



# Clustering effects on GWs Dark Sirens determination of Ho

Marios Kalomenopoulos – Cosmo from Home – 2022

Work with: S. Khochfar, R. McGibbon (University of Edinburgh), R. Barbieri, J. Gair (Max Planck – AEI Potsdam)

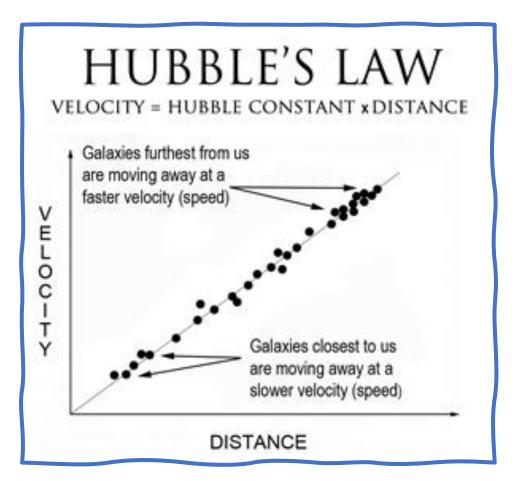
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# The Expanding Universe

The Hubble constant parameterises the expansion of the Universe:

$$V_{total} = H_o \times D + V_{pec}$$

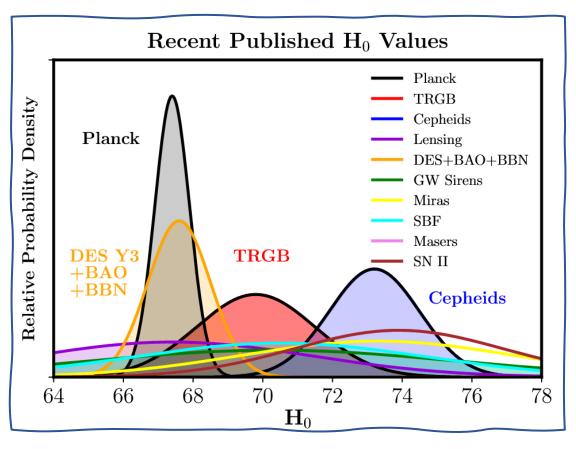
- Most measurements of the Hubble constant  $(H_0)$  require a precise determination of the velocity of expansion (through redshift z) and distance to the source (D).



Edwin Hubble 1929

### **Hubble Trouble?**

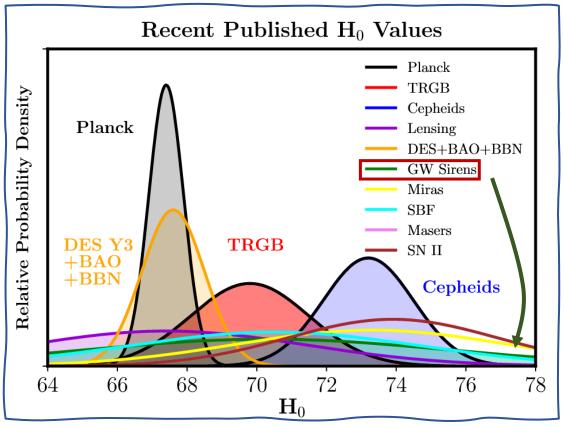
- There seems to be a discrepancy between different methods of determining  $H_0$ : Systematics? Or New physics?



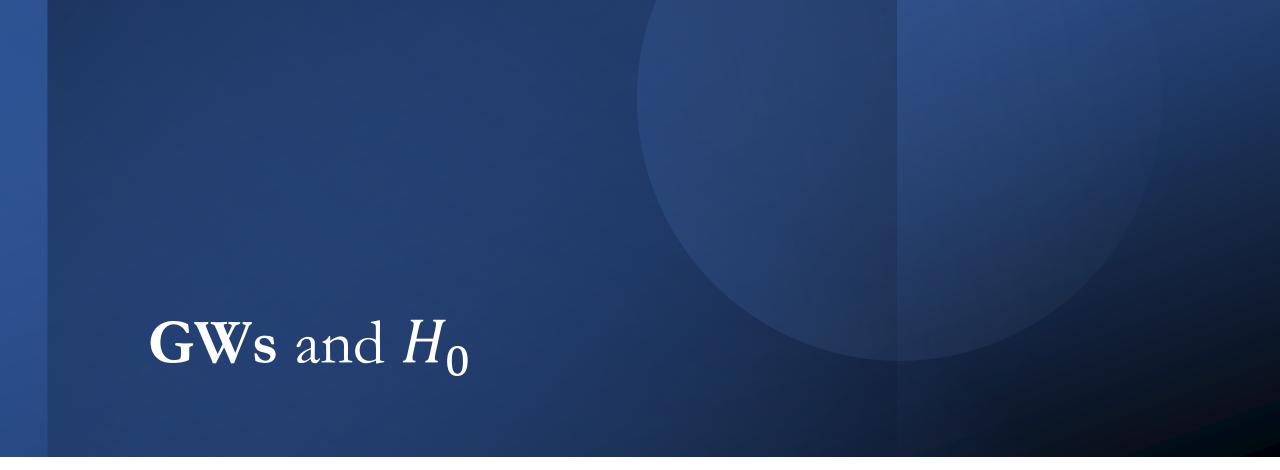
Wendy L. Freedman 2021

### Hubble Trouble?

- There seems to be a discrepancy between different methods of determining  $H_0$ . Systematics? Or New physics?
- GWs can provide an independent probe to the Hubble constant and help resolve the current tension.



