

# Cosmological constraints: the Hubble constant

Wilmar Alberto Cardona Castro

September 22, 2016

# Contents

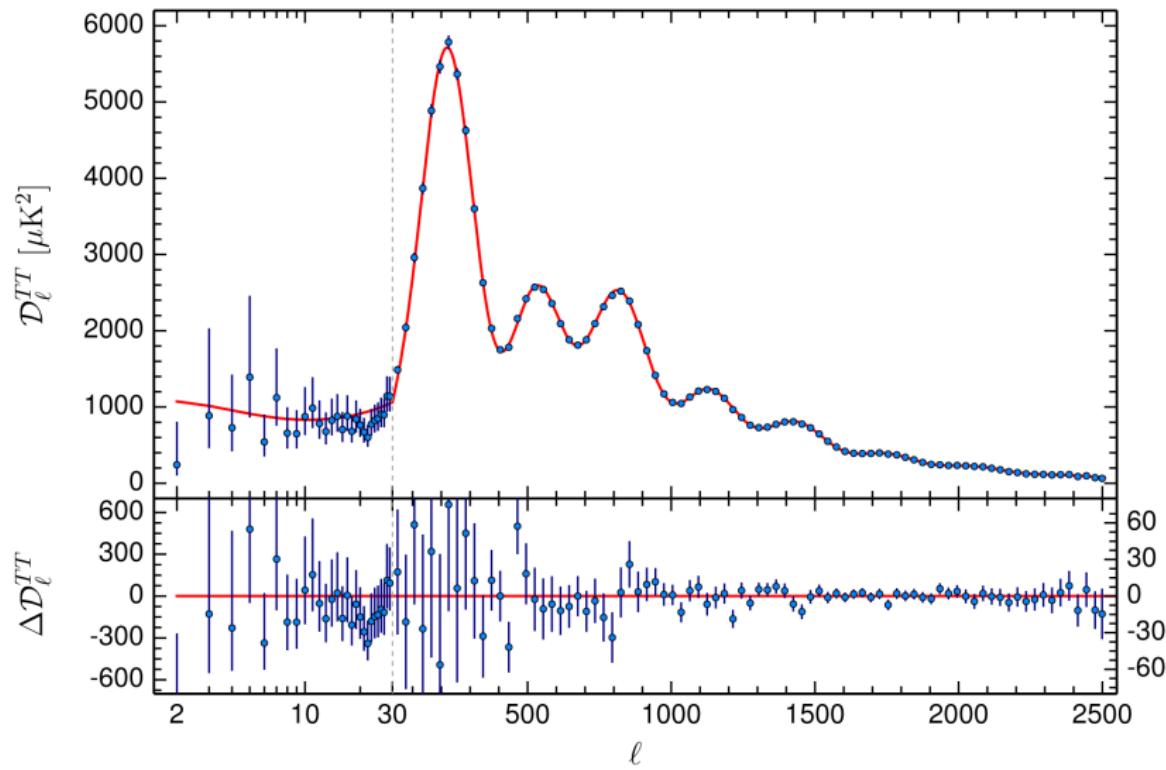
The concordance model of cosmology

Measuring the Hubble constant

Conclusions

# The concordance model of cosmology

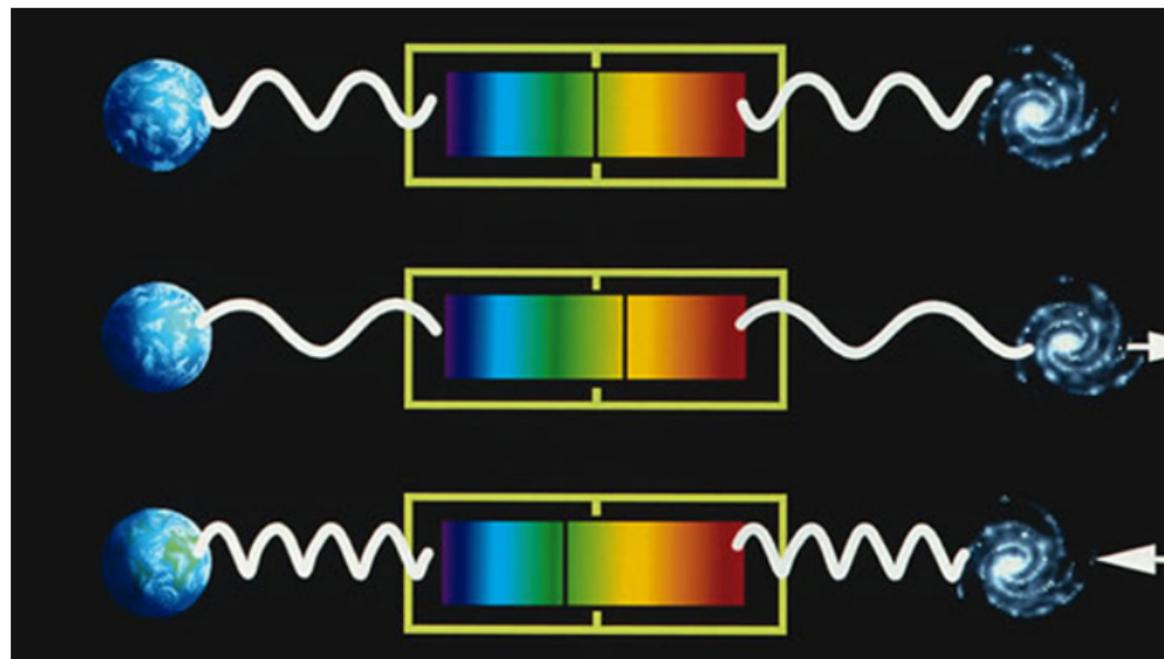
A good phenomenological description of the Universe



# The concordance model of cosmology

Two important observational facts from the past century

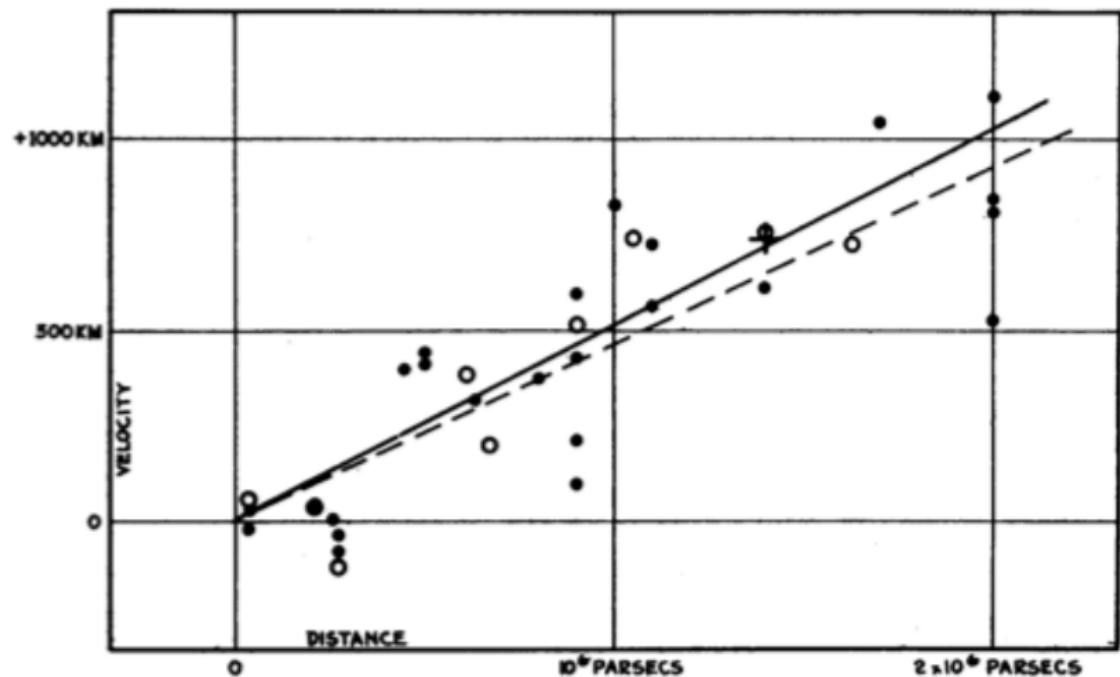
The Universe is expanding (1929)



# The concordance model of cosmology

Two important observational facts from the past century

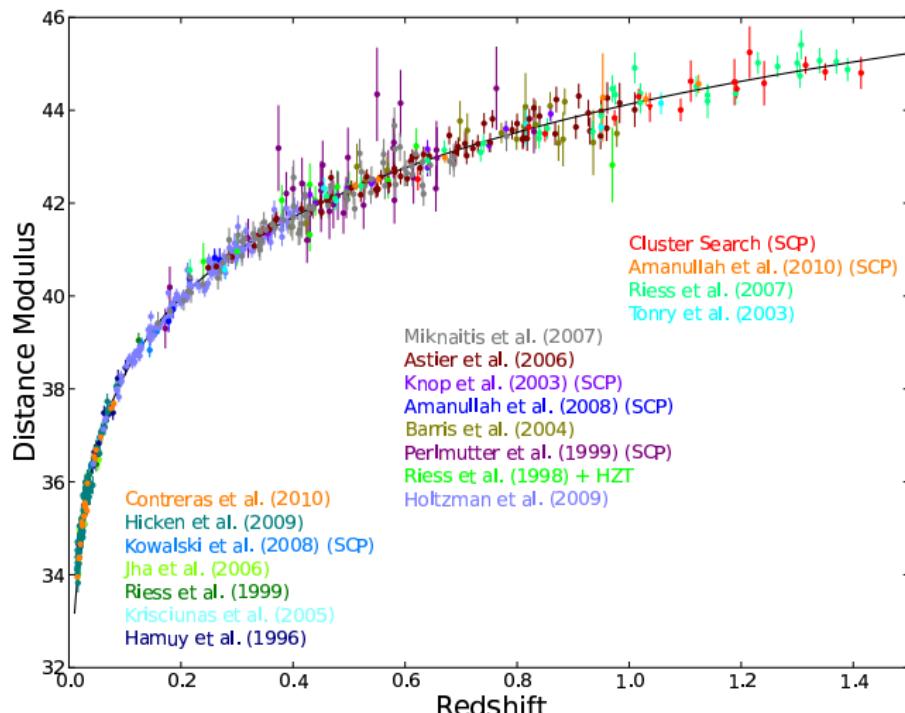
The Universe is expanding (1929):  $v \propto D = a(t)d$



# The concordance model of cosmology

Two important observational facts from the past century

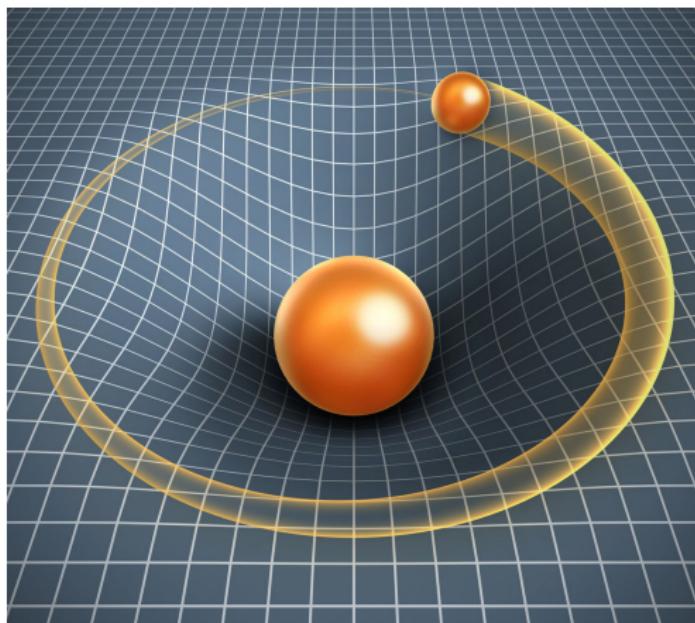
The Universe is speeding up:  $\ddot{a}(t) > 0$



# The concordance model of cosmology

## Gravity

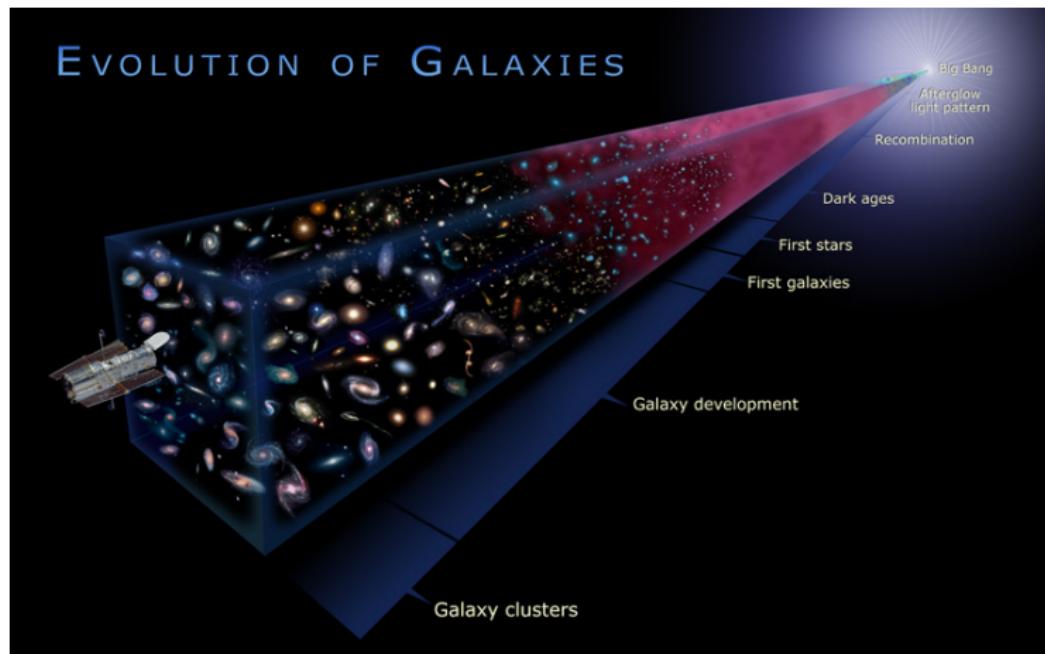
General Relativity: (geometry)  $G_{\mu\nu} \propto T_{\mu\nu}$  (energy)



# The concordance model of cosmology

## Gravity

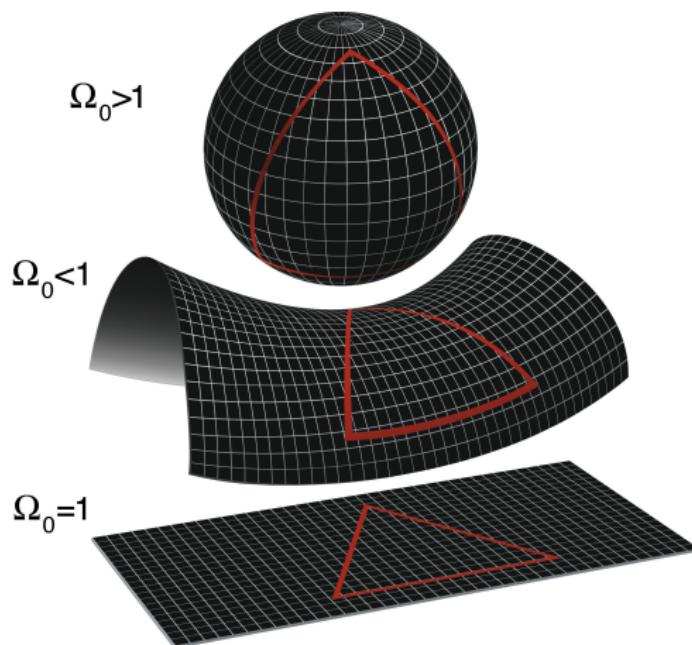
Matter collapses



# The concordance model of cosmology

Flatness and isotropy

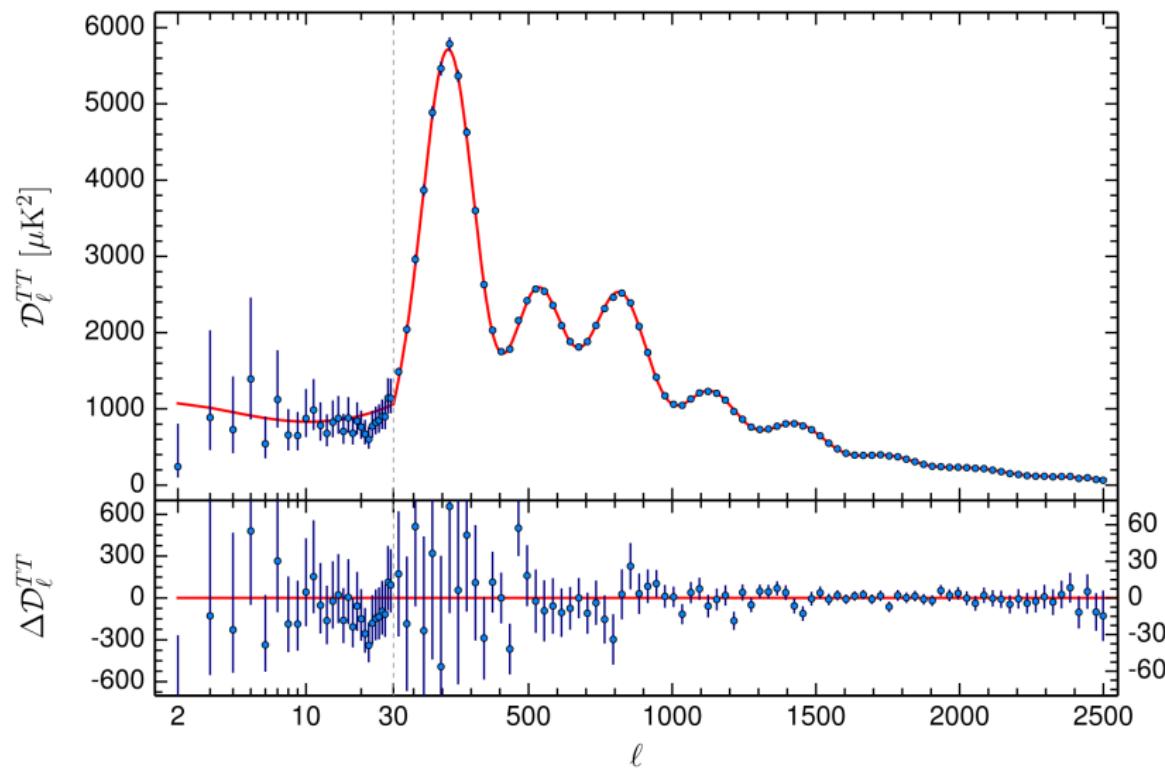
Possible geometries in the standard model



