

Uncovering Physics Beyond the Standard Model in the Cosmic Microwave Background

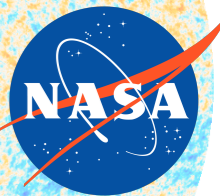
Colin Hill

Columbia University

Research Progress Meeting
Lawrence Berkeley National Laboratory
12 March 2024



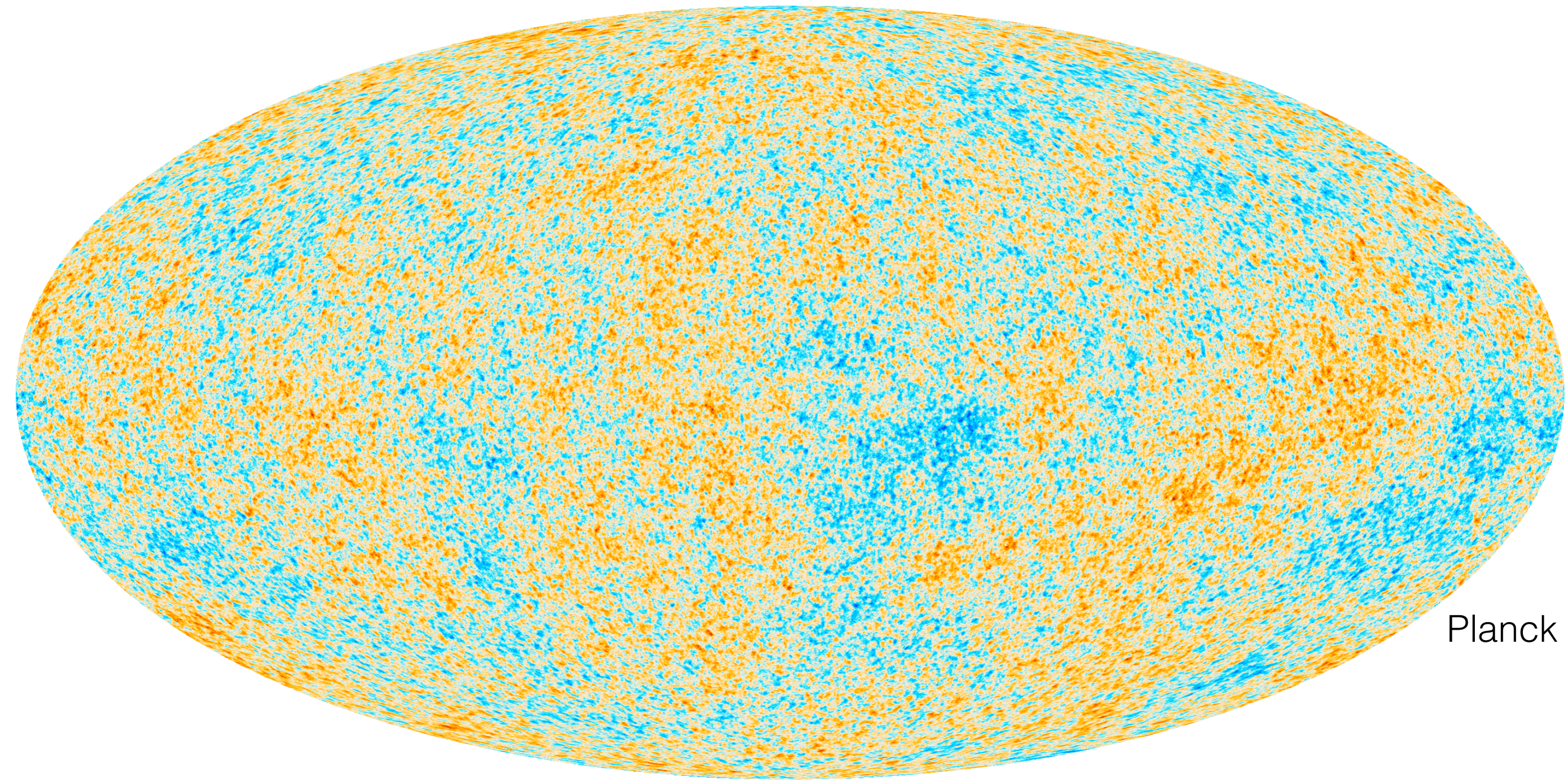
ALFRED P. SLOAN
FOUNDATION



Work in progress with K. Surrao, B. Bolliet, S. Goldstein, F. McCarthy, D. Pirvu, J. Huang, M. Johnson, E. Calabrese/T. Louis/H. Jense/ACT Collaboration
2307.01043 + 2308.16260 w/ F. McCarthy
2303.01591 w/ B. Bolliet, A. Spurio Mancini, ++



Cosmic Microwave Background



Planck

tens of millions of pixels: statistical properties fully described
by six-parameter standard model

Cosmic Microwave Background

What have we learned?