Wendy L. Freedman 2021



# $H_0$ from GWs

$$v = H_0 d$$

- **Distance** → from GW signal
- **Velocity** → from redshift

### Ho from GWs

• **Distance** → from GW signal

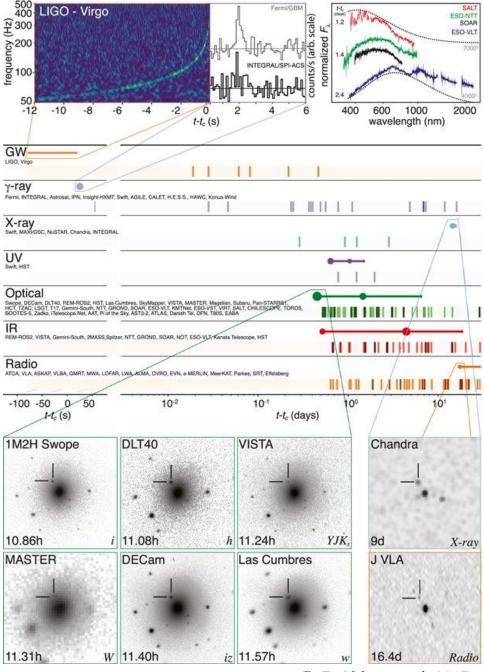


- Redshift
  - 1) A direct EM counterpart
  - 2) A collection of galaxies in GW localisation volume
  - 3) Knowledge of source-frame mass distribution
  - 4) For NS: measure of tidal deformability & EoS

## 1) What is a Standard Siren?

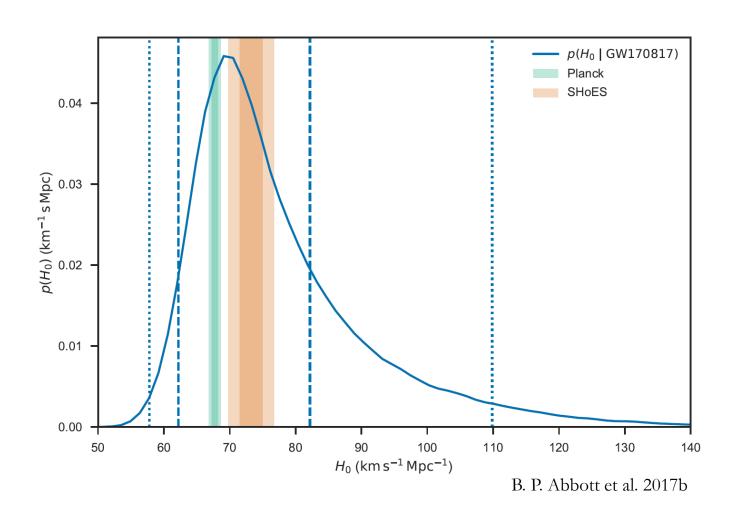
- A GW merger provides a direct absolute measurement of luminosity distance.
- For redshift information, we need an EM counterpart\*.
- Direct way to connect luminosity distance with redshift.

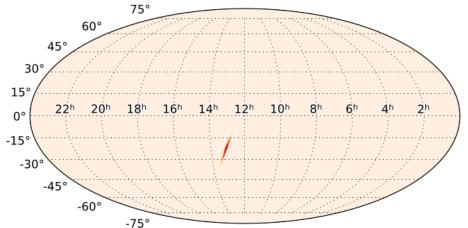
Schutz 1986; Holz & Hughes 2005

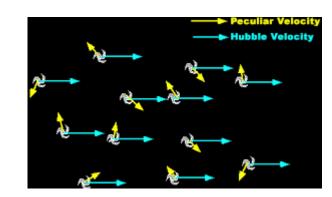


\*in most cases.

# 1) A gravitational-wave standard siren measurement of the Hubble constant







$$V_{total} = H_o \times D + V_{pec}$$

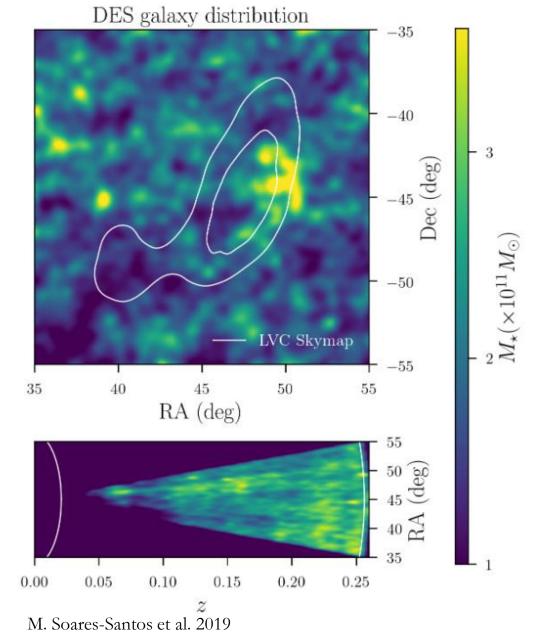
Dark Sirens (and the Hubble tension)

#### GW170814

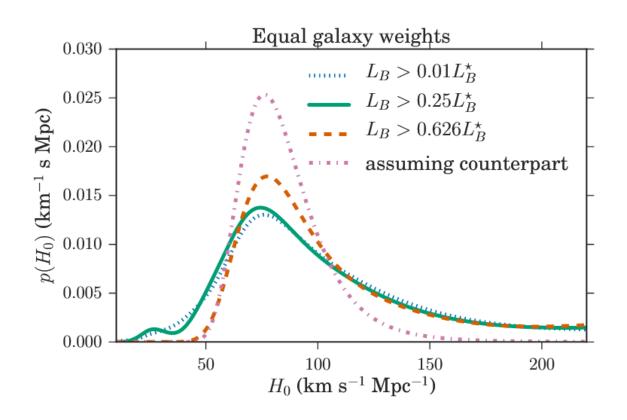
# 2) What is a Dark Siren?

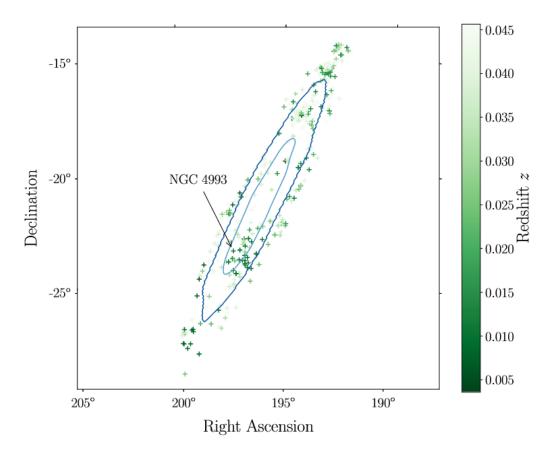
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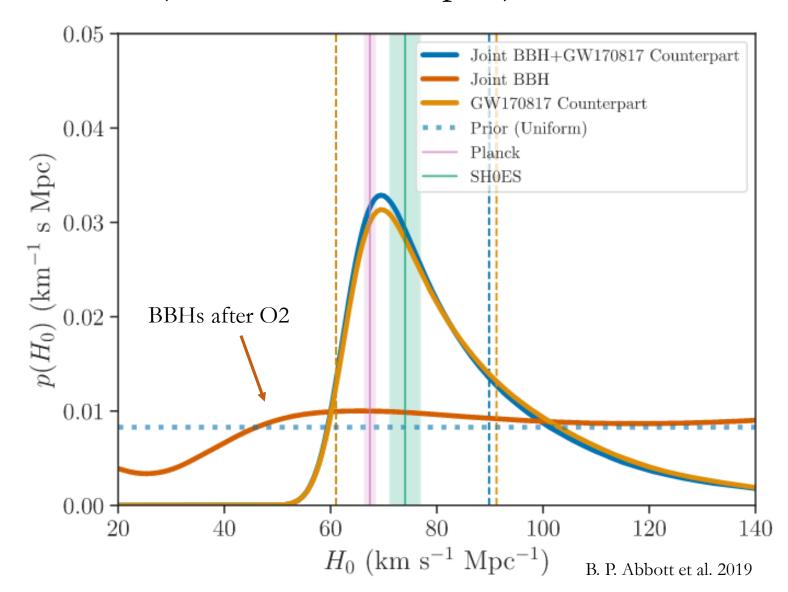
# 2) A gravitational-wave standard siren measurement of the Hubble constant (without a counterpart)





