

# Joint cosmological and gravitational-wave population inference using dark sirens and galaxy catalogues

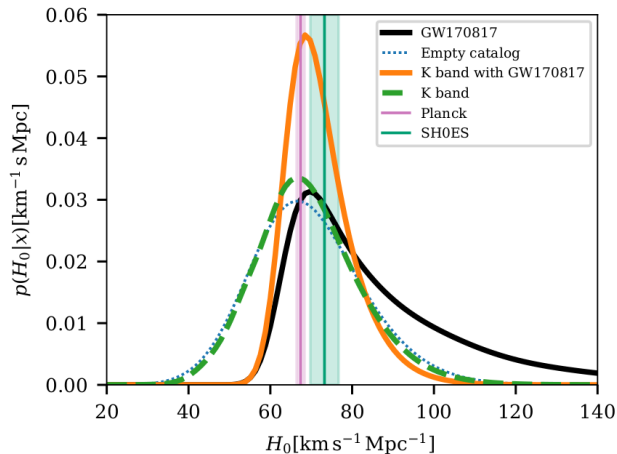
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## O3 result LVK Cosmology group



Constraints on the cosmic expansion history from the third LIGO–Virgo–KAGRA Gravitational-Wave Transient Catalog (using `gwcosmo`) 2021

# Why did we need to rewrite the method?

The previous version of `gwcsmo` was slow

- We expect more events during Run O4
- The resulting  $H_0$  posterior depends on
  - BH mass distribution
  - CBC merger rate (with  $z$ )

→ informative priors impact the result and introduce a bias

Before, `gwcsmo` was too computationally expensive to vary these inputs.

→ any hyperparameters were fixed

The new version (1000x faster) allows joint estimation of cosmological and compact binary population parameters

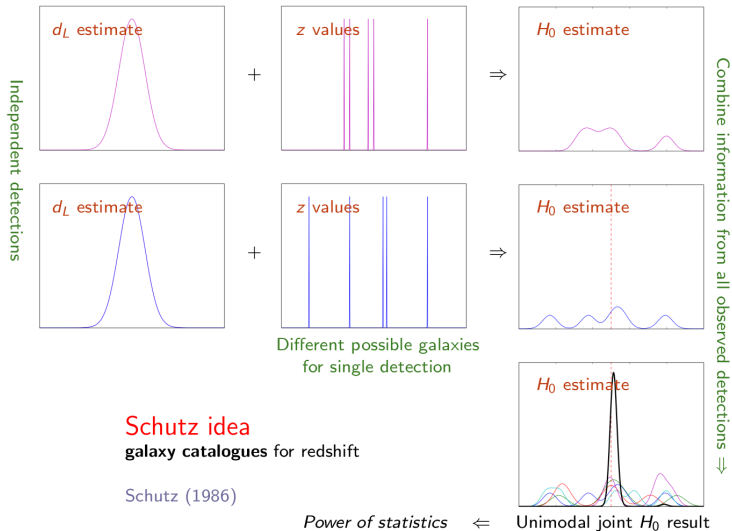
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# Theory of the 'Dark Siren' method

$$H_0 d_L \approx cz$$

- $d_L$ : GW data
- $z$ : EM data
  - Bright siren  
EM counterpart
  - Dark siren  
Marginalize over galaxies  
LOS Redshift Prior



# LOS redshift prior

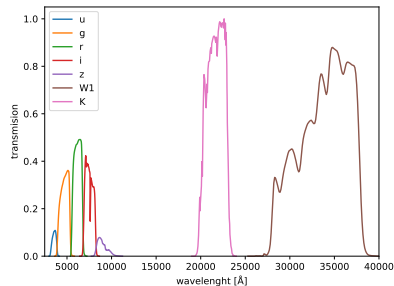
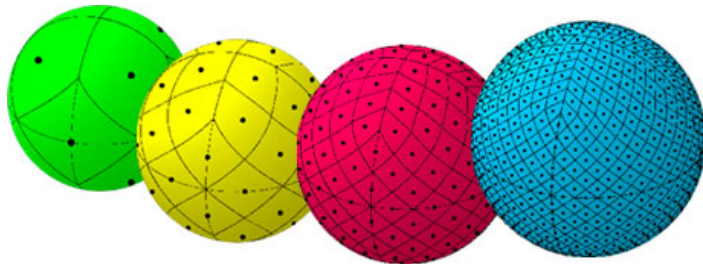
Contains the redshift information from galaxies in a galaxy catalogue

Divide the sky into Healpy pixels

Healpix: python package

For each pixel compute a probability array along redshift

For different observation bands (B, K, bJ, W1)