# The concordance model of cosmology

Flatness and isotropy

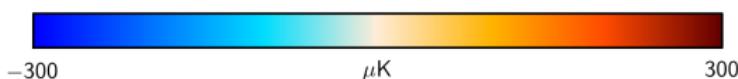
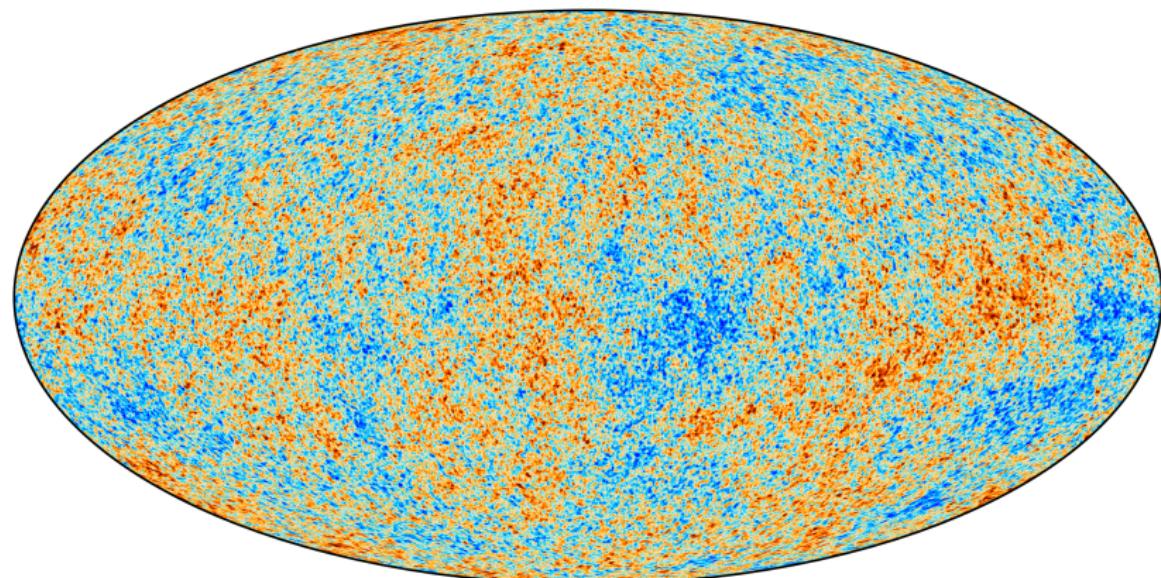
Planck constrains  $|\Omega_K| < 0.005$



# The concordance model of cosmology

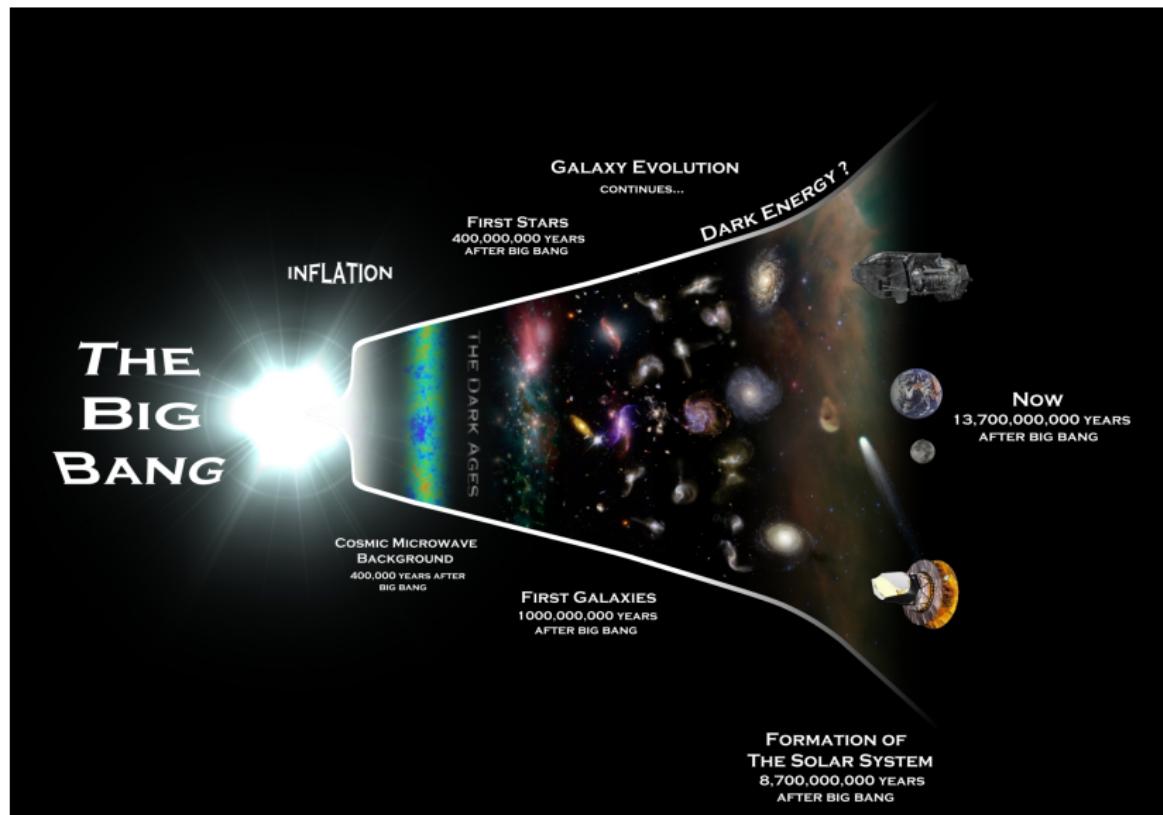
## Flatness and isotropy

CMB is very isotropic:  $\Delta T \ll \bar{T} = 2.7\text{K}$



# The concordance model of cosmology

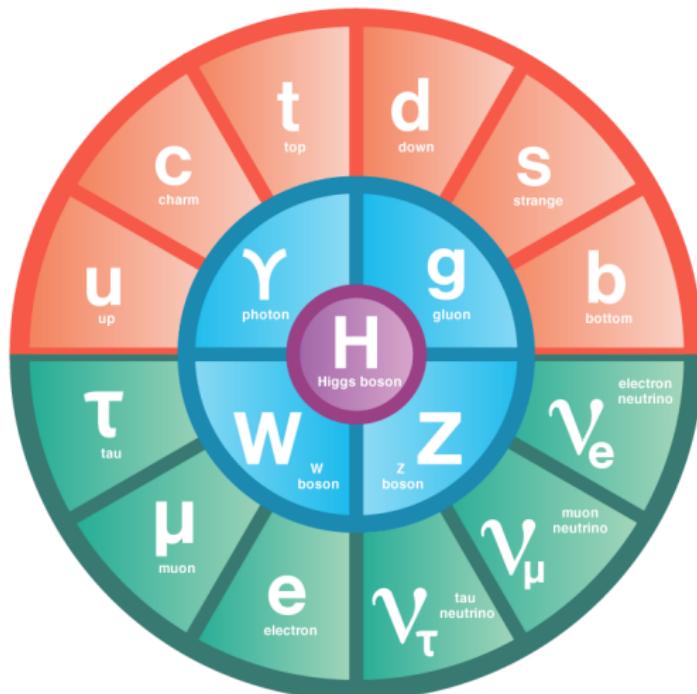
Visible matter



## The concordance model of cosmology

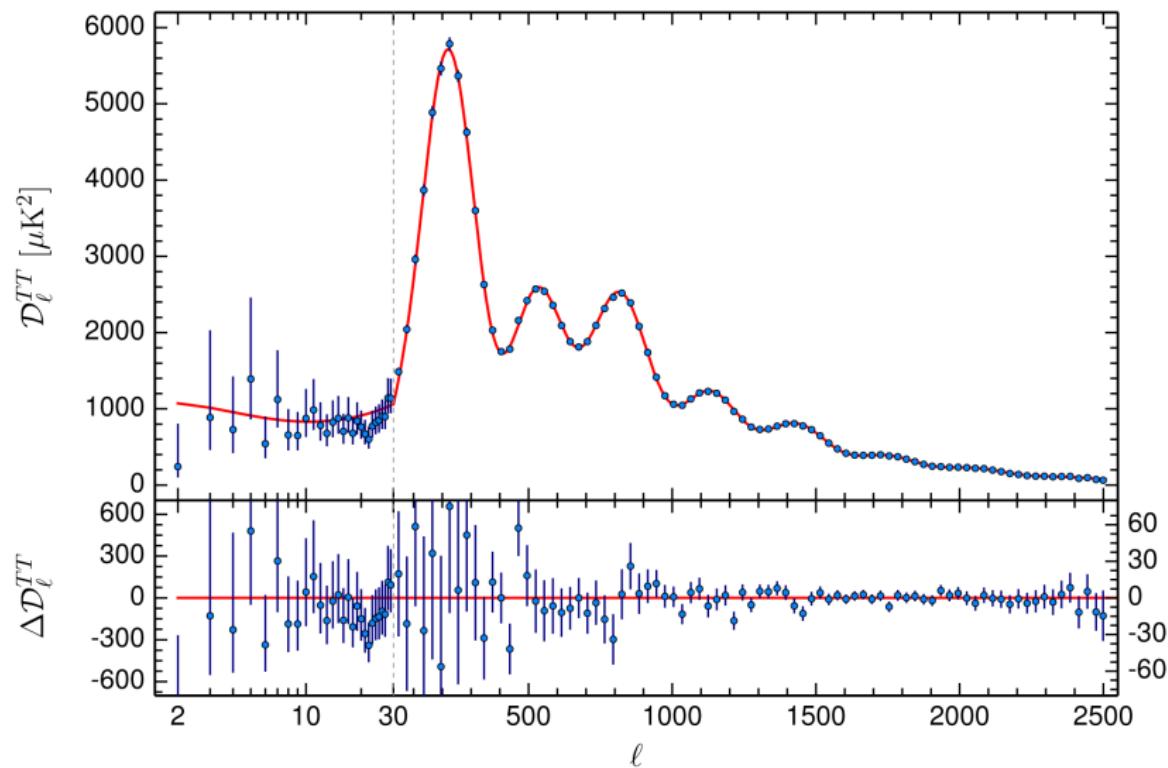
## Visible matter

$$\sum m_\nu ?$$



# The concordance model of cosmology

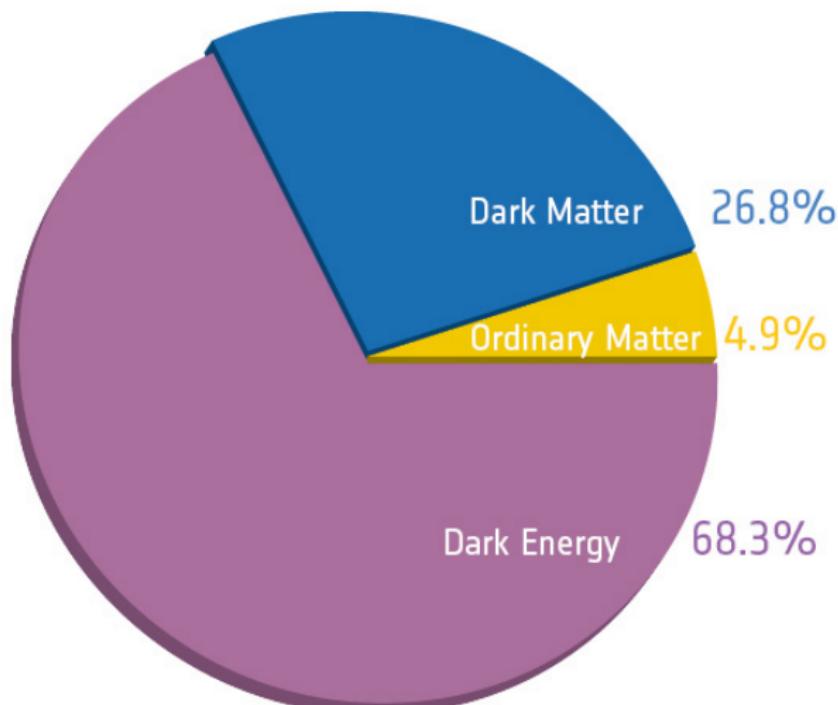
## Dark Matter and Dark Energy



# The concordance model of cosmology

## Dark Matter and Dark Energy

$\nu$  are the only known DM candidates



# The concordance model of cosmology

## Dark Matter and Dark Energy

Since DE dominates now, its pressure must be negative



# The concordance model of cosmology

A few shortcomings

- ▶ Flatness ( $|\Omega_K| < 0.005$ ) ?

# The concordance model of cosmology

A few shortcomings

- ▶ Flatness ( $|\Omega_K| < 0.005$ ) ?
- ▶ Horizon

# The concordance model of cosmology

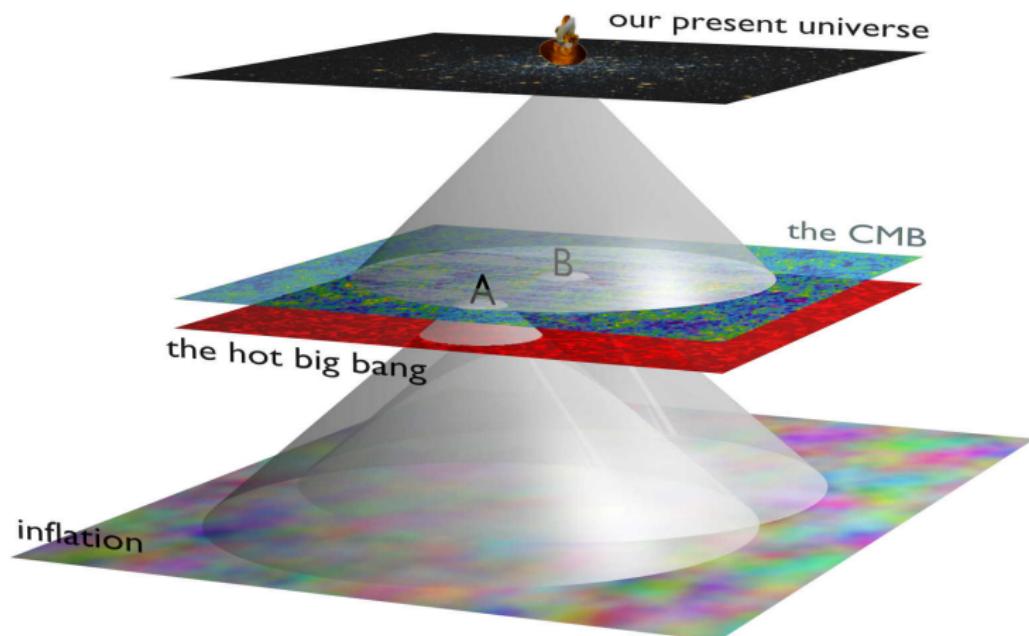
A few shortcomings

- ▶ Flatness ( $|\Omega_K| < 0.005$ ) ?
- ▶ Horizon
- ▶ What is the origin of the density perturbations  $\delta\rho_i/\rho_i$  we observe today: (e.g., CMB anisotropies, galaxies) ?