- Precise constraints on cosmological parameters: matter density, baryon density, age, spatial curvature
- Properties of initial fluctuations: near-scale invariant, Gaussian, adiabatic, super-horizon

Cosmic Microwave Background

What have we learned?

- Precise constraints on cosmological parameters: matter density, baryon density, age, spatial curvature
- Properties of initial fluctuations: near-scale invariant, Gaussian, adiabatic, super-horizon

Important questions remain:

- What seeded the initial fluctuations?

Inflation?

- What are the constituents of the dark sector?

Neutrinos – are there other light particles?

- How can we use the CMB as a particle-physics detector?

Beyond-Standard-Model physics signatures?

Outline

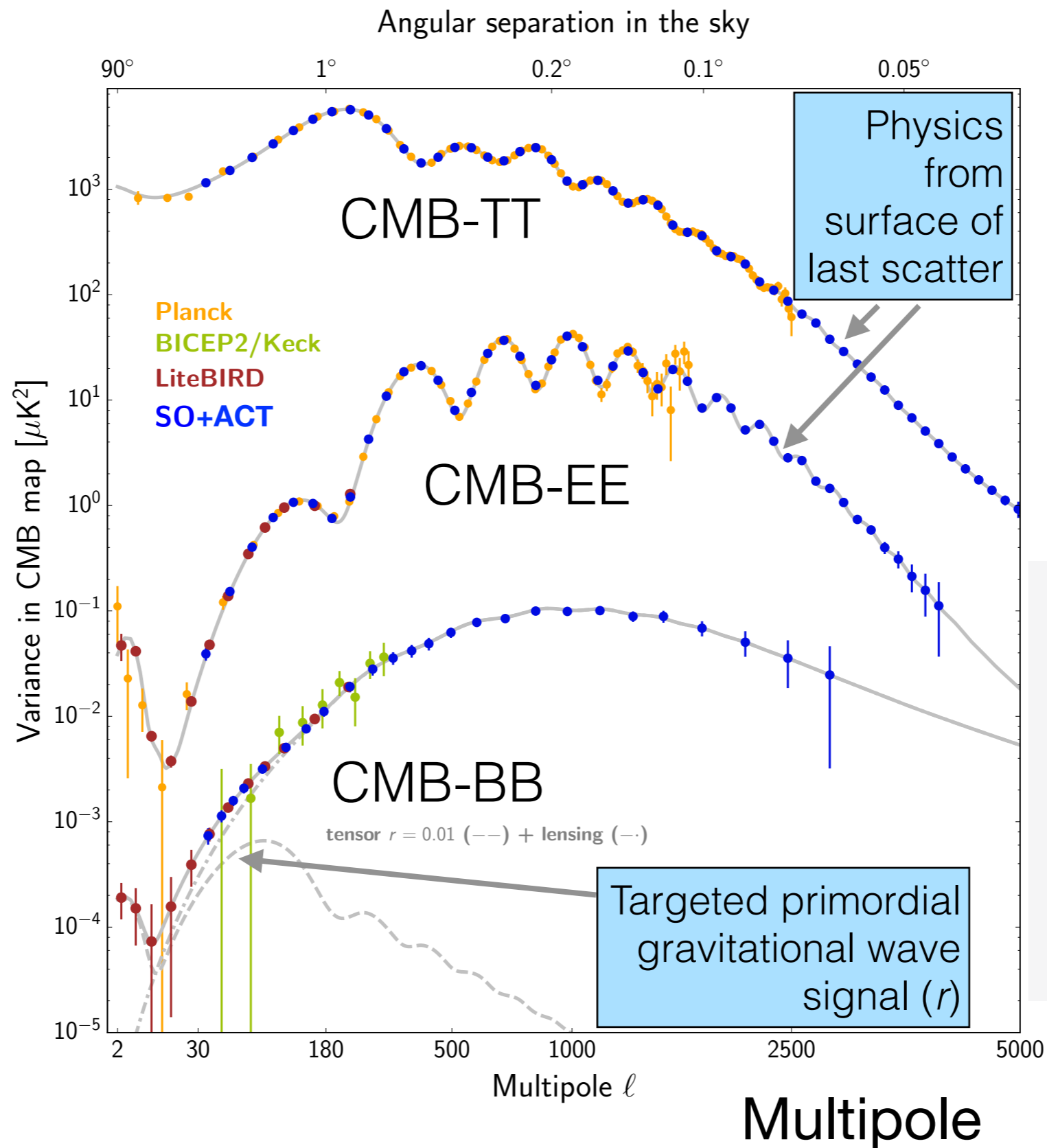
- BSM Physics in the Primary CMB
- BSM Physics in the Secondary CMB
- New Tools for New Physics
- Outlook: from SO to Advanced SO to CMB-S4