Fisbach et al. 2019

# 2) A gravitational-wave standard siren measurement of the Hubble constant (without a counterpart)



#### Very active research area:

Chen et al. 2017

Nair et al. 2018

Gray et al. 2019

Bera et al. 2020

Palmese et al. 2021

Finke et al. 2021

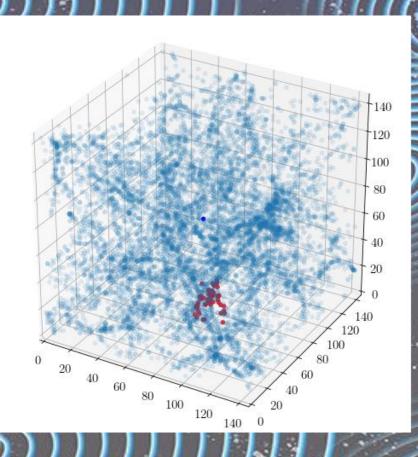
Muttoni et al. 2021

Chen et al. 2022

. . .

In 5 + 1 steps:

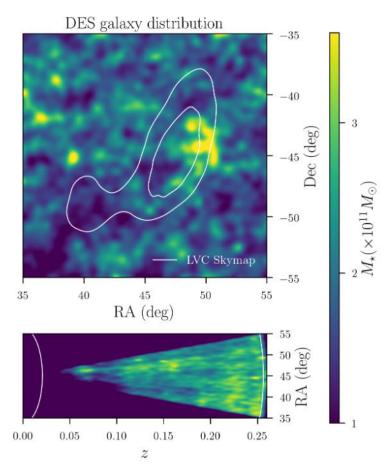
- 1) We observe a GW, with no counterpart. In the simulations, we model the GW 3D sky region as a cone.
- 2) We find all haloes in the cone and calculate their distances to the observer. Observer at the centre of the box. Centres of cones at random halo positions in the box.



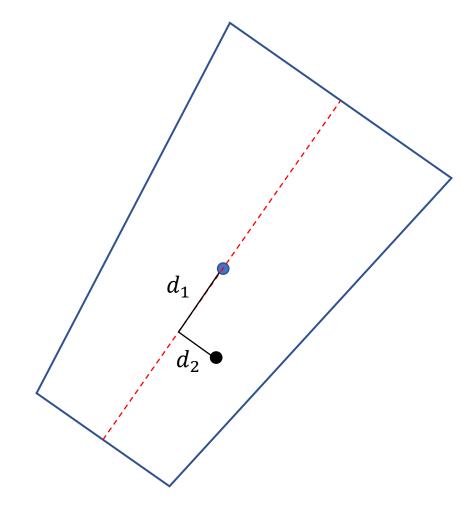
\*Most of the boxes here are for visualisation purposes only. For the analysis we use the haloes from a (1.6 Gpc/h)^3 box, with 2048^3 particles resolution from the LEGACY suite.

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- 3) To construct the cone we assume 2 main errors, following observations (LOS distance, sky localisation area). These also give different weights to the potential sources.



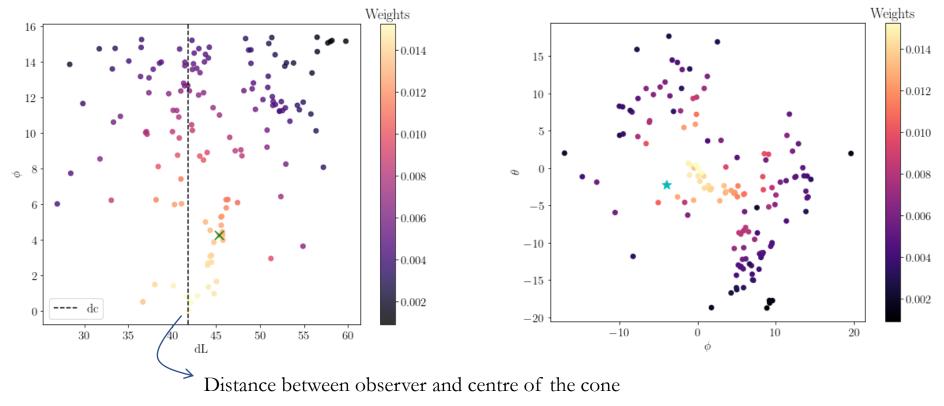
M. Soares-Santos et al. 2019



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- 4) Randomly choose one distance as the "true" GW distance (GW source).