# The concordance model of cosmology

## Inflation

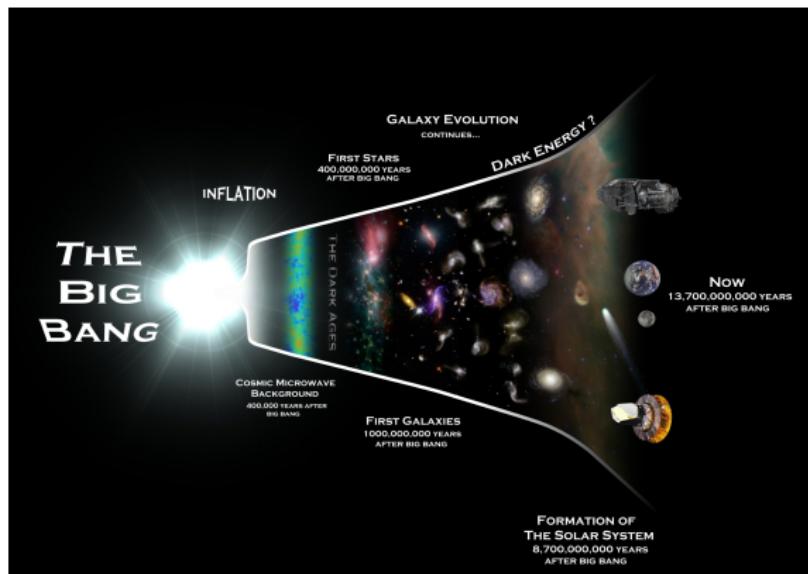
The potential energy of an evolving scalar field would have dominated the energy content in the very early universe, so that its pressure was negative and  $\ddot{a}(t) > 0$



# The concordance model of cosmology

## Inflation

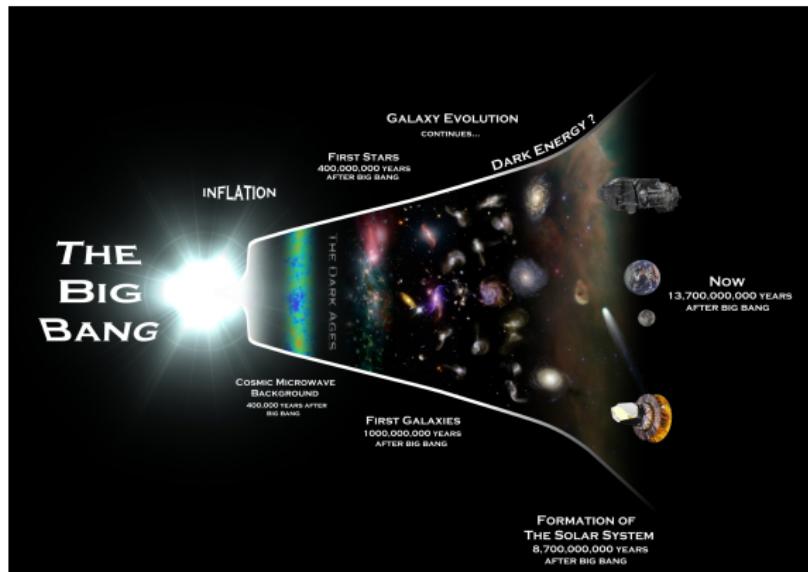
Quantum fluctuations of the scalar field would have seeded the density perturbations we see today: CMB anisotropies and LSS



# The concordance model of cosmology

$\Lambda$ CDM phenomenologically successful, but...

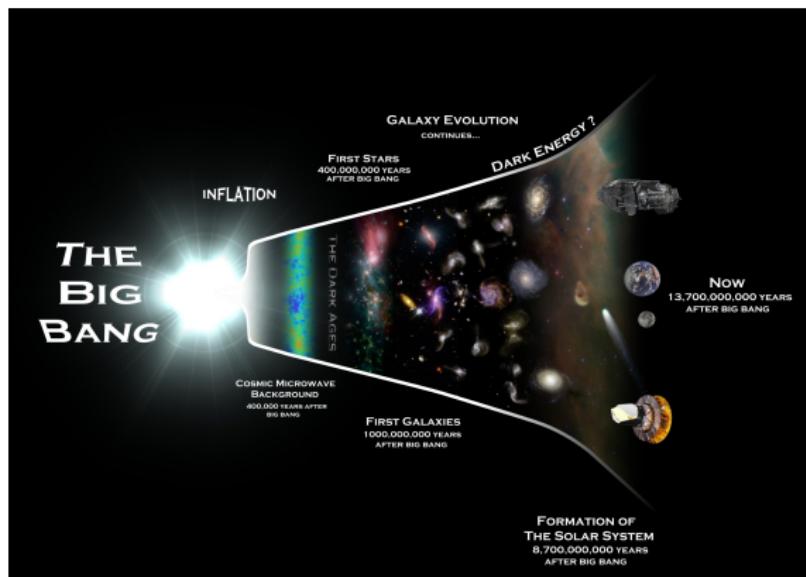
What is DM ? and  $\sum m_\nu$  ?



# The concordance model of cosmology

$\Lambda$ CDM phenomenologically successful, but...

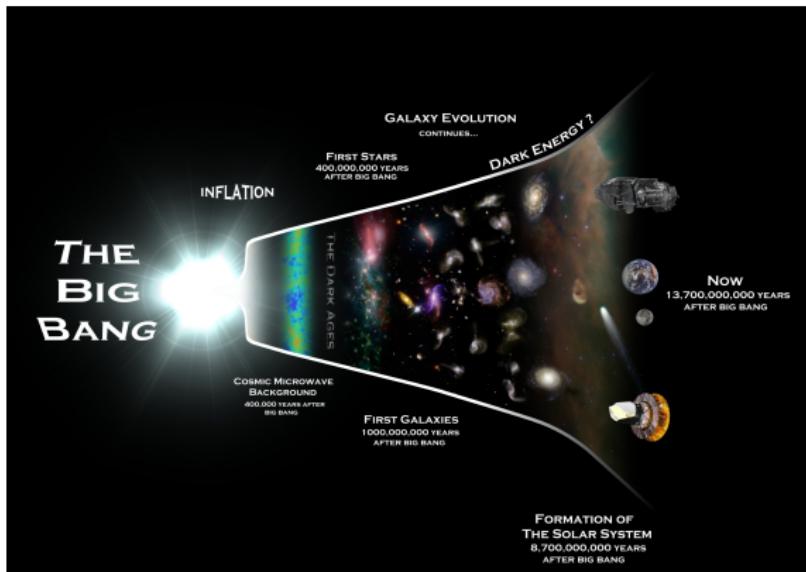
What is driving the accelerating expansion of the Universe ? DE ?  
Modified gravity ?



# The concordance model of cosmology

$\Lambda$ CDM phenomenologically successful, but...

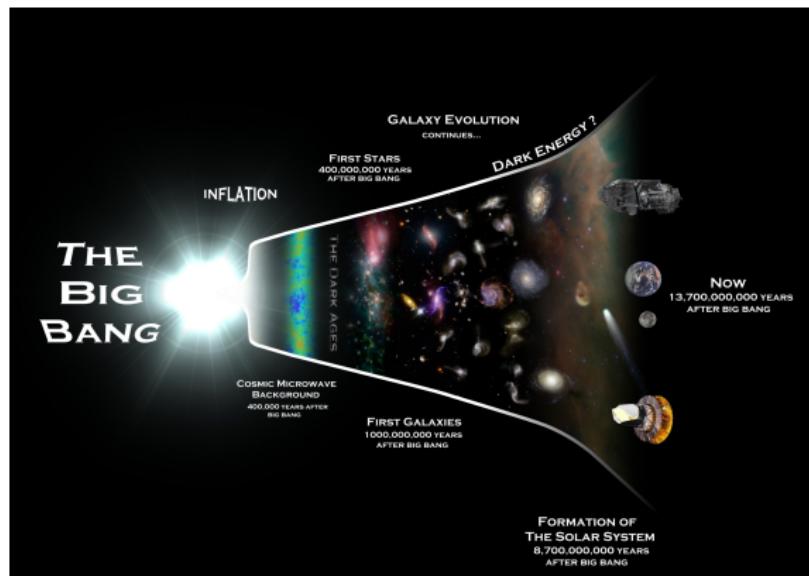
What mechanism produced inflation ?



# The concordance model of cosmology

$\Lambda$ CDM phenomenologically successful, but...

To what extent are valid the assumptions of the standard model  
?



# This thesis

- ▶ Constraints on Anisotropic Dark Energy: Dark Eenergy vs Modified Gravity

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- ▶ Importance of lensing convergence for constraints of  $\sum m_\nu$  with upcoming galaxy surveys

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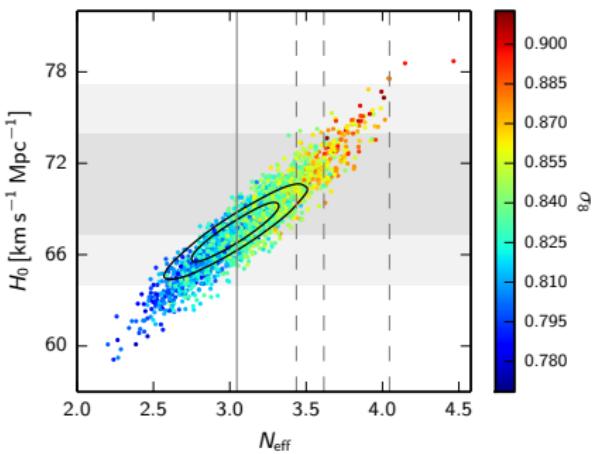
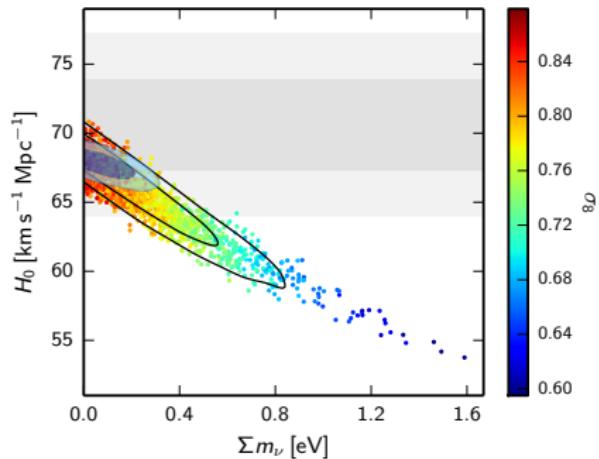
- ▶ Constraints on Anisotropic Dark Energy: Dark Eenergy vs Modified Gravity
- ▶ Importance of lensing convergence for constraints of  $\sum m_\nu$  with upcoming galaxy surveys
- ▶ A test of statistical isotropy with Planck data

# This thesis

- ▶ Constraints on Anisotropic Dark Energy: Dark Energy vs Modified Gravity
- ▶ Importance of lensing convergence for constraints of  $\sum m_\nu$  with upcoming galaxy surveys
- ▶ A test of statistical isotropy with Planck data
- ▶ Measurement of the Hubble constant without rejecting data

# Measuring the Hubble constant

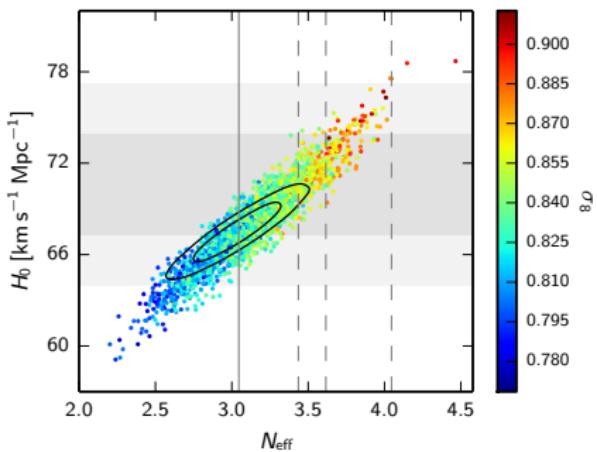
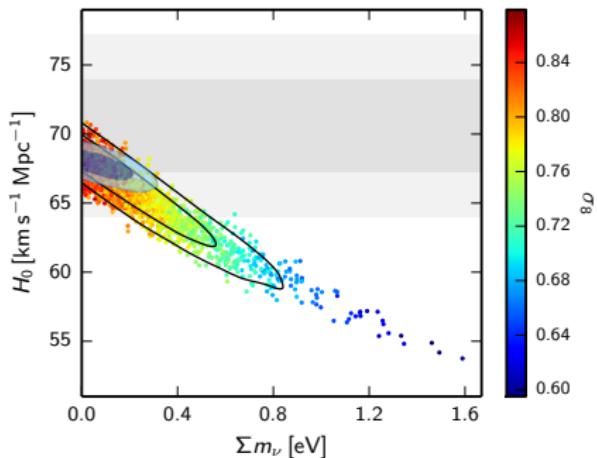
Why do we care about a local measurement of  $H_0$ ?



Crucial for understanding the standard model of cosmology (i.e., it sets cosmological scales, tackle cosmological parameters and break degeneracies)

# Measuring the Hubble constant

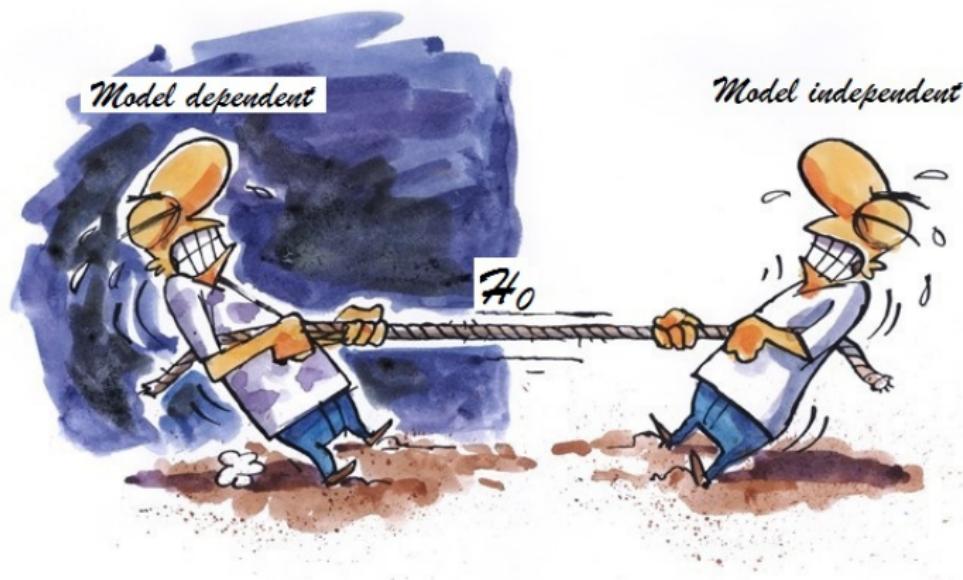
Why do we care about a local measurement of  $H_0$ ?



Inferred determinations are model dependent (e.g., properties of neutrinos, theory of gravity, nature of dark energy) and might be affected by assumed prior probability distributions

# Measuring the Hubble constant

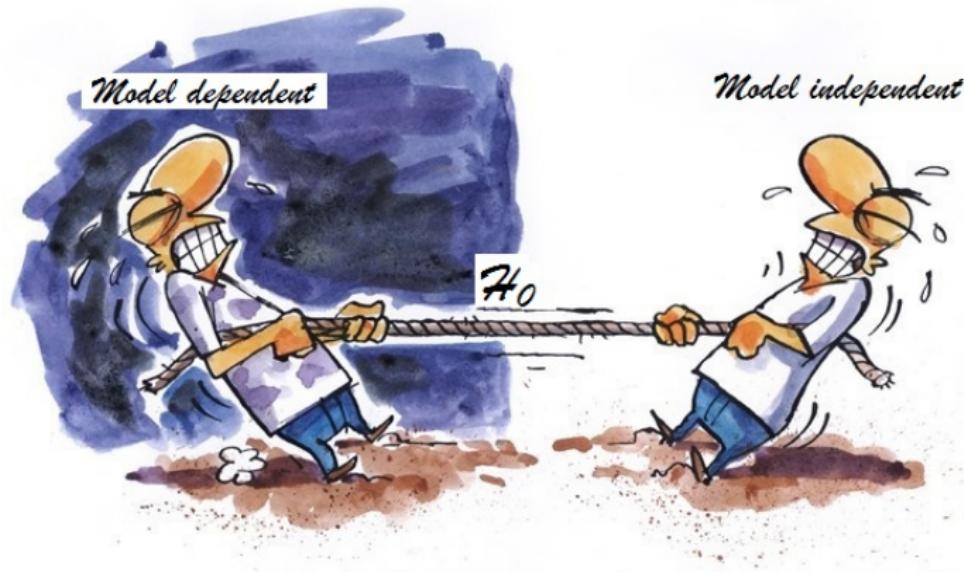
Why do we care about a local measurement of  $H_0$ ?