BSM Physics in the Primary CMB



Primary CMB: Landscape

Angular
Power
Spectrum



Motivation

- Primary CMB power spectra are sensitive to any light particles (mass $< eV$) that were *ever* in thermal contact with the primordial plasma (“dark radiation”, e.g., neutrinos)

Motivation

- Primary CMB power spectra are sensitive to any light particles (mass < eV) that were *ever* in thermal contact with the primordial plasma (“dark radiation”, e.g., neutrinos)
- N_{eff} : simple parameterization that captures a wide range of BSM theories, with SM value = 3.044 (neutrinos):

$$N_{\text{eff}} = \frac{8}{7} \left(\frac{11}{4} \right)^{4/3} \frac{\rho_{\nu}}{\rho_{\gamma}}$$

neutrino energy density (+DR)
photon energy density

CMB-S4: $\sigma(N_{\text{eff}}) = 0.03$

CMB: Relativistic Particle Detector

Colin Hill
Columbia

- Primary CMB power spectra are sensitive to any light particles (mass < eV) that were *ever* in thermal contact with the primordial plasma (“dark radiation”, e.g., neutrinos)
- N_{eff} : simple parameterization that captures a wide range of BSM theories, with SM value = 3.044 (neutrinos):

$$N_{\text{eff}} = \frac{8}{7} \left(\frac{11}{4} \right)^{4/3} \frac{\rho_{\nu}}{\rho_{\gamma}}$$

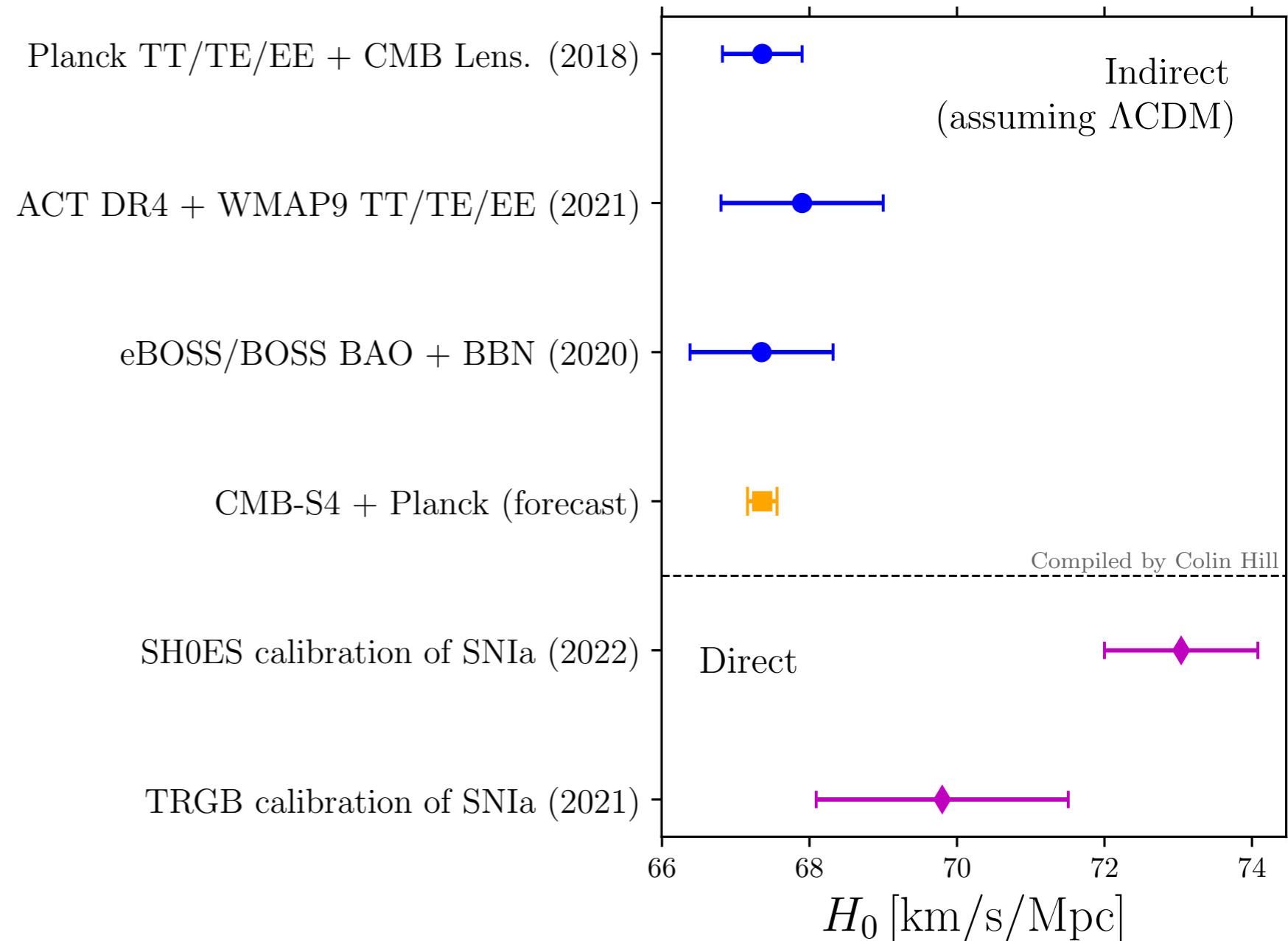
neutrino energy density (+DR)
photon energy density