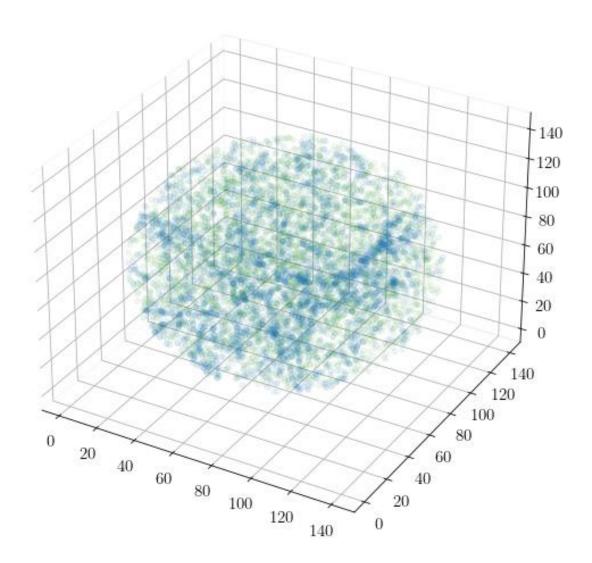
2D projected distribution of galaxies in the cone



Weights depend on **angular position**, **distance from the centre** of the cone & **selection effects** due to the cone geometry (larger at higher distances)

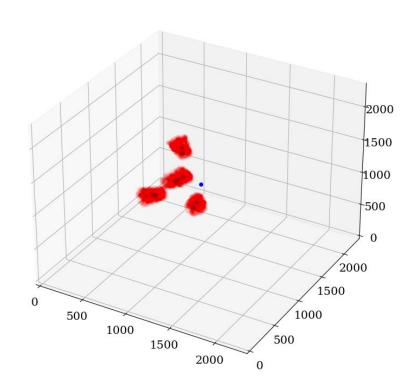
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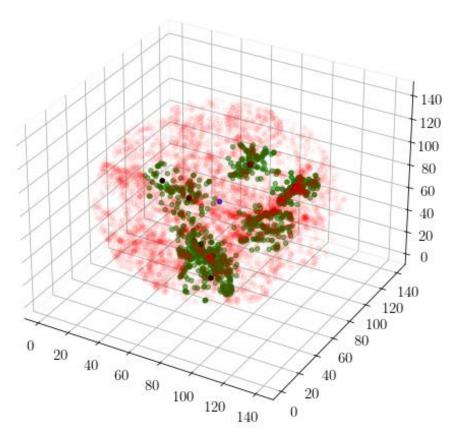
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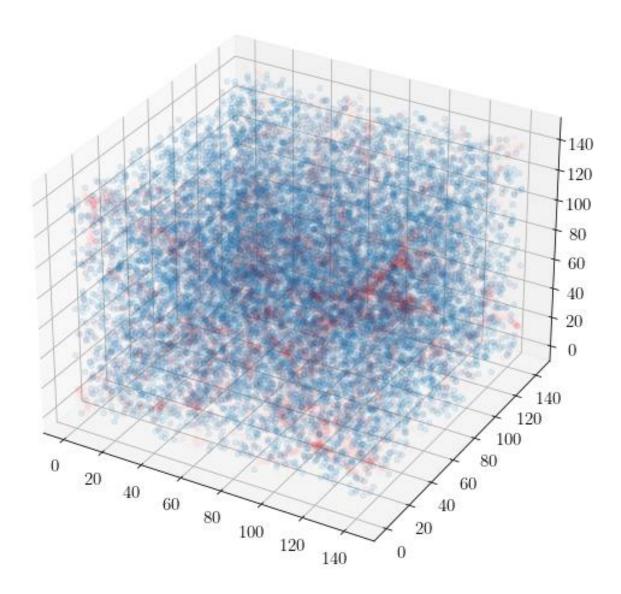
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- 6) Power of the method lies in the statistics: Repeat for many cones and "add" together!



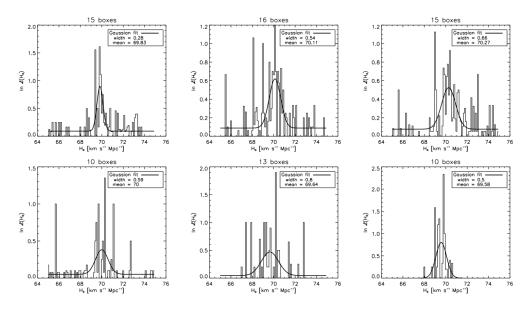


### Base model – uniform box

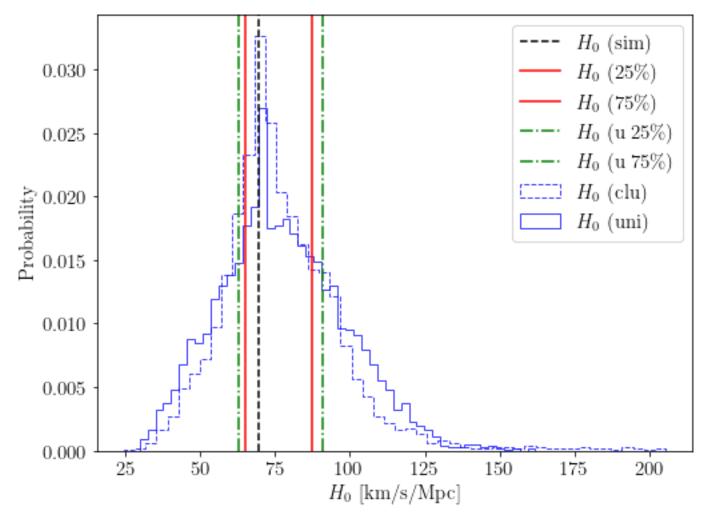


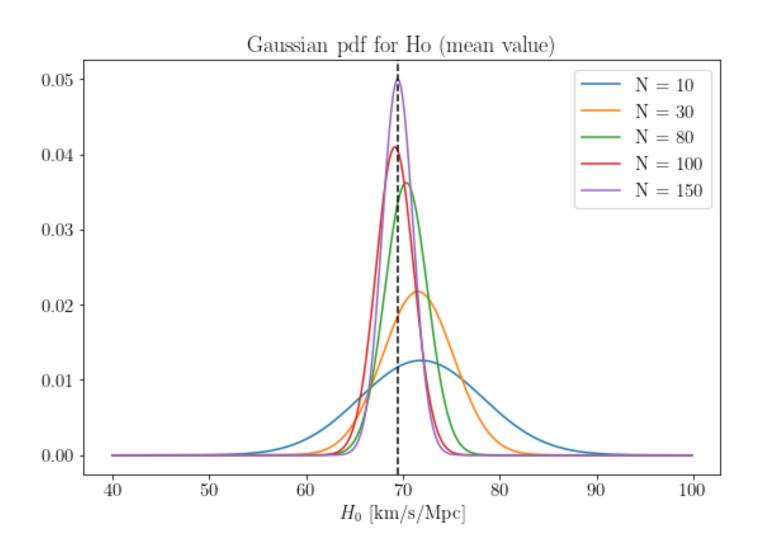
Coordinates uniform (blue) and clustered (red).