There is a  $3.4\sigma$  tension between direct and inferred determinations of  $H_0$

# Measuring the Hubble constant

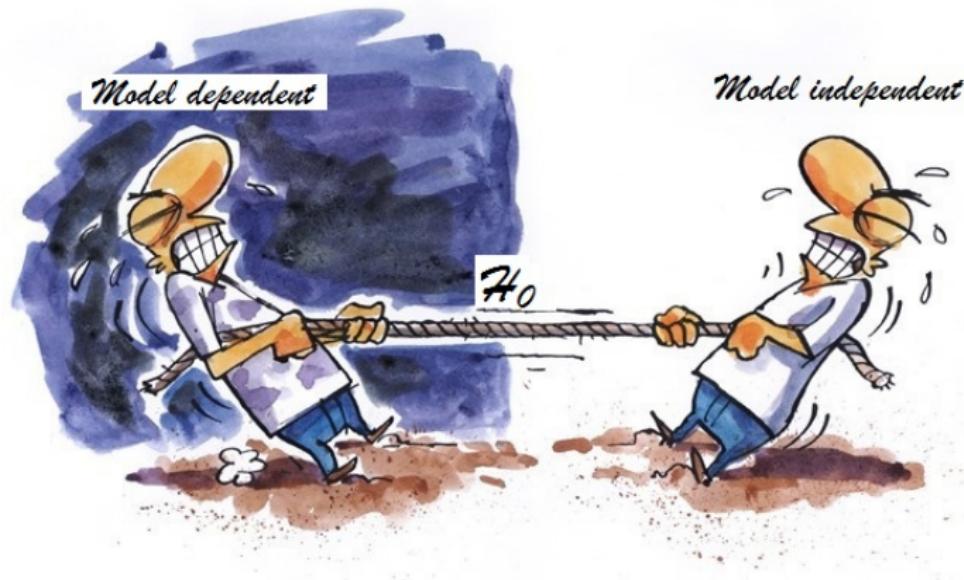
Why do we care about a local measurement of  $H_0$ ?



New physics (e.g., modifying assumptions in the concordance model), contributions of the local gravitational potential, unaccounted second-order corrections to the background distance-redshift relation ?

# Measuring the Hubble constant

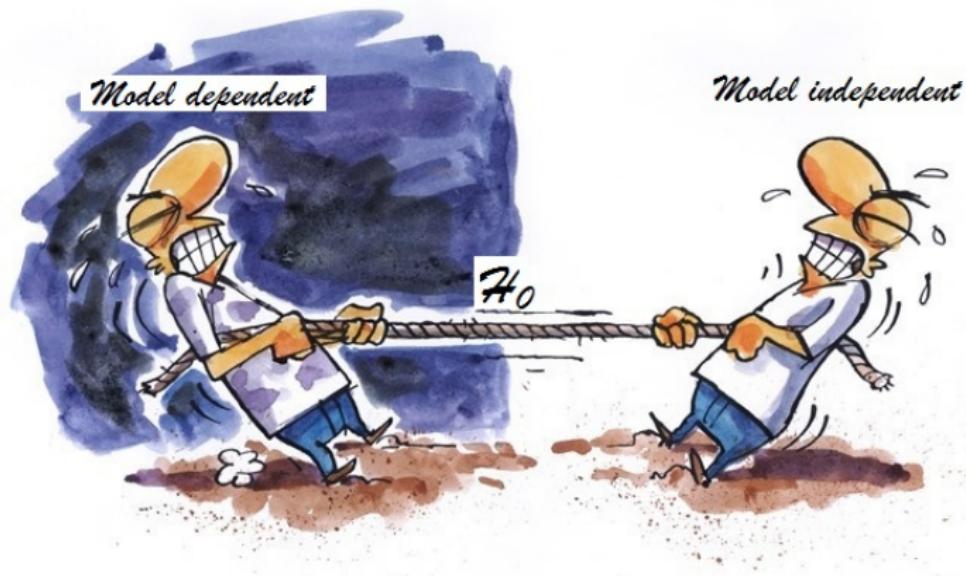
Why do we care about a local measurement of  $H_0$ ?



Issues with statistical analysis (e.g., outlier rejection algorithms, anchors choice, period cut-off and assumptions in the Leavitt law, unaccounted systematics) ?

# Measuring the Hubble constant

Why do we care about a local measurement of  $H_0$ ?



Need to confirm  $3.4\sigma$  tension and prove it robust against different statistical approaches.

# Measuring the Hubble constant

How do we measure  $H_0$ ?



- ▶ Estimate distances through luminosity distance

$$d_L \equiv \left( \frac{L}{4\pi I} \right)^{1/2}$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?



- ▶ Define logarithmic measures of the luminosity

$$I = 10^{-2m/5} \times 2.52 \times 10^{-5} \text{ erg/cm}^2 \text{ s}$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?



- ▶ Define logarithmic measures of the luminosity

$$L = 10^{-2M/5} \times 3.02 \times 10^{35} \text{ erg/s.}$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?



- ▶ Express luminosity distance through the distance modulus

$$\mu_0 \equiv m - M = 5 \log_{10} \left( \frac{d_L}{1\text{Mpc}} \right) + 25$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ Assuming flat FLRW metric one can compute luminosity distance

$$d_L(z) = (1+z)c \int_0^z \frac{dz'}{H(z')}$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ For relatively small redshift one has

$$d_L(z) \equiv \frac{cz}{H_0}(1 + \delta(z))$$

- ▶ Recalling

$$\mu_0 \equiv m - M = 5 \log_{10} \left( \frac{d_L}{1\text{Mpc}} \right) + 25$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

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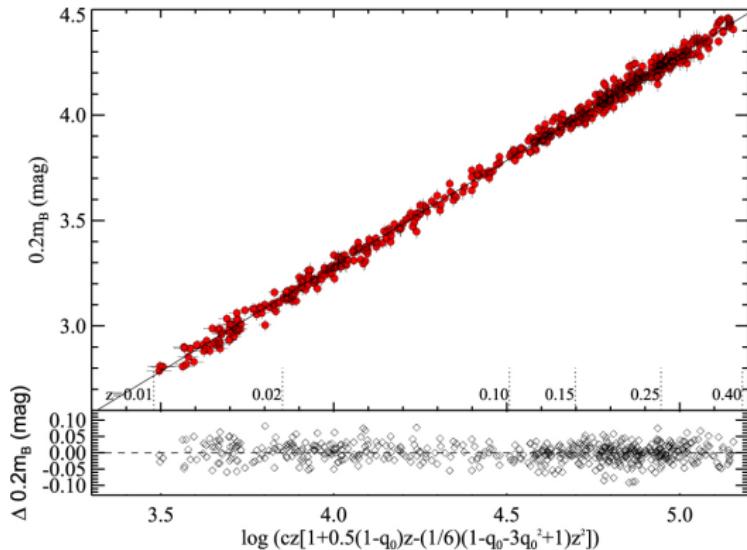
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# Measuring the Hubble constant

How do we measure  $H_0$ ?



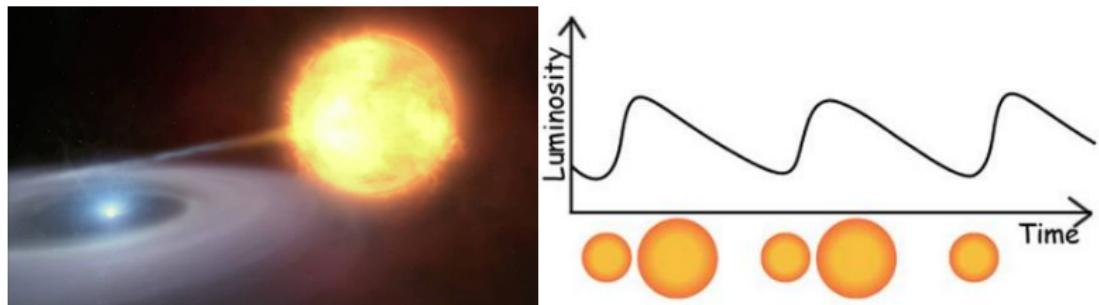
- ▶ Determine constant  $a_X$  with Supernova type Ia (SNe Ia))

$$5 \log_{10}(cz(1 + \delta(z))) - m_X = 5 \log_{10} H_0 - M_X - 25 \equiv 5a_X$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

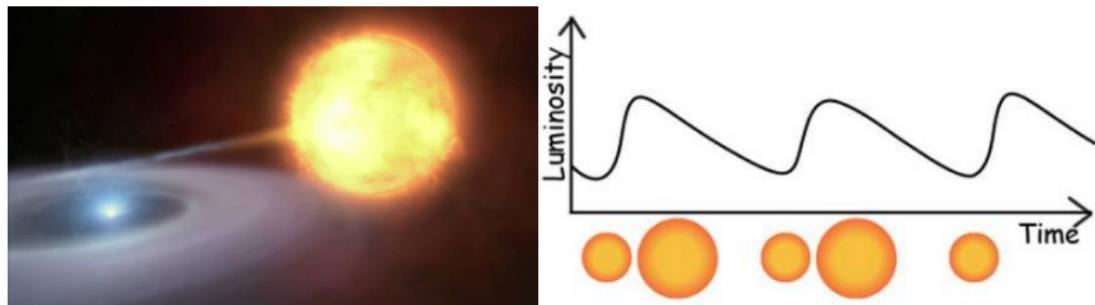
- ▶ Use now simultaneously SNe Ia and Cepheid stars



# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ Use now simultaneously SNe Ia and Cepheid stars



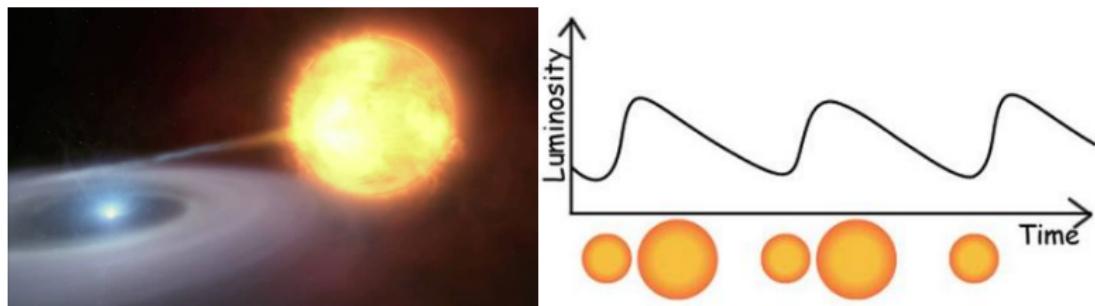
- ▶ SNe Ia apparent magnitudes

$$m_X^{\text{SNe Ia}} = 5 \log_{10} H_0 + \mu_0 - 5a_X - 25$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ Use now simultaneously SNe Ia and Cepheid stars



- ▶ SNe Ia apparent magnitudes

$$m_X^{\text{SNe Ia}} = 5 \log_{10} H_0 + \mu_0 - 5a_X - 25$$

- ▶ Cepheid variables apparent magnitudes

$$m_{Y,i,j}^{\text{Cepheid}} = \mu_{0,i} + M_Y^{\text{Cepheid}} + b_Y (\log P_{i,j} - 1) + Z_Y \Delta \log [O/H]_{i,j}$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ SNe Ia apparent magnitudes

$$m_X^{\text{SNe Ia}} = 5 \log_{10} H_0 + \mu_0 - 5a_X - 25$$

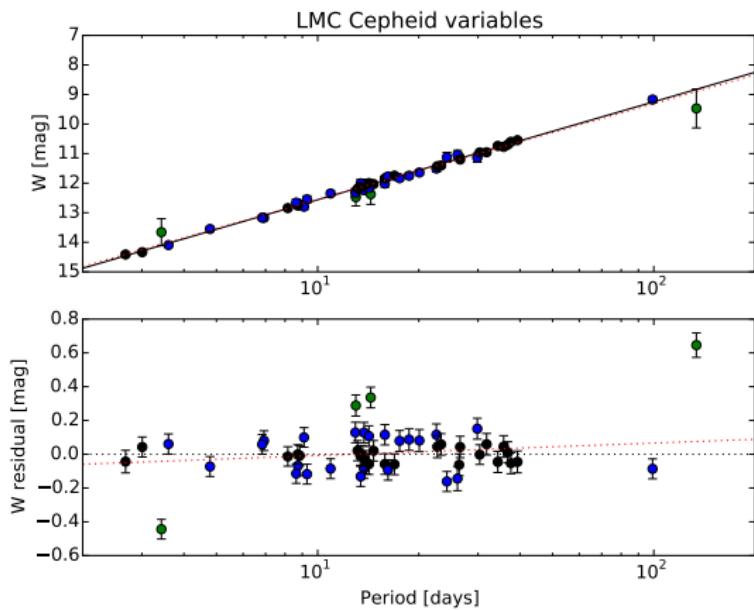
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- ▶ Galaxies hosting both SNe Ia and Cepheid stars
- ▶ A few anchor distances:  $\mu_0^{\text{LMC}}$ ,  $\mu_0^{\text{NGC4258}}$ ,  $\mu_0^{\text{M31}}$ , MW Cepheid stars parallaxes

# Measuring the Hubble constant

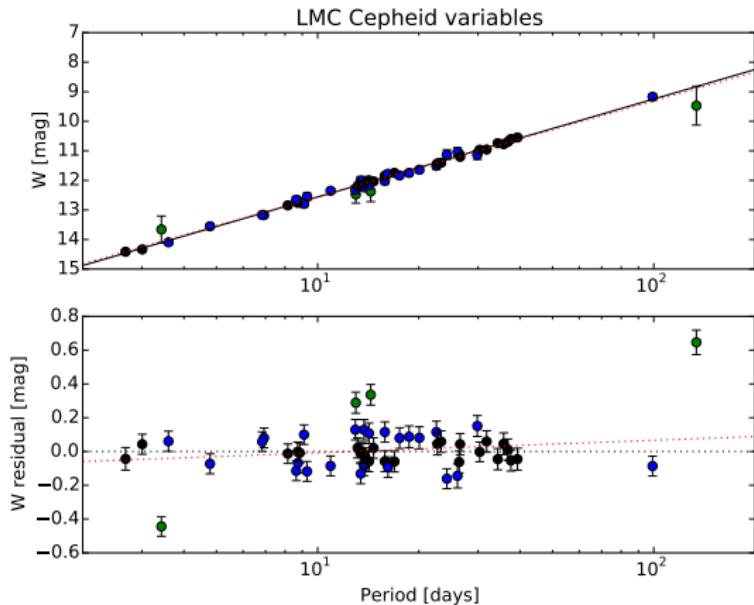
How do we measure  $H_0$ ?



- ▶ Need to determine the best fitting parameters in the relations above, but data sets include outliers...

# Measuring the Hubble constant

How do we measure  $H_0$ ?



- ▶ Outlier rejection algorithm or a Bayesian treatment ?

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ Usually assumed data points drawn from a Gaussian PDF

$$P_G(D_i|\vec{w}) = \tilde{N}_i \frac{\exp(-\chi_i^2(\vec{w})/2)}{\sqrt{2\pi}}$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ Usually assumed data points drawn from a Gaussian PDF

$$P_G(D_i|\vec{w}) = \tilde{N}_i \frac{\exp(-\chi_i^2(\vec{w})/2)}{\sqrt{2\pi}}$$

- ▶ Drop this and assume error bars can be underestimated: introduce hyper-parameters for each datum  $\sigma_i \rightarrow \sigma_i/\sqrt{\alpha_i}$

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- ▶ Starting from usual Gaussian PDF with usual  $\chi^2$ , but allow error bars to become greater and take into account every possible value for the rescaling (marginalise over HPs)

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ Usually assumed data points drawn from a Gaussian PDF

$$P_G(D_i|\vec{w}) = \tilde{N}_i \frac{\exp(-\chi_i^2(\vec{w})/2)}{\sqrt{2\pi}}$$

- ▶ Drop this and assume error bars can be underestimated: introduce hyper-parameters for each datum  $\sigma_i \rightarrow \sigma_i/\sqrt{\alpha_i}$
- ▶ Starting from usual Gaussian PDF with usual  $\chi^2$ , but allow error bars to become greater and take into account every possible value for the rescaling (marginalise over HPs)
- ▶ End up with a new PDF: a Gaussian HP PDF

$$P(D_i|\vec{w}) = \tilde{N}_i \left( \frac{\text{Erf}\left(\frac{\chi_i(\vec{w})}{\sqrt{2}}\right) - \sqrt{\frac{2}{\pi}}\chi_i(\vec{w})\exp(-\chi_i^2(\vec{w})/2)}{\chi_i^3(\vec{w})} \right)$$

# Measuring the Hubble constant

How do we measure  $H_0$ ?