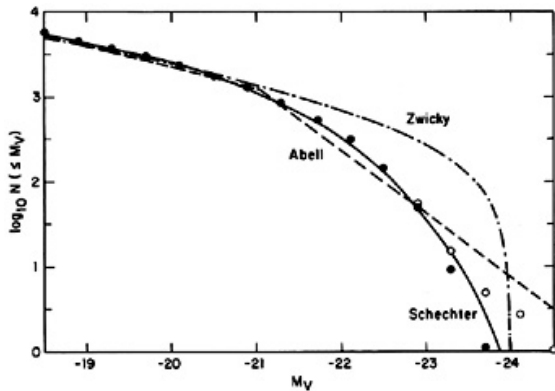
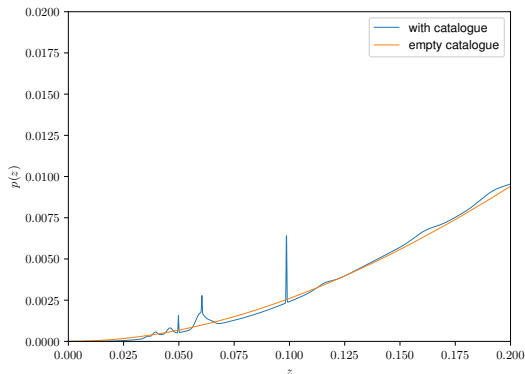


# LOS redshift prior

One healpy pixel

In-catalogue contribution: Gaussian peaks corresponding to galaxies

Out-of-catalogue contribution: Galaxies uniformly distributed in comoving volume and luminosities following a Schechter function distribution

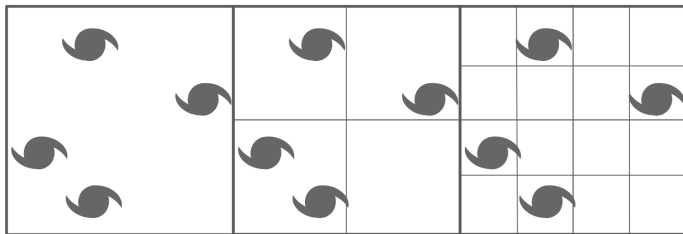


- Pros
  - Precomputed object  $\rightarrow$  only calculate once and faster analysis
  - Independent of cosmological and population parameters
- Cons
  - Large file, grows with resolution, but not with number of galaxies
  - Within each pixel, angular position information about the galaxies is lost



## LOS redshift prior

Implicit angular resolution dependence in galaxy weighting and magnitude thresholds



Ensure convergence for increasing angular resolution

Define 2 levels of resolution:  $n_{\text{map}}$  and  $n_{\text{high}}$

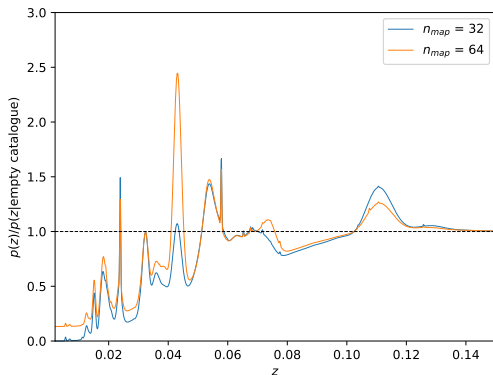
Calculate the effective number of galaxies at  $n_{\text{map}}$  and adjust to  $n_{\text{high}}$

# GW190814: LOS redshift prior

Most informative event

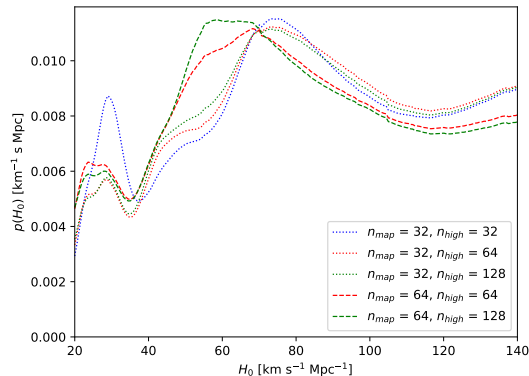
Weighted sum of LOS zpriors of multiple pixels

Illustrates over- and underdensities compared to the empty catalogue distribution



## GW190814: $H_0$ posterior

Peak position depends on  $n_{\text{map}}$  and  $n_{\text{high}}$   
The results using  $n_{\text{map}} = 32$  are more robust