- CMB-S4 will rule out (or detect) at >95% CL *any* light spin-3/2 (e.g., gravitino) or spin-1 (e.g., dark photon) particle in thermal contact at any time back to reheating ($t \sim 10^{-36}$ sec)
(cf. LHC: $t \sim 10^{-15}$ sec)
- Detection would be the first direct cosmic signal from the epoch before neutrino decoupling ($t \sim 1$ sec)

External Motivation

Hints of New Physics in H_0

Formal statistical discrepancy between Planck and SH0ES is $\sim 5\sigma$: if not a systematic (robust confirmation needed), requires new physics beyond Λ CDM



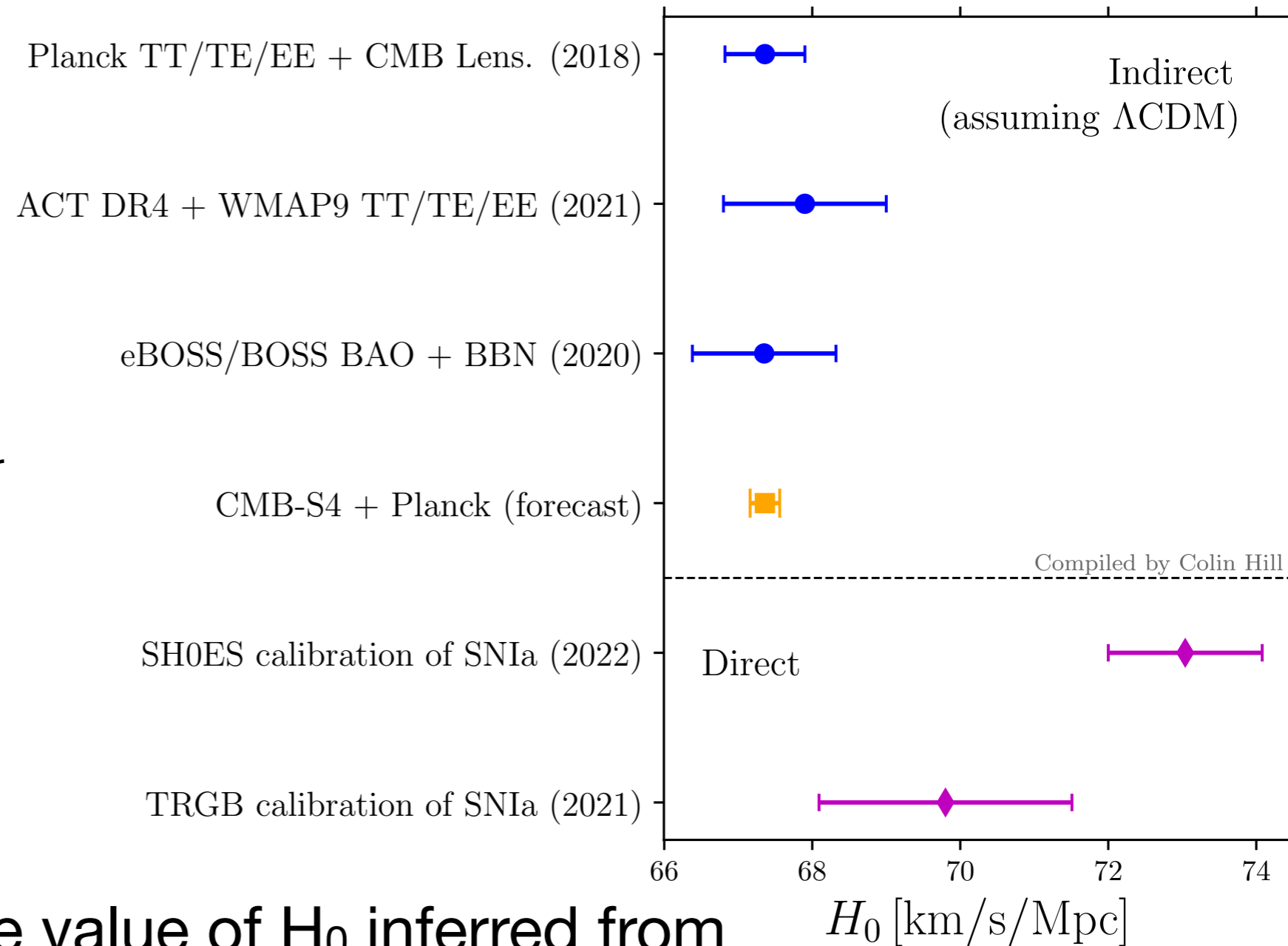
External Motivation

Hints of New Physics in H_0

Formal statistical discrepancy between Planck and SH0ES is $\sim 5\sigma$: if not a systematic (robust confirmation needed), requires new physics beyond Λ CDM

- Not a CMB systematic:
Planck, ACT, SPT agree
within Λ CDM

- Not specific to CMB: other
cosmological probes
(BOSS BAO+BBN+others)
agree



How can we increase the value of H_0 inferred from
CMB and large-scale structure data?

Classes of Models

Viabale paths to increase CMB-inferred H_0

- Pre-recombination energy injection: e.g., early dark energy and its variants — all require new light field(s)

Smith+ (2019); Agrawal+ (2019); Poulin+ (2018); Lin+ (2019); Knox & Millea (2020); **JCH+** (2020); Ivanov, McDonough, **JCH+** (2020); **JCH+** (2021); McDonough, Lin, **JCH+** (2022); Lin, McDonough, **JCH**, Hu (2023)