- ▶ Maximise likelihood and compute effective HPs for each datum (given the best fitting parameters)

$$\begin{aligned}\alpha_i^{\text{eff}} &= 1, \quad \text{if} \quad \chi_i^2 \leq 1 \\ \alpha_i^{\text{eff}} &= \frac{1}{\chi_i^2}, \quad \text{if} \quad \chi_i^2 > 1.\end{aligned}$$

# Measuring the Hubble constant

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- ▶ Assess compatibility of data sets through normalised weights

$$||\alpha^j|| \equiv \frac{\sum_{i=1}^{K_j} \alpha_{i,j}}{K_j},$$

# Measuring the Hubble constant

What data do we use ?

- ▶ The R11 data set: 8 galaxies simultaneously hosting SNe Ia and Cepheid stars, three anchor distances ( $\mu_0^{\text{LMC}}$ ,  $\mu_0^{\text{NGC4258}}$ , 13 MW Cepheid stars parallaxes)

# Measuring the Hubble constant

What data do we use ?

- ▶ The R11 data set: 8 galaxies simultaneously hosting SNe Ia and Cepheid stars, three anchor distances ( $\mu_0^{\text{LMC}}$ ,  $\mu_0^{\text{NGC4258}}$ , 13 MW Cepheid stars parallaxes)
- ▶ The R16 data set: 19 galaxies simultaneously hosting SNe Ia and Cepheid stars, four anchor distances ( $\mu_0^{\text{LMC}}$ ,  $\mu_0^{\text{NGC4258}}$ ,  $\mu_0^{\text{M31}}$ , 15 MW Cepheid stars parallaxes)

# Measuring the Hubble constant

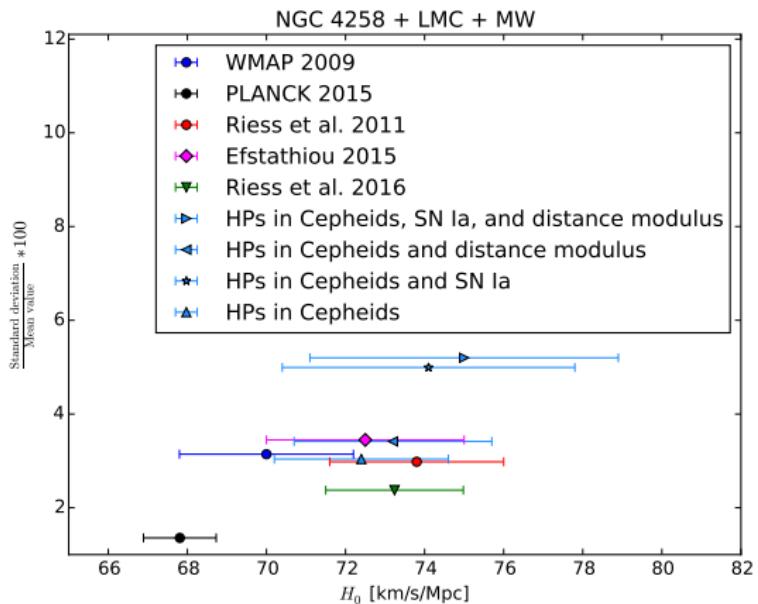
Results: the R11 data set

Consistency of period-luminosity relation				
Fit	Galaxy	$M_W$	$b_W$	$\sigma_{\text{int}}$
c	LMC	-5.93 (0.07)	-3.31 (0.05)	0.06
e	MW	-5.88 (0.07)	-3.30 (0.26)	0.02
f	NGC4258	-6.12 (0.15)	-3.02 (0.17)	0.12

- ▶ Find no reasons to exclude data sets: period-luminosity relation compatible with direct distance determinations

# Measuring the Hubble constant

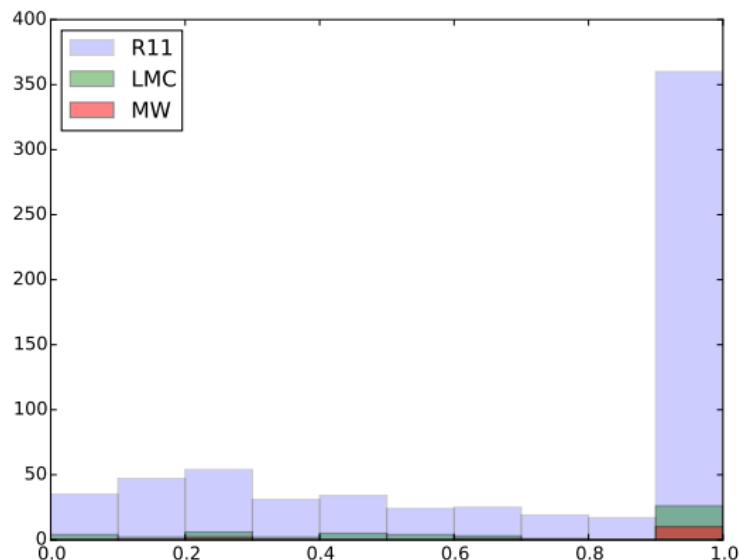
Results: the R11 data set



- Precision of  $H_0$  depends on which data are included with HPs

# Measuring the Hubble constant

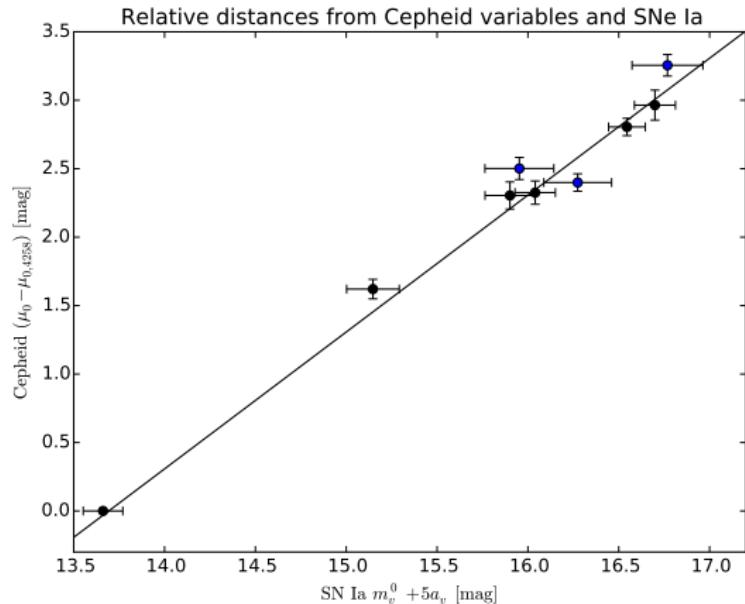
Results: the R11 data set



- ▶ Down-weighted fraction in Cepheid sample

# Measuring the Hubble constant

Results: the R11 data set



- ▶ Inconsistencies in SNe Ia data

# Measuring the Hubble constant

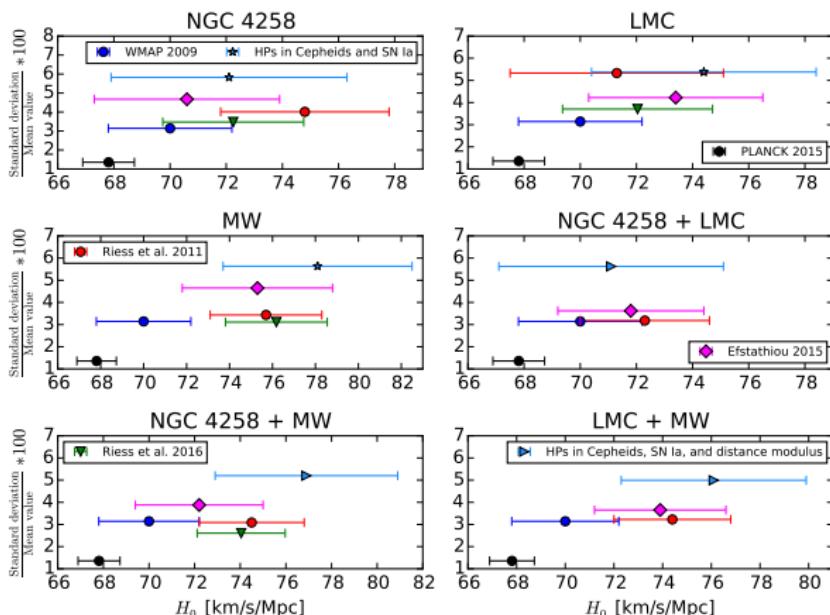
Results: the R11 data set

- ▶ Baseline result for the R11 data set

$$H_0 = 75.0 \pm 3.9 \text{ km/s/Mpc}$$

# Measuring the Hubble constant

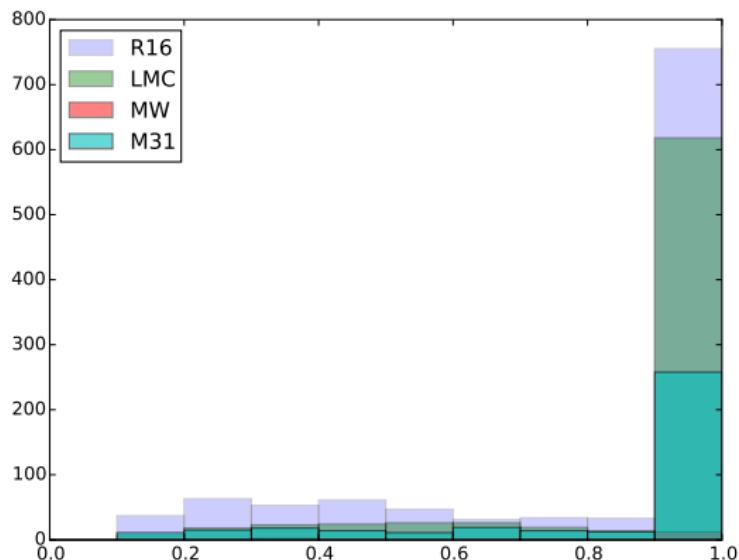
Results: the R11 data set



- ▶ Anchor choice and comparison with previous results

# Measuring the Hubble constant

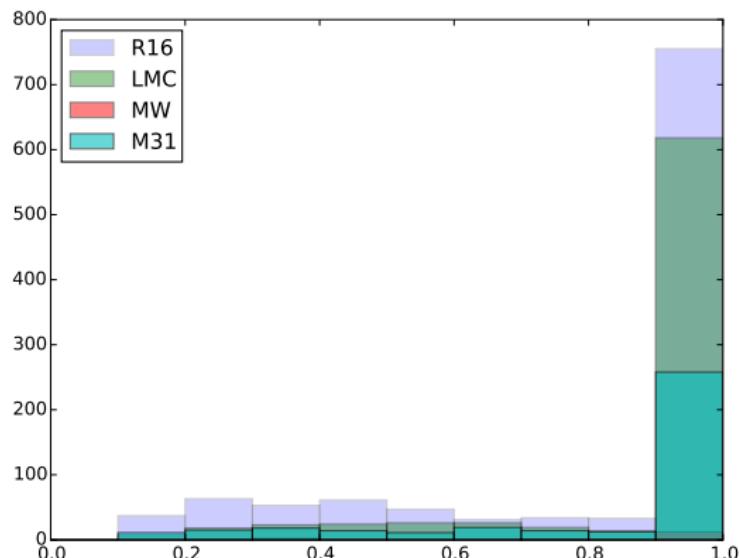
Results: the R16 data set



- ▶ No outliers released in the Cepheid sample, however...

# Measuring the Hubble constant

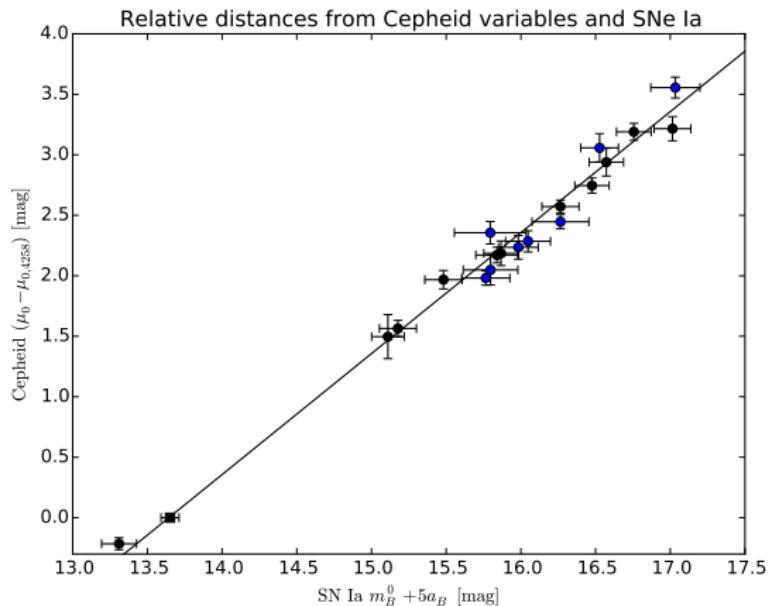
Results: the R16 data set



- Down-weighted fraction in Cepheid sample

## Measuring the Hubble constant

## Results: the R16 data set



- #### ► Inconsistencies in SNe Ia data

# Measuring the Hubble constant

Results: the R16 data set

- ▶ Consider variants of baseline analysis (e.g., period cut-off, metallicity dependence, reddening law) and compute systematic error due to these changes

$$\sigma_{\text{syst}} = 0.20 \text{km s}^{-1} \text{Mpc}^{-1}$$

# Measuring the Hubble constant

Results: the R16 data set

- ▶ Consider variants of baseline analysis (e.g., period cut-off, metallicity dependence, reddening law) and compute systematic error due to these changes

$$\sigma_{\text{syst}} = 0.20 \text{ km s}^{-1} \text{ Mpc}^{-1}$$

- ▶ Baseline result for the R11 data set

$$H_0 = 73.75 \pm 2.11 \text{ km s}^{-1} \text{ Mpc}^{-1},$$

# Measuring the Hubble constant

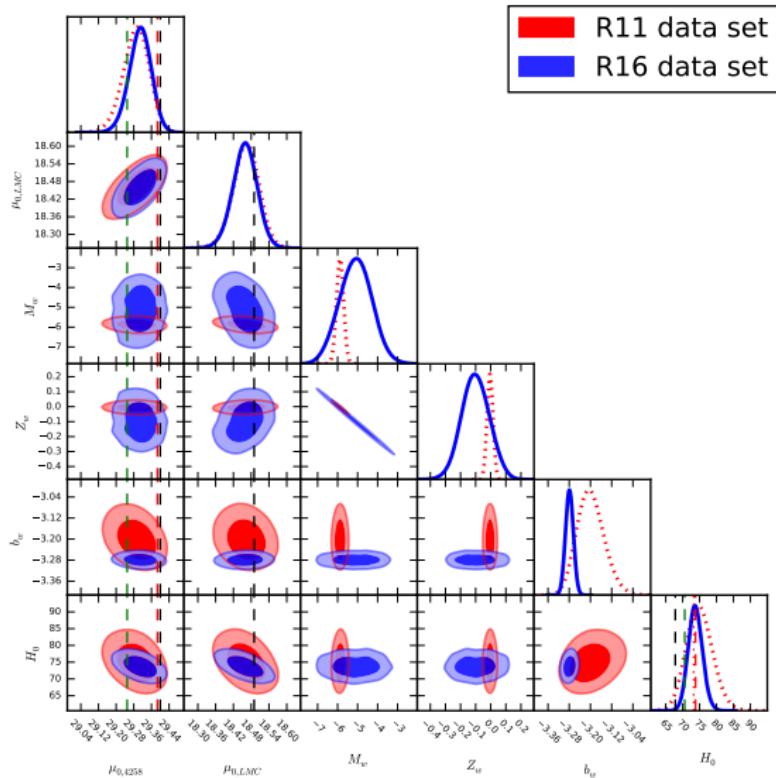
Results: the R16 data set

Consistency of different kinds of data			
Data set	$  \alpha^{\text{Cepheid}}  $	$  \alpha^{\text{SNe Ia}}  $	$  \alpha^{\text{Anchors}}  $
R11	0.72	0.74	0.86
R16	0.86	0.78	0.92