# Results and comparison

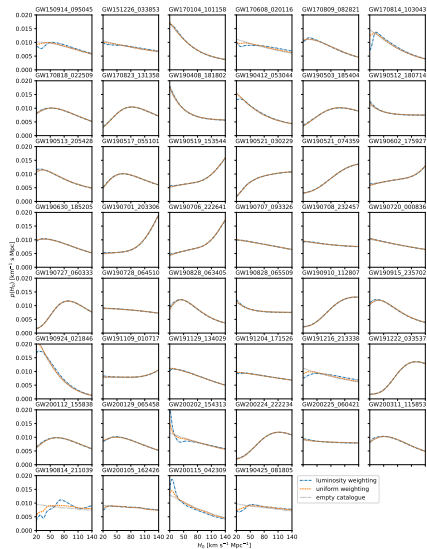
Compare results from the previous and new method  
GW events from GWTC-3 catalogue with SNR > 11

- 42 BBHs
- 2 NSBH (GW200105 and GW200115)
- 2 BNS (GW170817 and GW190425)
- 1 asymmetric mass binary (GW190814), treated as NSBH

GLADE+ galaxy catalogue *K*-band

Same fixed population assumptions

# Results and comparison



3 cases:

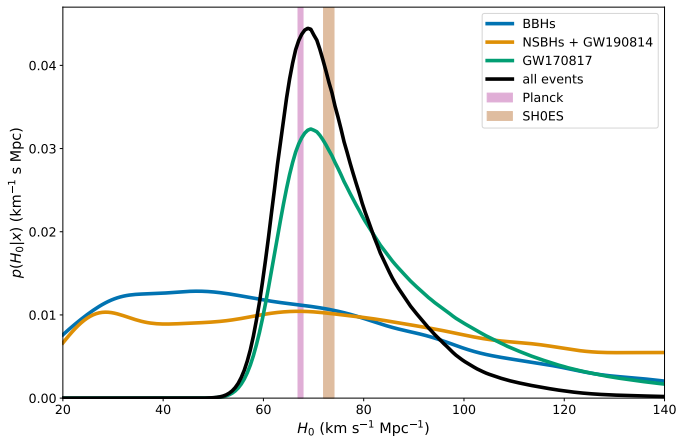
- luminosity weighting
- uniform weighting
- empty catalogue

Observations:

- Adding galaxies makes events more informative
- Luminosity weighting makes events more informative
- All cases behave the same at high  $z$

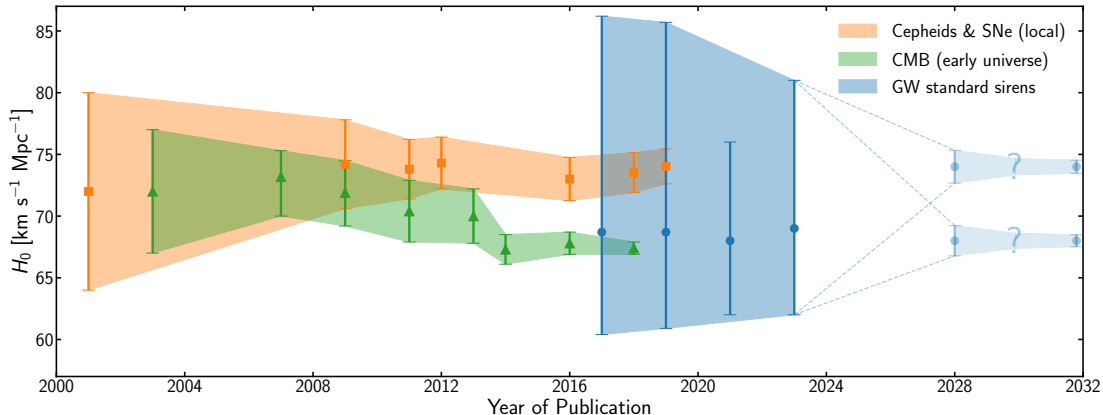
## Results and comparison

The galaxy catalogue analysis of GWTC-3 with fixed population assumptions



# Results and comparison

## $H_0$ measurements over time



# Future plans

Extend `gwcs` with galaxy cluster catalogue information

Galaxy catalogues are limited, and very incomplete at higher redshifts

Galaxy cluster catalogues (from X-ray surveys) are expected to be more complete up to higher redshifts, thus they can complement the data from galaxy catalogues

`gwcs` LOS `z` prior

- Now contains  
in-catalogue + out-of-catalogue
- Add cluster catalogue information  
in-catalogue + **in-cluster-catalogue** + out-of-catalogue