# Ho Stacking



MacLeod & Hogan 2008

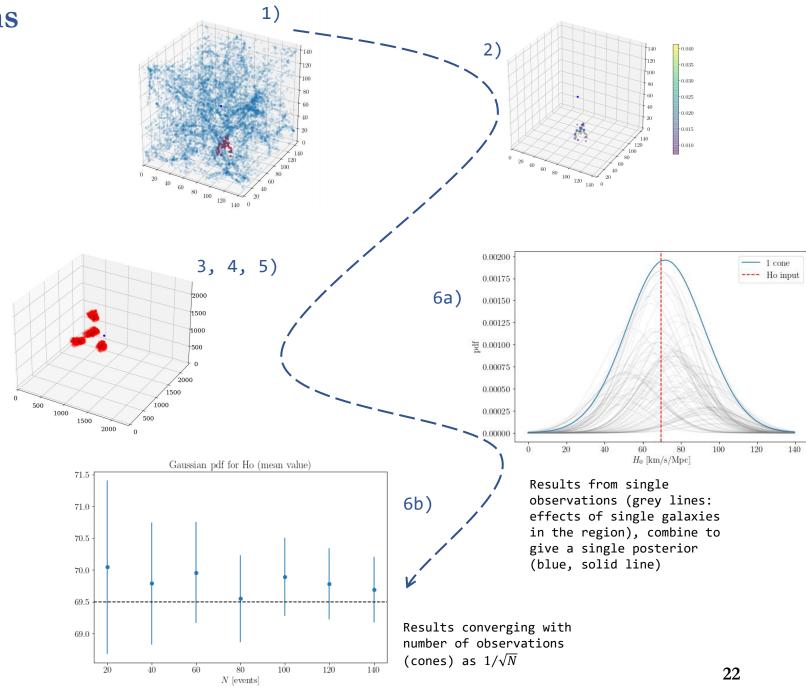




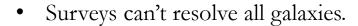
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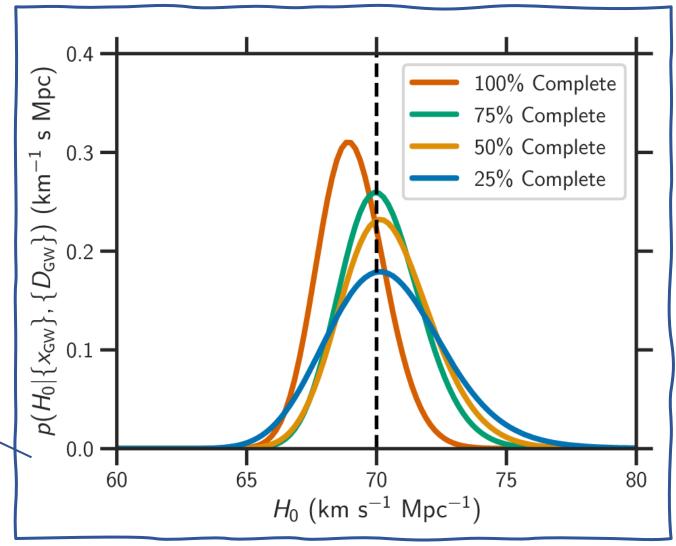


Completeness Issues:



- Cuts based on luminosities.
- "Complete" the catalogues, by randomly putting galaxies in.

Checking completeness, but not from a realistic galaxy configuration.

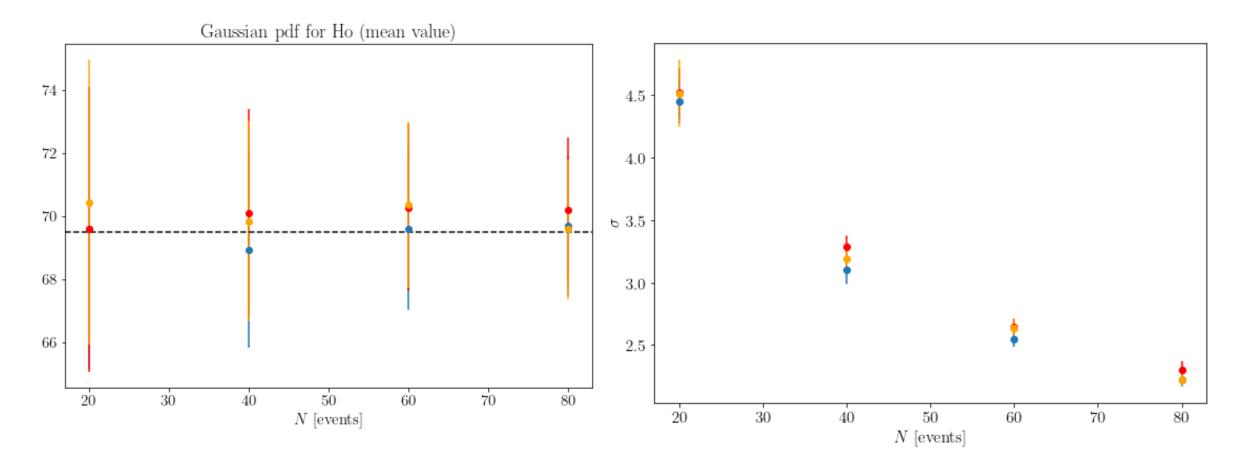


Gray et al. 2020

#### Completeness Issues: work in progress

A more realistic approach, will take into account **clustering**. This increases the possibility of identifying the true host, hence we expect to **improve convergence**.

Uniform
Complete (clustered)
85% (clustered)



# Dark Sirens in Simulations (Summary)

- Dark Sirens can provide a robust method of calculating  $H_0$ .
- Clustering reduces scatter in Ho posterior → faster convergence with number of events (about a 2% improvement versus a uniform catalogue).
- Clustering introduces less scattering in incomplete catalogues.