- ▶ Improvement of compatibility of different kinds of data

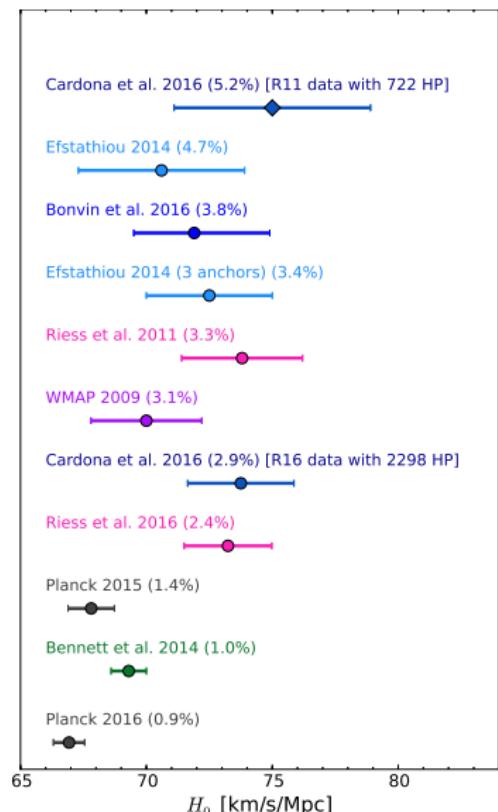
# Measuring the Hubble constant

Results: the R16 data set



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Results: the R16 data set



# Conclusions

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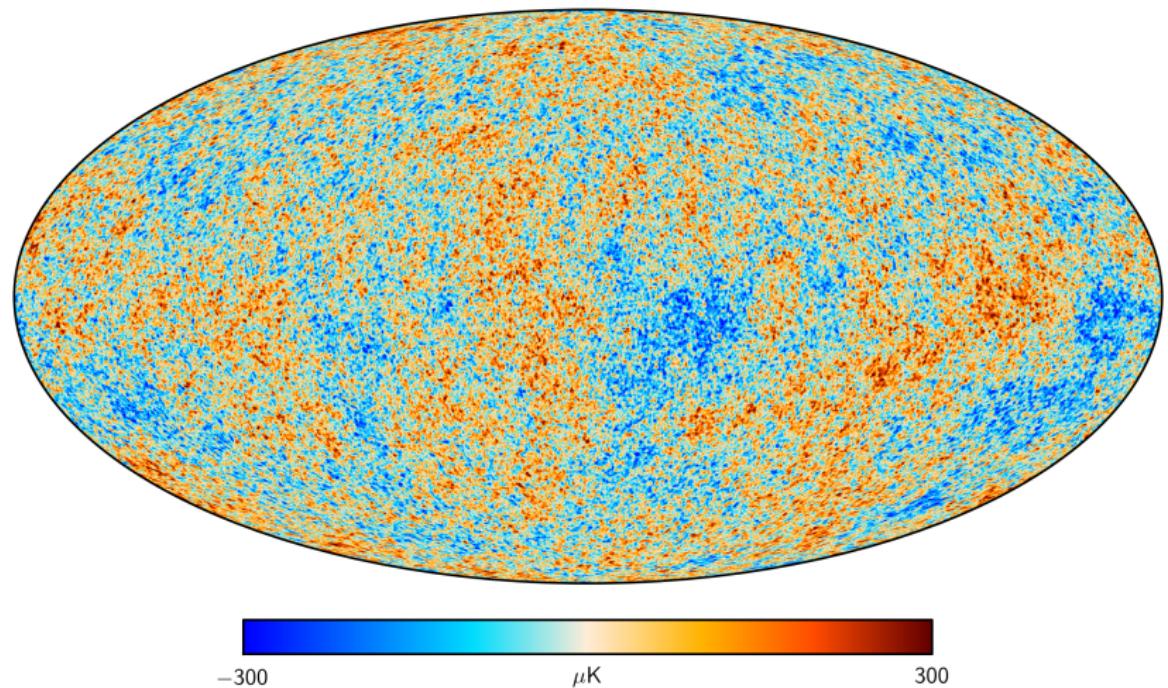
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# Conclusions

- ▶ Developed a method to search for deviations of statistical isotropy: CMB data from Planck is consistent with the Cosmological principle.
- ▶ Data is consistent with zero dark energy anisotropic stress
- ▶ Lensing convergence must be included in analyses of upcoming galaxy surveys
- ▶ Developed a method to measure the Hubble constant and asses consistency of data sets. Confirmed tension CMB and local measurements might suggest new physics or unaccounted systematics in CMB data

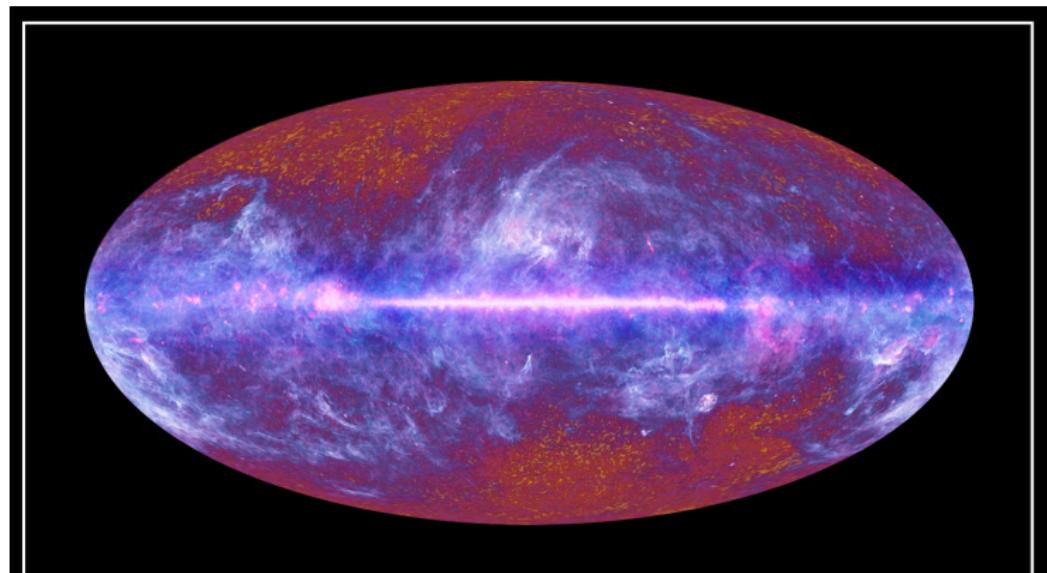
# Project 1: testing a fundamental assumption of the standard model of cosmology

CMB anisotropies



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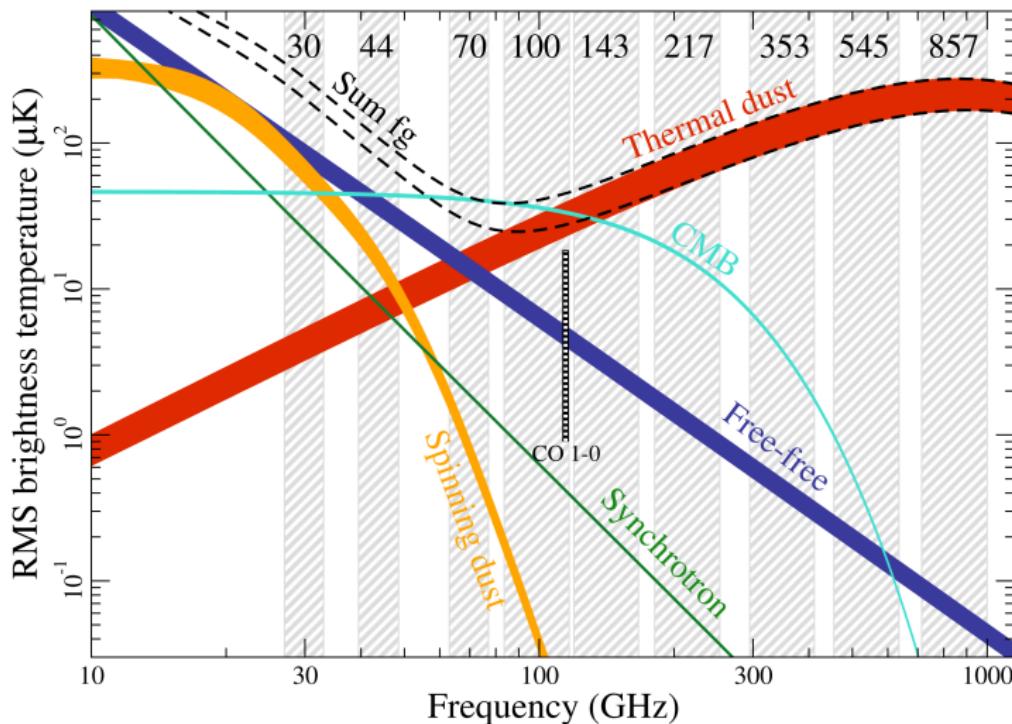
The Planck one-year all-sky survey



(c) ESA, HFI and LFI consortia, July 2010

# Project 1: testing a fundamental assumption of the standard model of cosmology

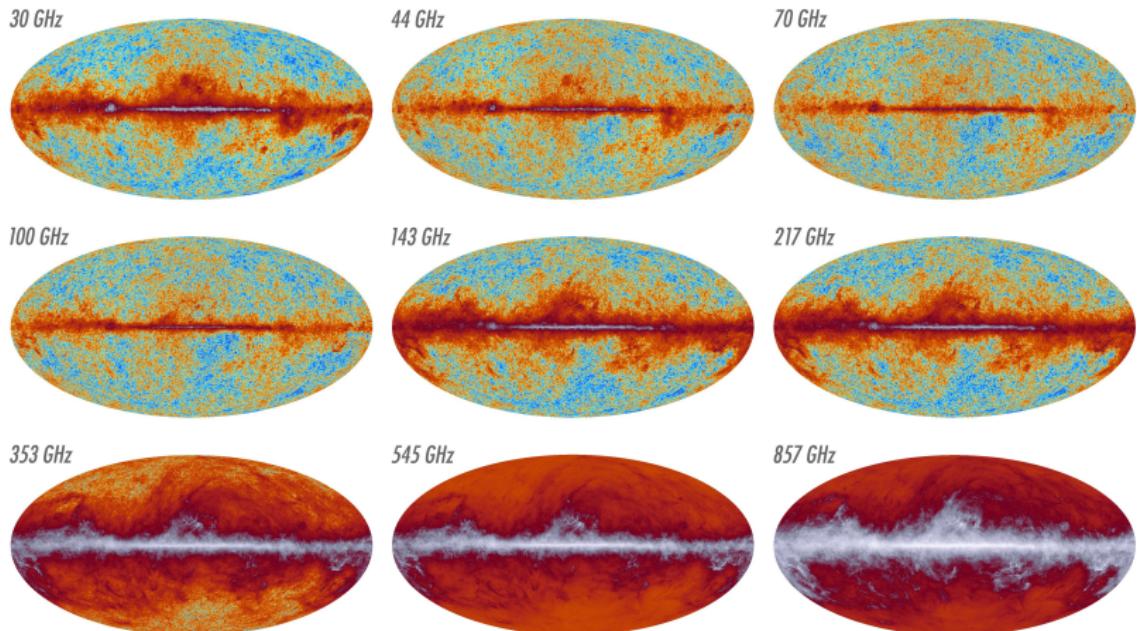
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# Project 1: testing a fundamental assumption of the standard model of cosmology

