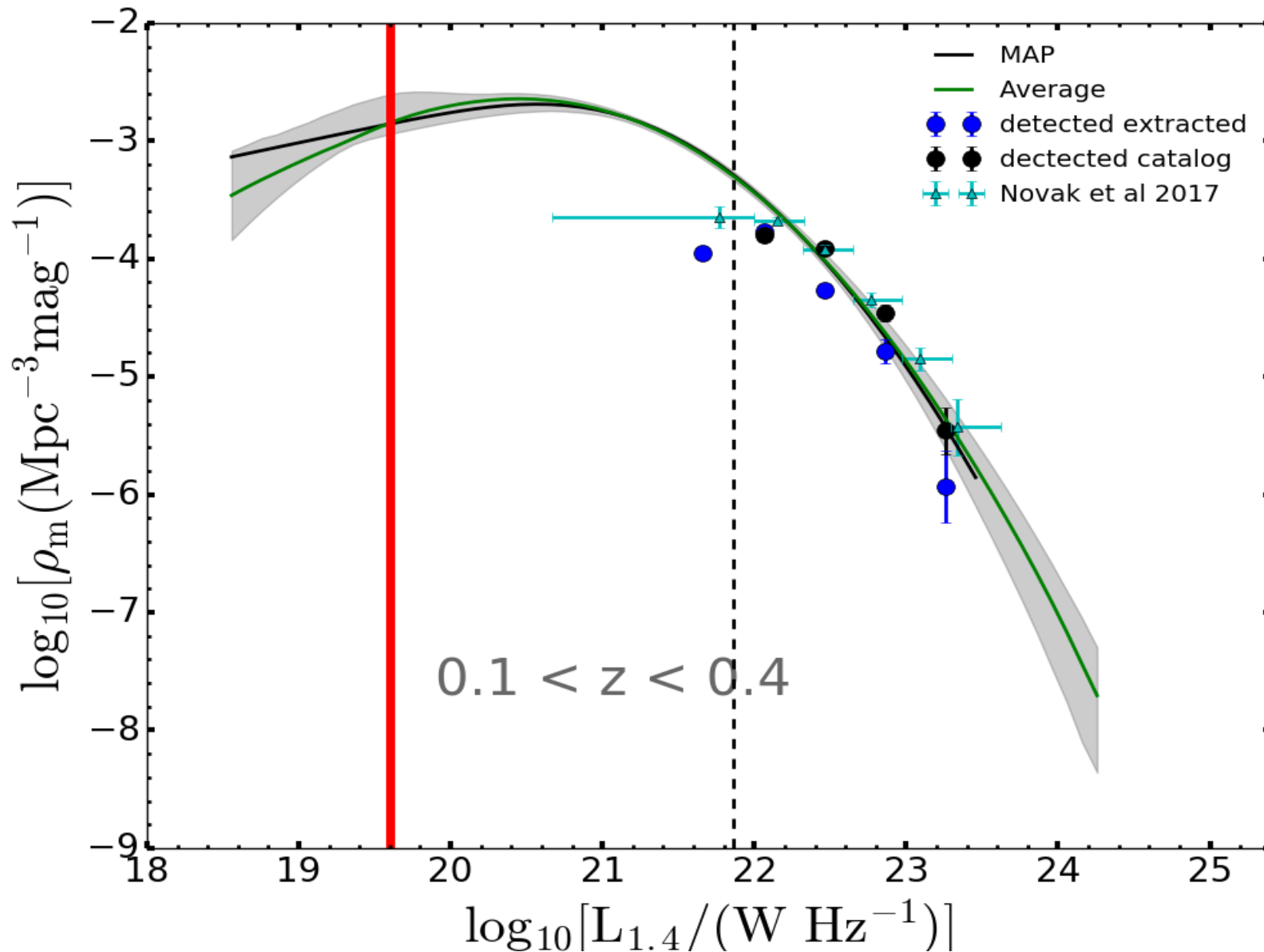
- $(U - V) > 0.88 \times (V - J) + 0.69$   
for  $0.1 < z < 0.4$



# Flux extraction



# Preliminary results: LF

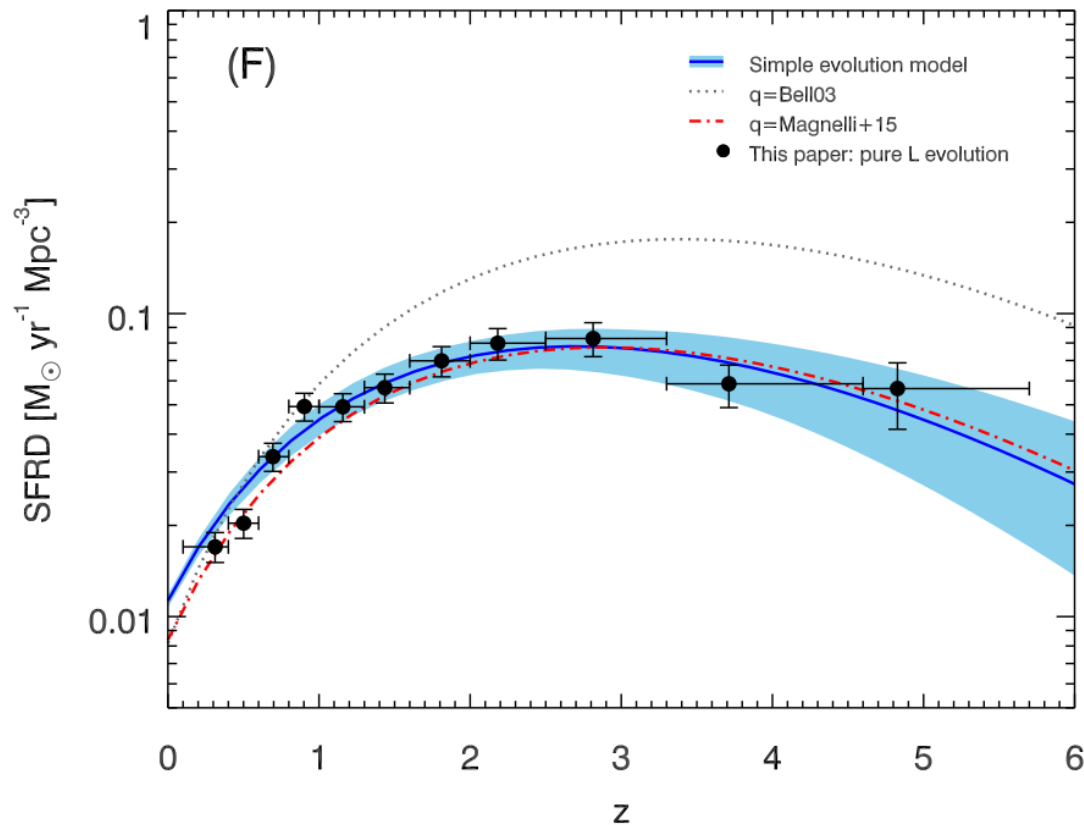




# To do: Cosmic star formation history

- Calculate RLF to  $z \sim 5$
- Star-formation rates using IR – Radio correlation
- Integrate over RLF and SFR to get SFRD

Novak et al. 2017



# Summary

- Successfully reconstructed RLF of SKADS sources to more than 2 orders of magnitude.
- The quasar RLF of SDSS-FIRST quasars is in agreement with literature.
- The RLF steeply increases towards the detection threshold which coincides with RLF of starforming galaxies.
- On going project to get star formation history using JVLA.