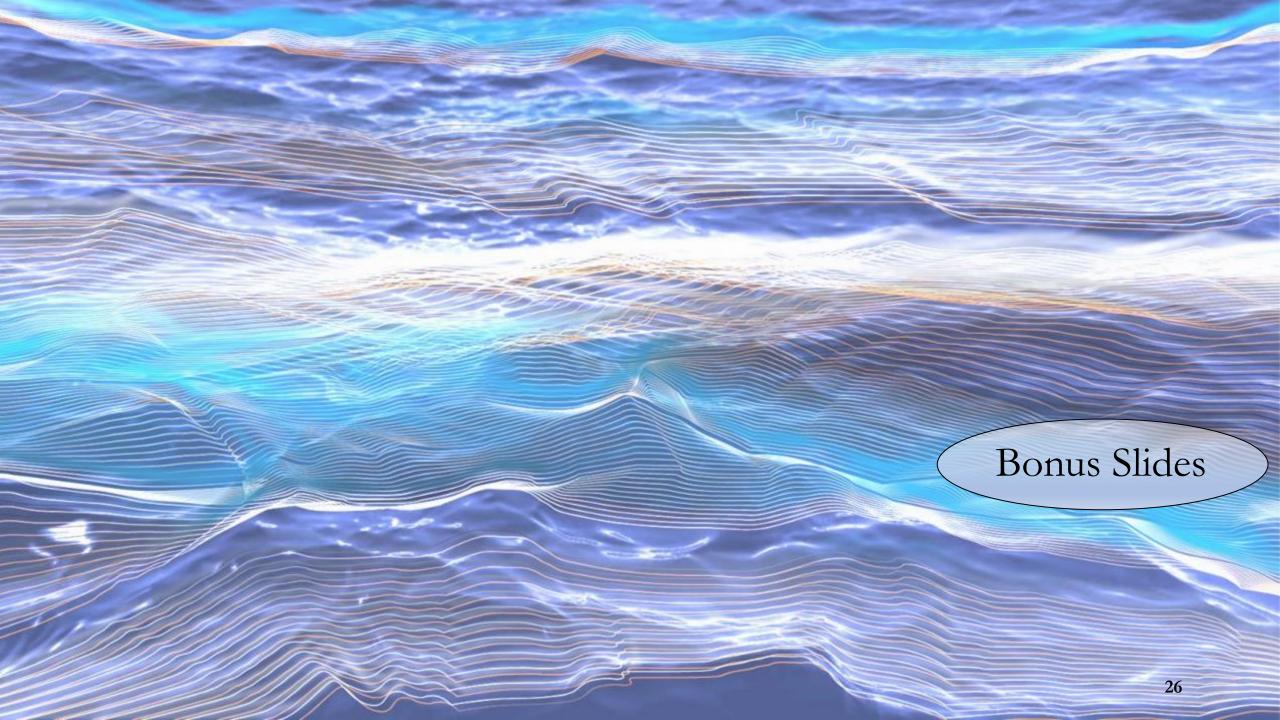
What we want to check <u>next</u>:

- Introduce back galaxies, based on clustering information, rather than randomly (led by R. Barbieri).

Thank you!

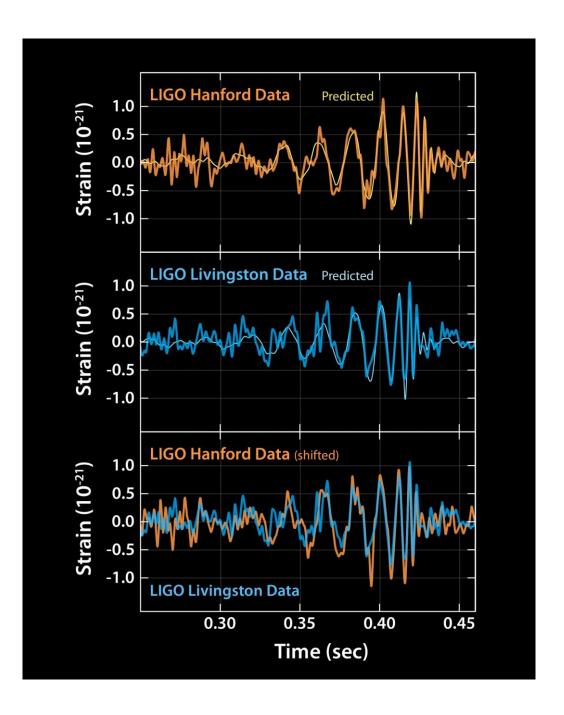
For questions, feel free to contact me at: mariok@roe.ac.uk

• Bonus slides below (for extra details)

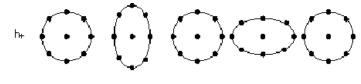


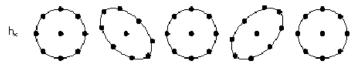
### Distance from GWs

Start by fitting a template to the observed signal.



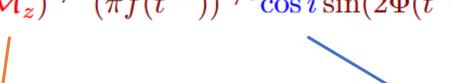
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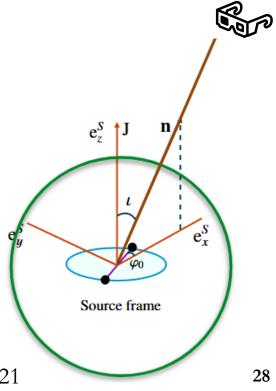


$$h_+(t, {\color{blue} i}) = \frac{4}{d_L(z)} \left( G \mathcal{M}_z \right)^{5/3} \left( \pi f(t^{\rm ret}) \right)^{2/3} \left( \frac{1 + \cos^2 i}{2} \right) \cos(2\Phi(t^{\rm ret}))^{\rm Phase} \quad \text{o} \qquad \text{in Since } 0 = 0.5 \text{ for } 0 =$$

$$h_{\times}(t, i) = \frac{4}{d_L(z)} (G\mathcal{M}_z)^{5/3} (\pi f(t^{\text{ret}}))^{2/3} \cos i \sin(2\Phi(t^{\text{ret}}))$$



$$\mathcal{M}_c \equiv (1+z)M_c = (1+z)\mu^{3/5}m^{2/5}$$



\*Based on D. Steer, 2021

### Distance from GWs

$$h_{+}(t, i) = \frac{4}{d_{L}(z)} (G\mathcal{M}_{z})^{5/3} (\pi f(t^{\text{ret}}))^{2/3} \left(\frac{1 + \cos^{2} i}{2}\right) \cos(2\Phi(t^{\text{ret}}))$$

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If we measure  $h_x$ ,  $h_+$ ,  $\dot{f}$ :

$$\dot{f}_{\rm gw}^{(\rm obs)} = \frac{96}{5} \pi^{8/3} \left( \frac{G\mathcal{M}_c(z)}{c^3} \right)^{5/3} [f_{\rm gw}^{(\rm obs)}]^{11/3}$$