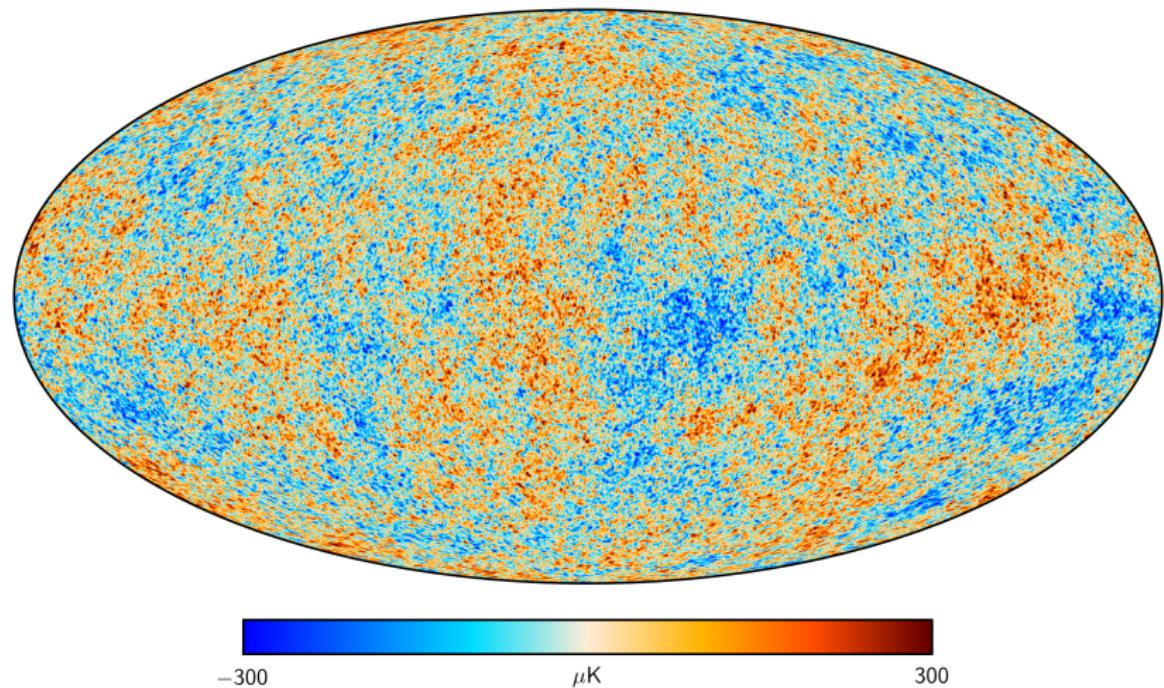
CMB anisotropies

*The 2015 Planck view of the sky*



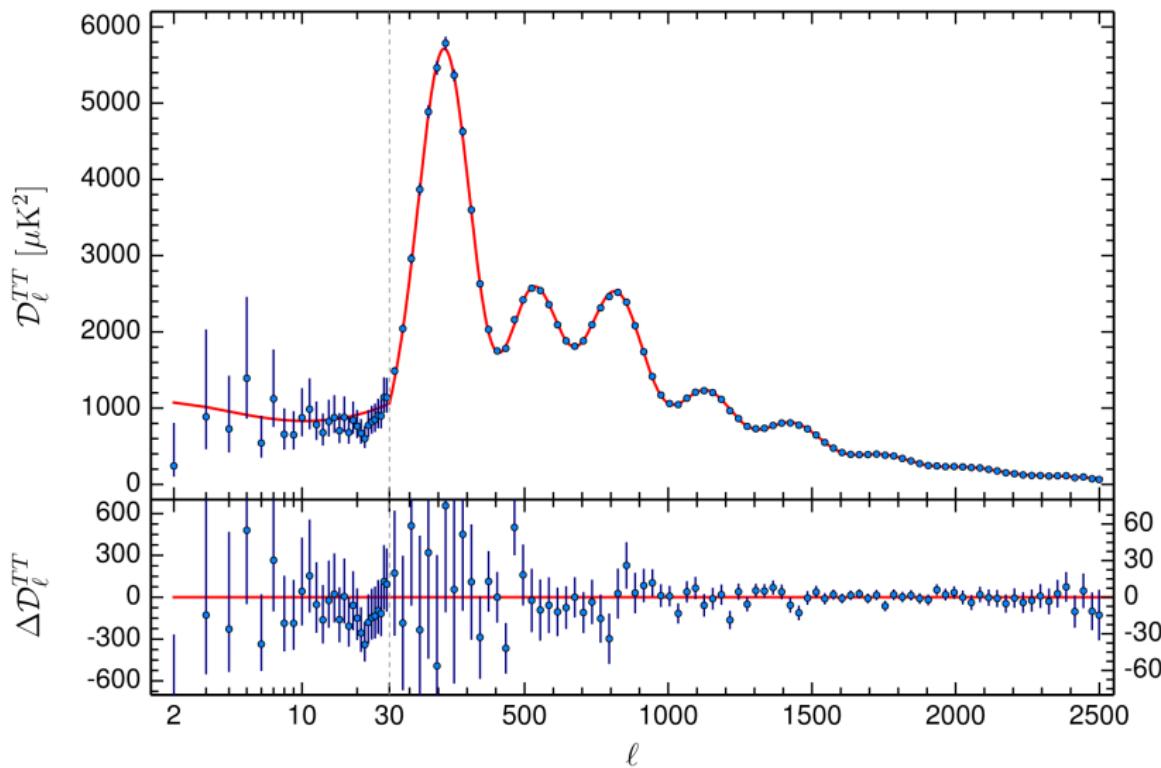
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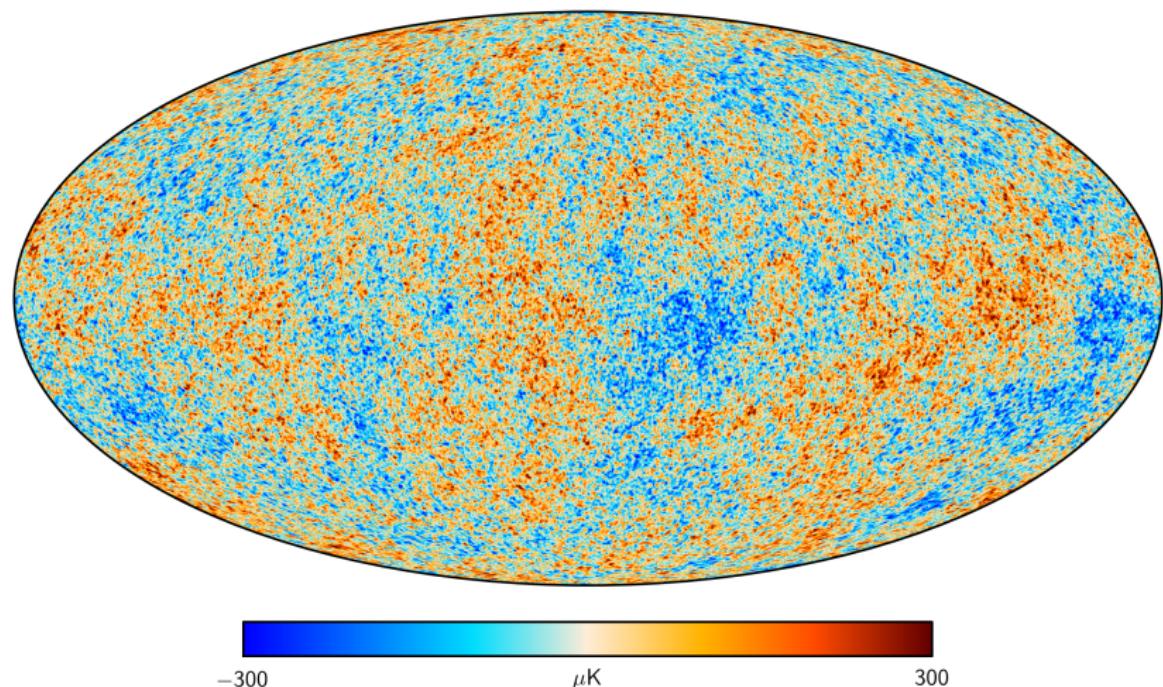
CMB anisotropies



# Project 1: testing statistical isotropy with Planck data

VSK method

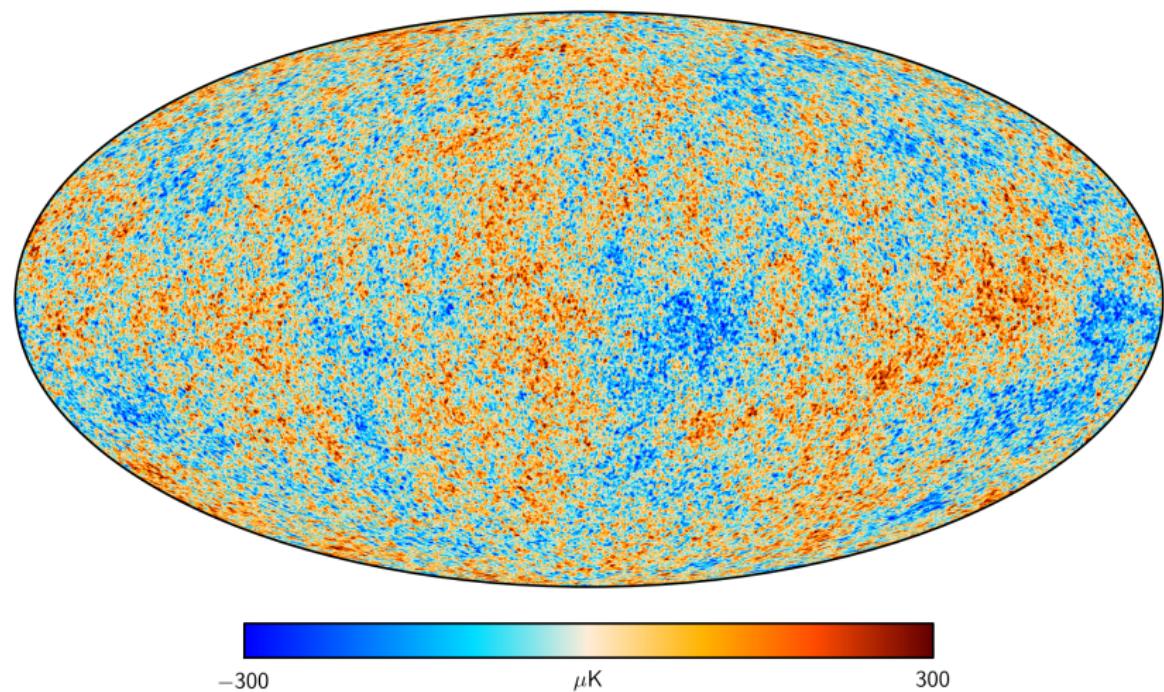
Statistical isotropy is fundamental in the concordance model



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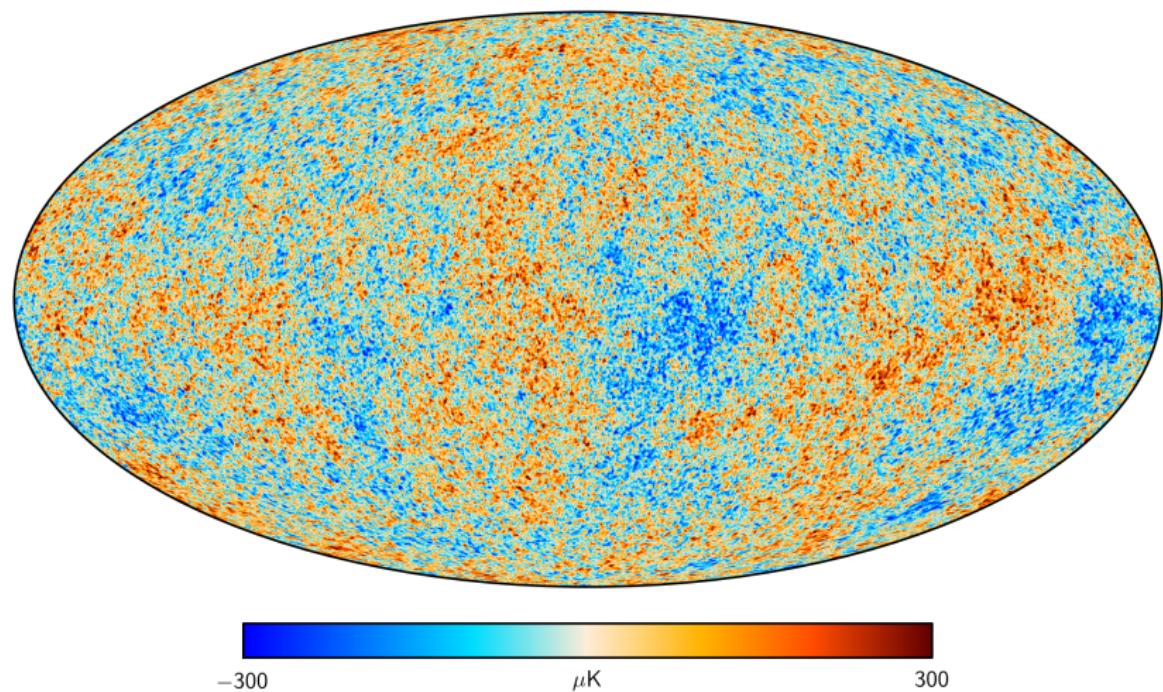
Statistical properties of CMB allow to test assumptions



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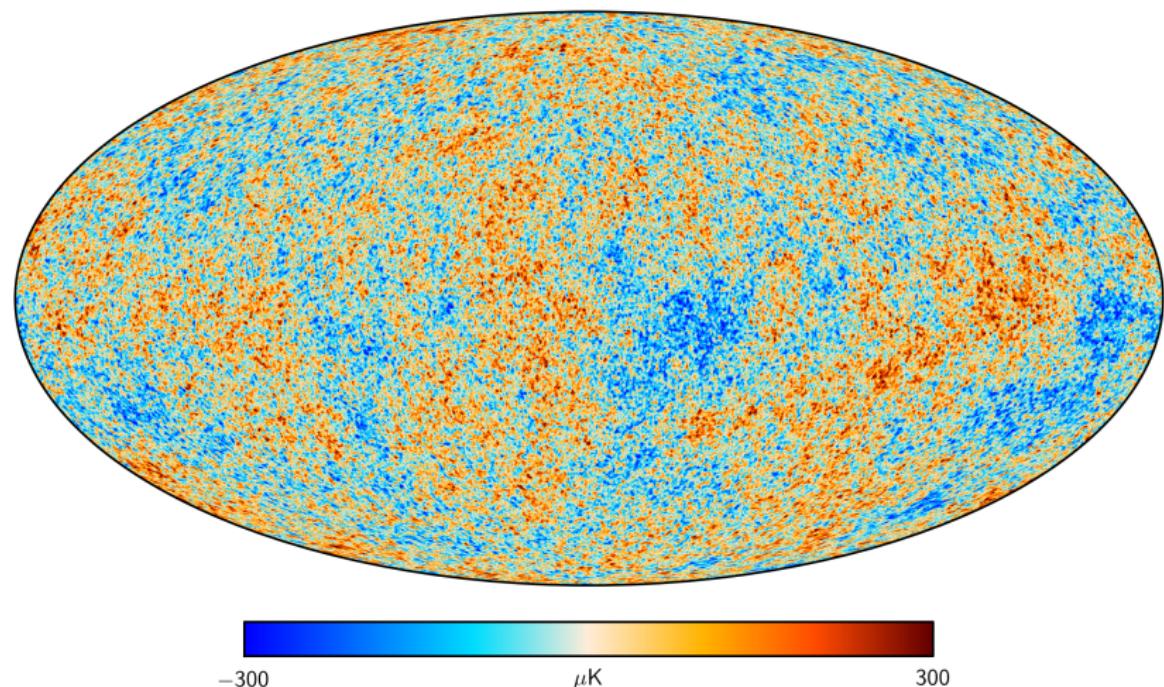
CMB anisotropies... isotropic and Gaussian distributed ?



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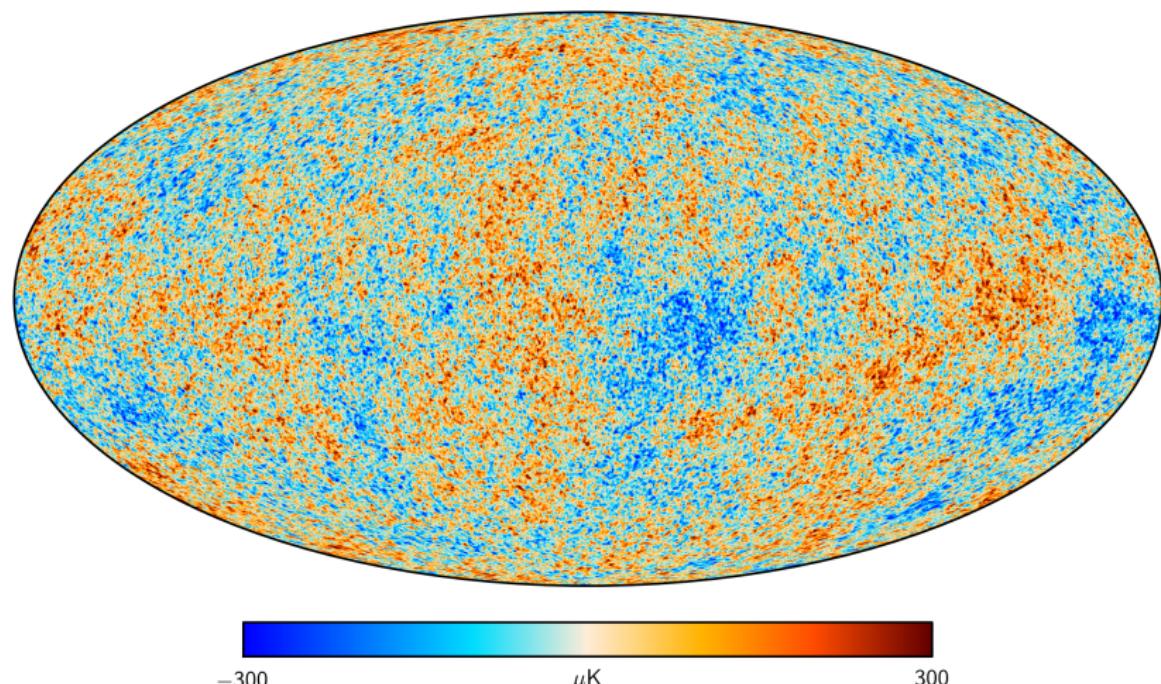
Anomalies have been found by WMAP, Planck and other groups



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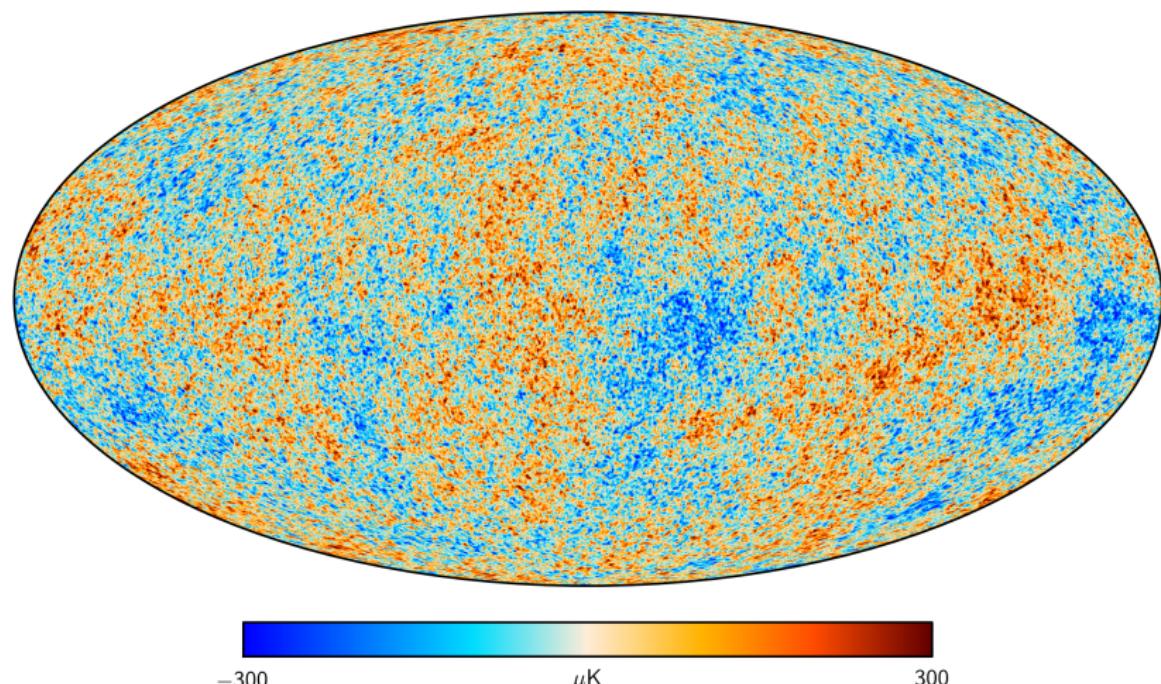
Unaccounted systematics, non-subtracted foreground  
contamination, cosmological origin ?



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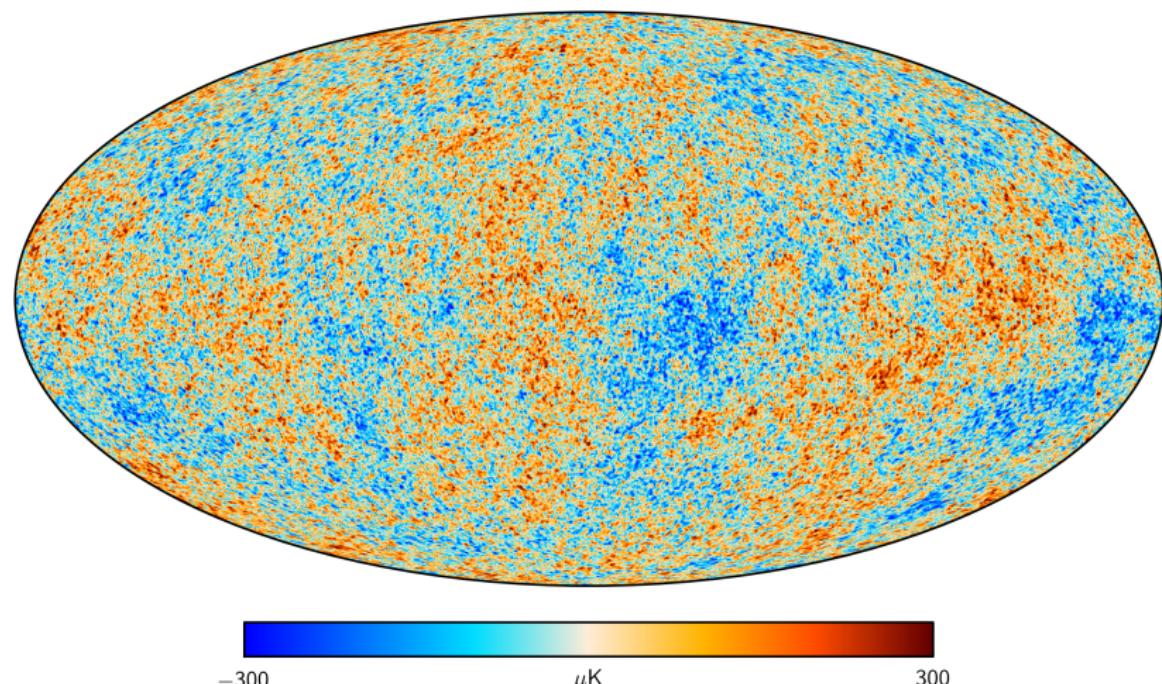
WMAP and Planck are two independent experiments...  
unaccounted systematics seems unlikely



# Project 1: testing statistical isotropy with Planck data

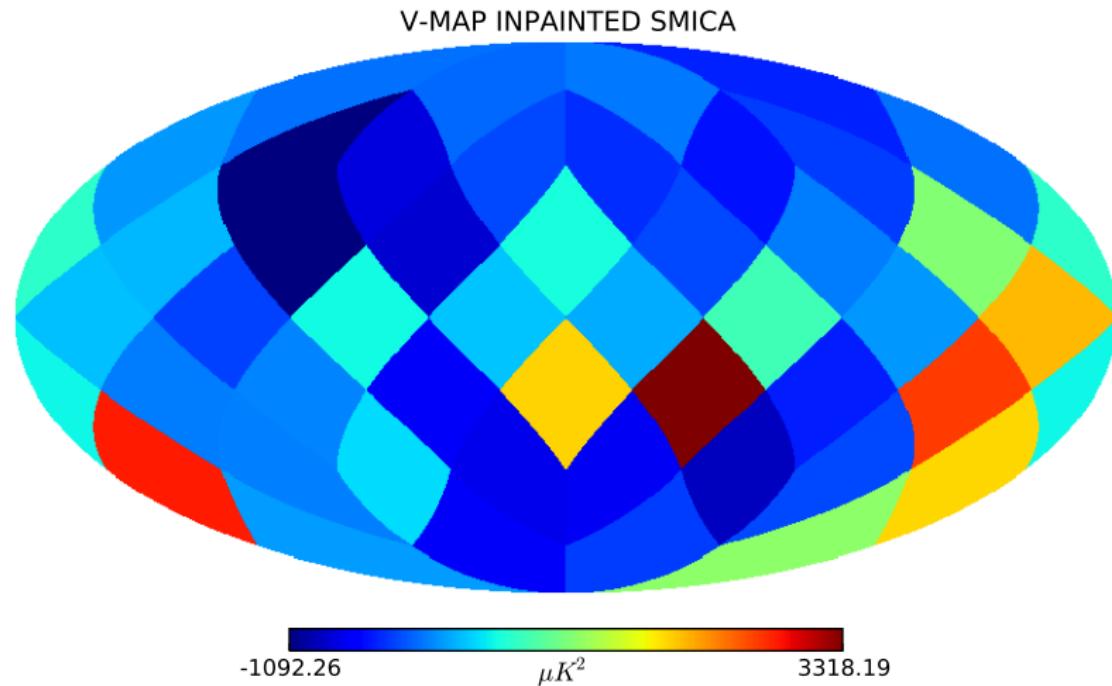
VSK method

Then, anomalies due to unresolved foreground or cosmological origin ?



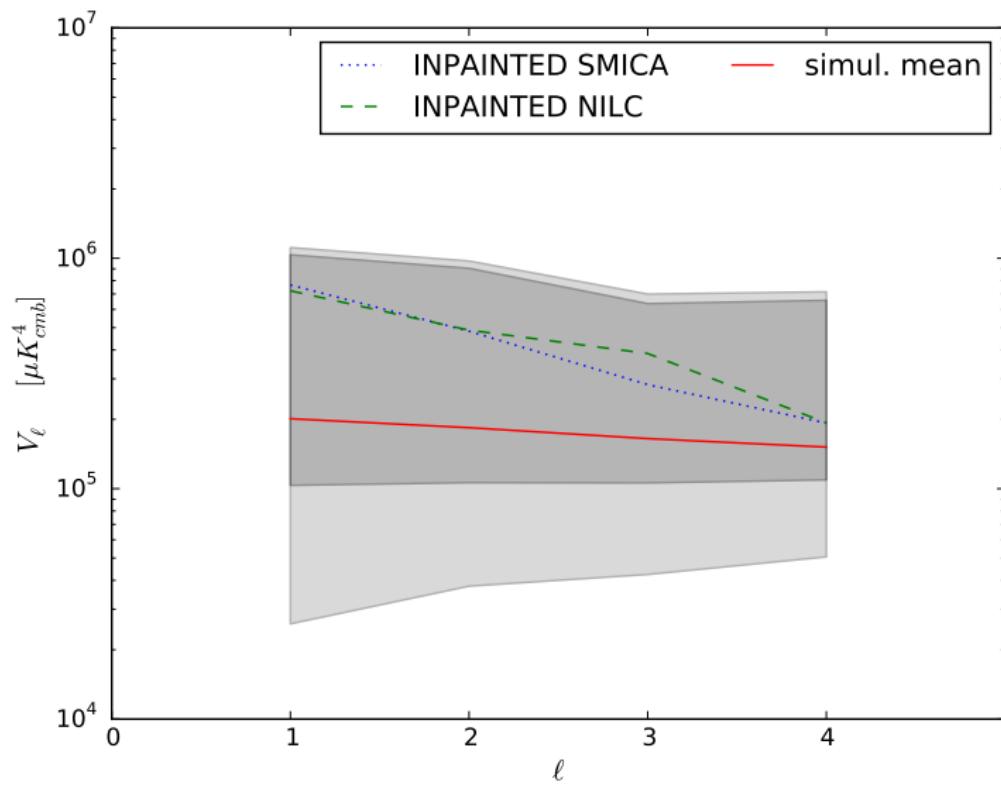
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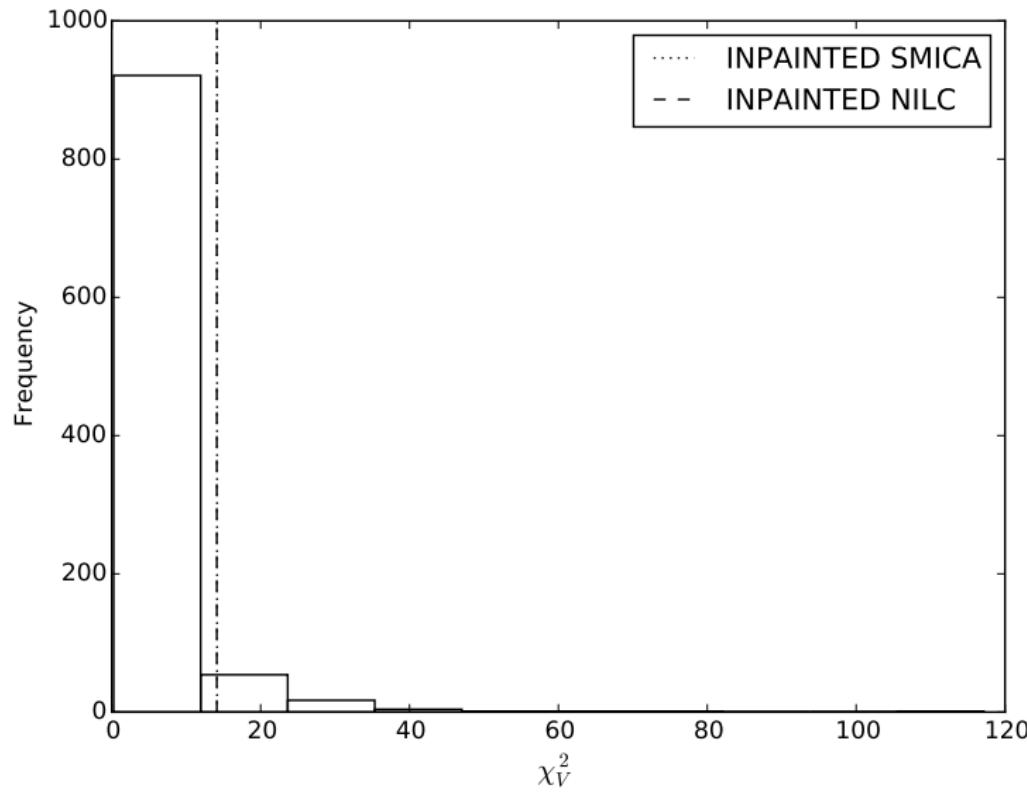
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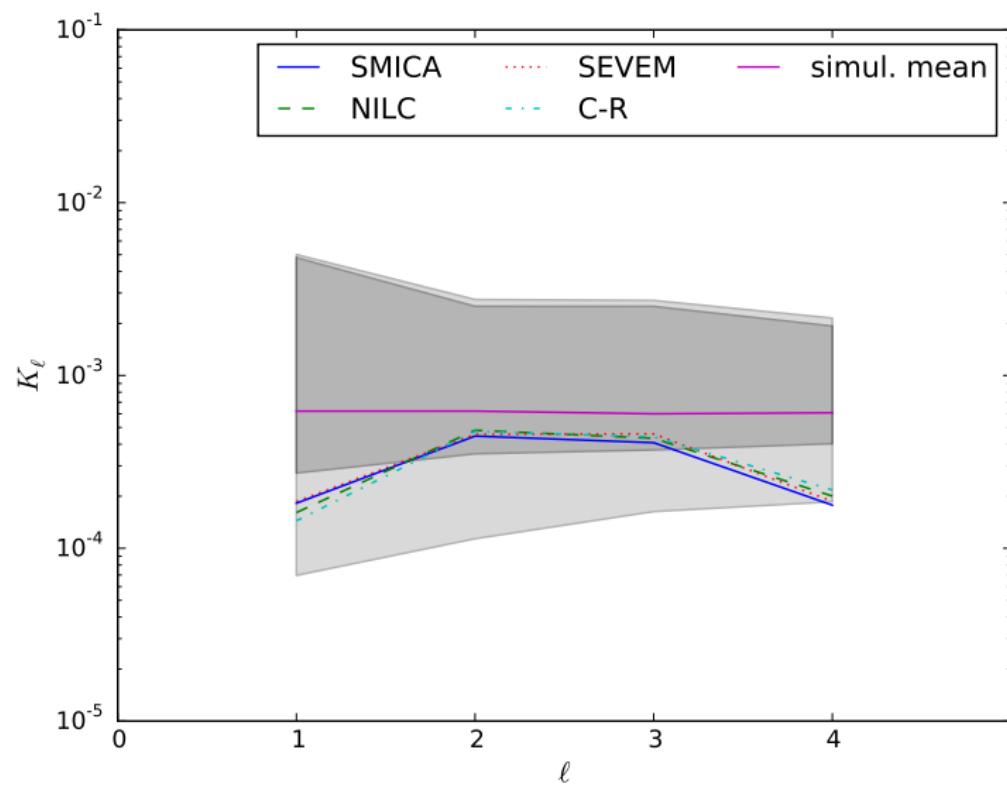
VSK method

Lower-tail probability for the V, S, K estimators, for the  
 $N_{side} = 2048$  inpainted SMICA and NILC.

CMB estimate	Probability		
	V	S	K
$N'_{side} = 2$			
SMICA	0.939	0.388	0.096
NILC	0.939	0.022	1
$N'_{side} = 4$			
SMICA	0.969	0.727	0.521
NILC	0.943	0.761	1
$N'_{side} = 8$			
SMICA	1	0.551	0.581
NILC	0.964	0.474	1

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VSK method



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VSK method

SMICA CMB estimate using the U73 mask.

$N'_{side}$	Probability		
	V	S	K
$N_{side} = 2048$			
2	0.004	0.024	0.367
4	0.893	0.407	0.340
8	0.695	0.116	0.406
$N_{side} = 1024$			
2	0.556	0.022	0.281
4	0.873	0.446	0.229
8	0.782	0.117	0.264
16	0.442	0.084	0.153

# Project 1: testing statistical isotropy with Planck data

VSK method

SMICA CMB estimate using the U73 mask.

$N'_{side}$	Probability		
	V	S	K
$N_{side} = 512$			
2	0.711	0.027	0.229
4	0.898	0.485	0.240
8	0.794	0.103	0.140
16	0.311	0.200	0.146
$N_{side} = 256$			
2	0.040	0.123	0.225
4	0.996	0.480	0.404
8	1.0	0.235	0.104
16	1.0	0.584	0.459

# Project 1: testing statistical isotropy with Planck data

VSK method

SMICA CMB estimate using different masks.

$N'_{side}$	Probability		
	V	S	K
U73 ( $f_{sky} = 73\%$ )			
2	0.004	0.024	0.367
4	0.893	0.407	0.340
8	0.695	0.116	0.406
VALMASK ( $f_{sky} = 89\%$ )			
2	0.004	0.022	0.357
4	0.895	0.371	0.343
8	0.7	0.099	0.385
INP_MASK ( $f_{sky} = 97\%$ )			
2	0.003	0.016	0.382
4	0.897	0.367	0.374
8	0.685	0.099	0.428

## Project 2: constraints on anisotropic dark energy

Why do we care about anisotropic dark energy ?

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- ▶ A general fluid can be characterised by equation of state, sound speed, and anisotropic stress
- ▶ Literature has focused on the background evolution, but what about DE perturbations ?
- ▶ Anisotropic stress is a key feature: it allows to distinguish standard DE model ( $\Pi_{de} = 0$ ) from modified gravity models ( $\Pi_{de} \neq 0$ )

## Project 2: constraints on anisotropic dark energy

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- ▶ Implement the model in CAMB and do MCMC with COSMOMC
- ▶ Data from Planck, BAO, supernovae, but exclude  $P(k)$  and  $H_0$

# Project 2: constraints on anisotropic dark energy

## Results

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- ▶ Constraints do not show evidence of non-zero anisotropic stress.

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# Project 3: upcoming galaxy surveys, the lensing convergence and the neutrino mass

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- ▶ Cold Dark Matter (CDM) constitutes about 30% of the energy content
- ▶ Neutrinos are the only known dark matter candidate
- ▶ Neutrinos are massive, but their absolute scale remains unconstrained

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- ▶ Upcoming surveys will probe distances comparable to the Hubble horizon: relativistic effects must be consistently included in the analysis

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Galaxy number counts angular power spectrum  $C_\ell(z, z')$

- ▶  $P(k, z)$  is not an observable.  $C_\ell(z, z')$  is an observable

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- ▶ In practice, divide the catalogue in red-shift bins

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- ▶ Conservative treatment of non-linearities
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- ▶ Number counts alone
- ▶ Number counts and use CMB information from Planck

# Project 3: upcoming galaxy surveys, the lensing convergence and the neutrino mass

## Results

- ▶ Triangle plot including CMB information

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# Project 3: upcoming galaxy surveys, the lensing convergence and the neutrino mass

## Results

- ▶ Triangle plot including CMB information
- ▶ Table showing biased parameters: spurious detection of neutrino mass
- ▶ Plot showing auto- and cross-correlations, equation showing dominant contribution
- ▶ Lensing convergence must be included in the analysis of upcoming galaxy surveys, with appropriate magnification bias