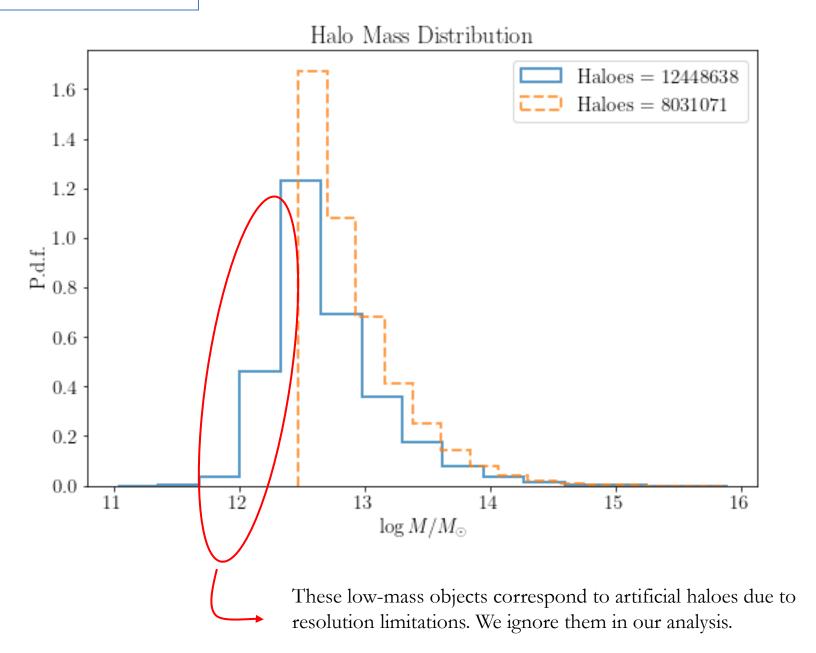
$$h_+ \to h_c (1 + \cos^2 \iota)/2$$

$$h_\times \to h_c \cos \iota$$

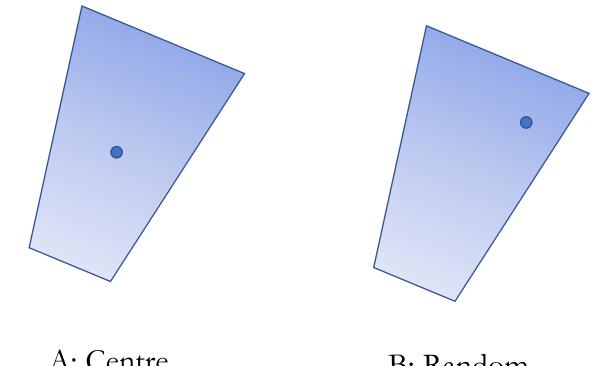
$$\cos \iota$$

Dark Sirens (Simulation Technicalities)

### Mass threshold



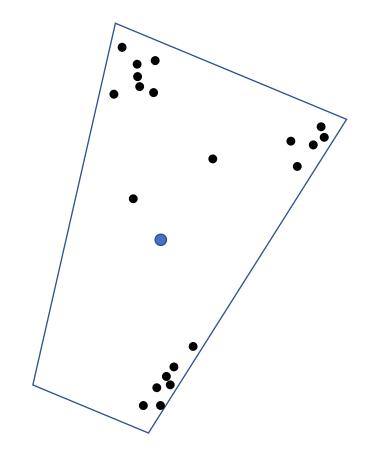
- GW source selection
- Cone centre selection
- Periodic Boundary conditions



B: Random

- GW source selection
- Cone centre selection
- Periodic Boundary conditions

## Possible artificial configurations

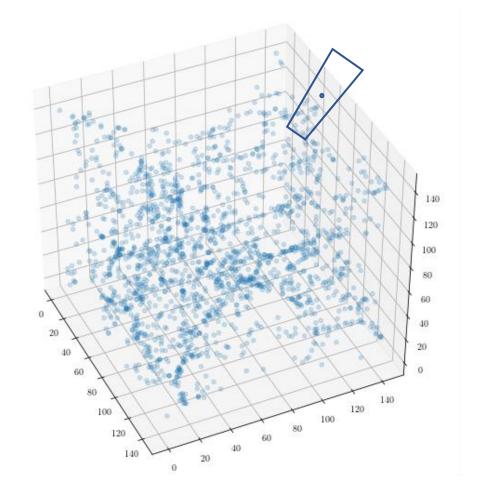


Centre in random coordinates (instead of halo)

– not that important in terms of statistics.

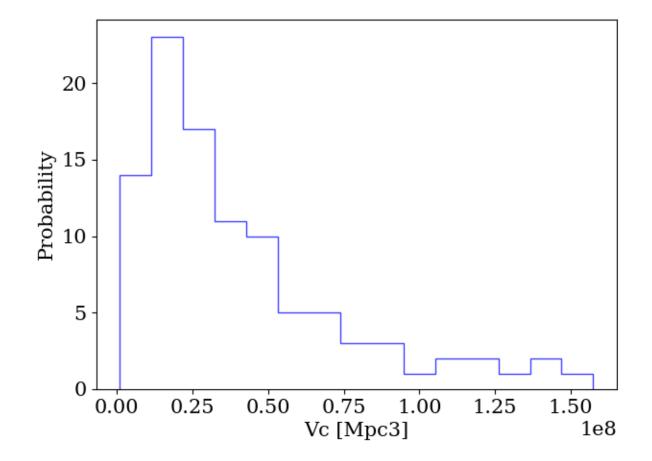
## Missing galaxies (bias towards lower Ho)

- GW source selection
- Cone centre selection
- Periodic Boundary conditions



#### • Volume effects

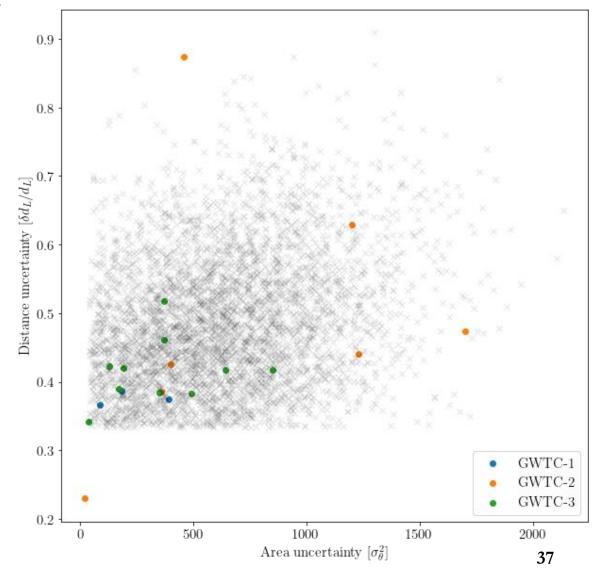
The volumes of our cones, in the fiducial case are consistent with observations, but we have about an order of magnitude fewer haloes inside our cones (than observations).



Dark Sirens (and the Hubble tension)

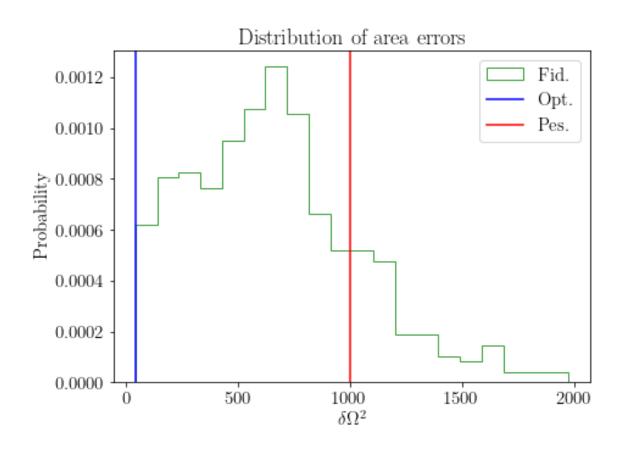
### Error Distribution

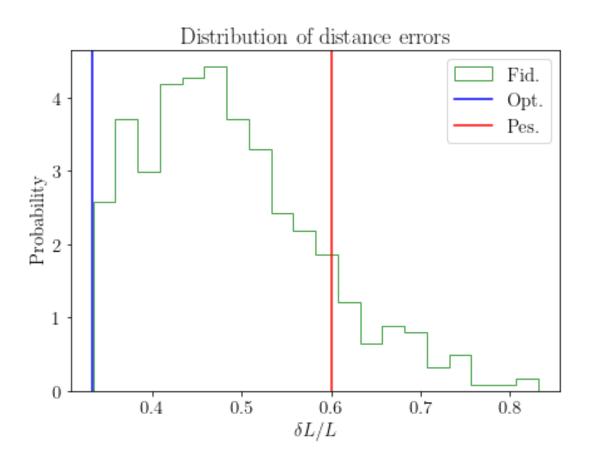
When selecting the cone sizes, we draw the distance & sky localisation errors from a distribution that mimics well localised events from the first three observing runs.



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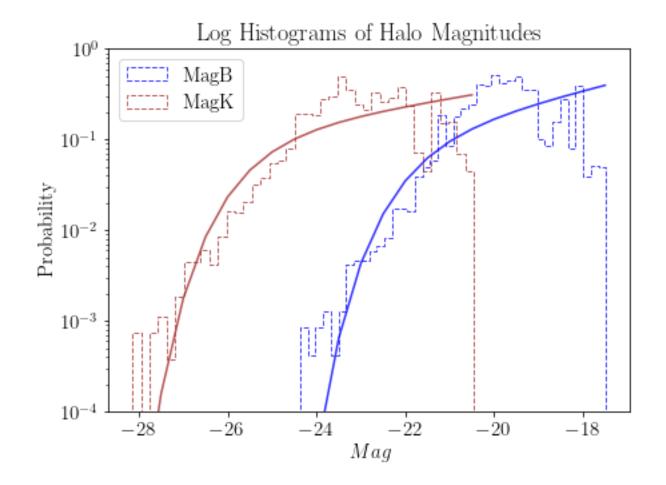


# Magnitudes & Masses of the galaxies

We give physical properties to our haloes, by using a ML approach, trained on IllustrisTNG data. The latter provide eight bands: U, B, V, K, g, r, i, z. Magnitudes based on the summed-up luminosities of all the stellar particles of the group.

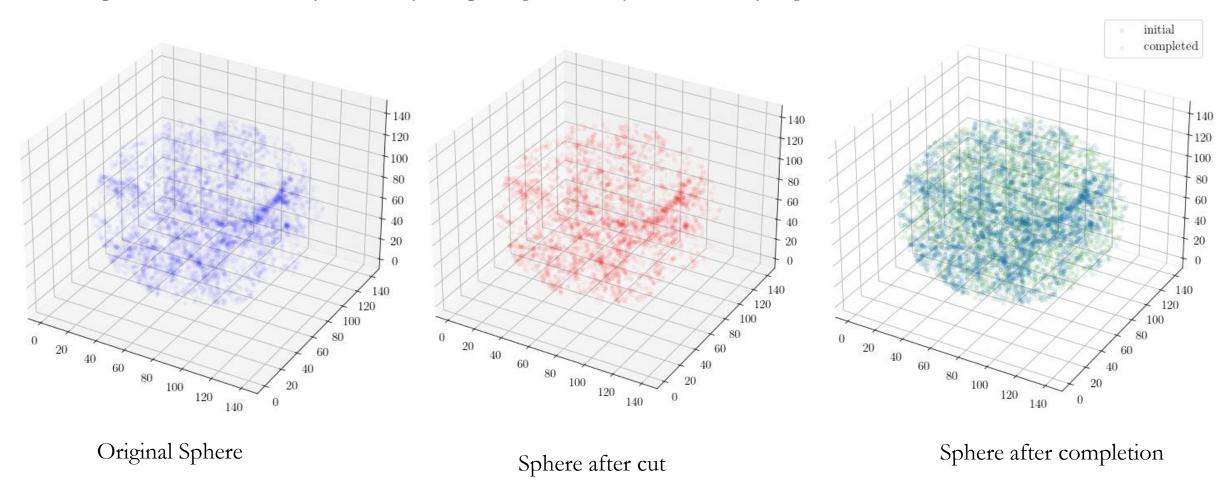
By using SubhaloSpin, SubhaloV max, SubhaloVelDisp, and SubhaloMass, as our probes, we provide B & K magnitudes & SFRs for our DM haloes (see McGibbon & Khochfar 2021 for details). Galaxies masses are calculated using the Stellar-to-Halo mass relation from Girelli et al. 2020).

**Right**: Sanity check that our ML magnitudes follow a Schechter magnitude function.



# Completeness fractions

Observational limitations would lead to galaxies missing from the surveys. We need to take these into account when calculating the Ho posterior. We do this by uniformly completing the surveys, before analysing them.



# Completeness fractions

When completing the survey, we make sure that the missing galaxies in each cone follow the global completeness fraction.