- Modified recombination: e.g., primordial magnetic fields; increased m_e ; or decreased T_{CMB}

Jedamzik & Pogosian (2018); Sekiguchi & Takahashi (2020); Hart & Chluba (2020); Thiele, Guan, **JCH+** (2021); Chiang & Slosar (2018); Lee+ (2022); Ivanov+ (2020); **JCH** & Bolliet (2023)

Classes of Models

Viable paths to increase CMB-inferred H_0

- Pre-recombination energy injection: e.g., early dark energy and its variants — all require new light field(s)

Smith+ (2019); Agrawal+ (2019); Poulin+ (2018); Lin+ (2019); Knox & Millea (2020); **JCH+** (2020); Ivanov, McDonough, **JCH+** (2020); **JCH+** (2021); McDonough, Lin, **JCH+** (2022); Lin, McDonough, **JCH**, Hu (2023)

- Modified recombination: e.g., primordial magnetic fields; increased m_e ; or decreased T_{CMB}

Jedamzik & Pogosian (2018); Sekiguchi & Takahashi (2020); Hart & Chluba (2020); Thiele, Guan, **JCH+** (2021); Chiang & Slosar (2018); Lee+ (2022); Ivanov+ (2020); **JCH** & Bolliet (2023)

- Additional dark radiation species (beyond usual three neutrinos) with non-trivial dynamics/interactions

Buen-Abad+ (2015,2017); Aloni+ (2021,2022)

- Strong neutrino interactions (delay ν free-streaming)

Cyr-Racine & Sigurdson (2014); Lancaster+ (2017); Kreisch+ (2019); Escudero & Witte (2019); Kreisch,...,**JCH+** (2024)

None of these models existed when Planck/ACT/SPT were proposed and built, yet these experiments have been absolutely crucial in searching for evidence of these signals of new physics

The Atacama Cosmology Telescope

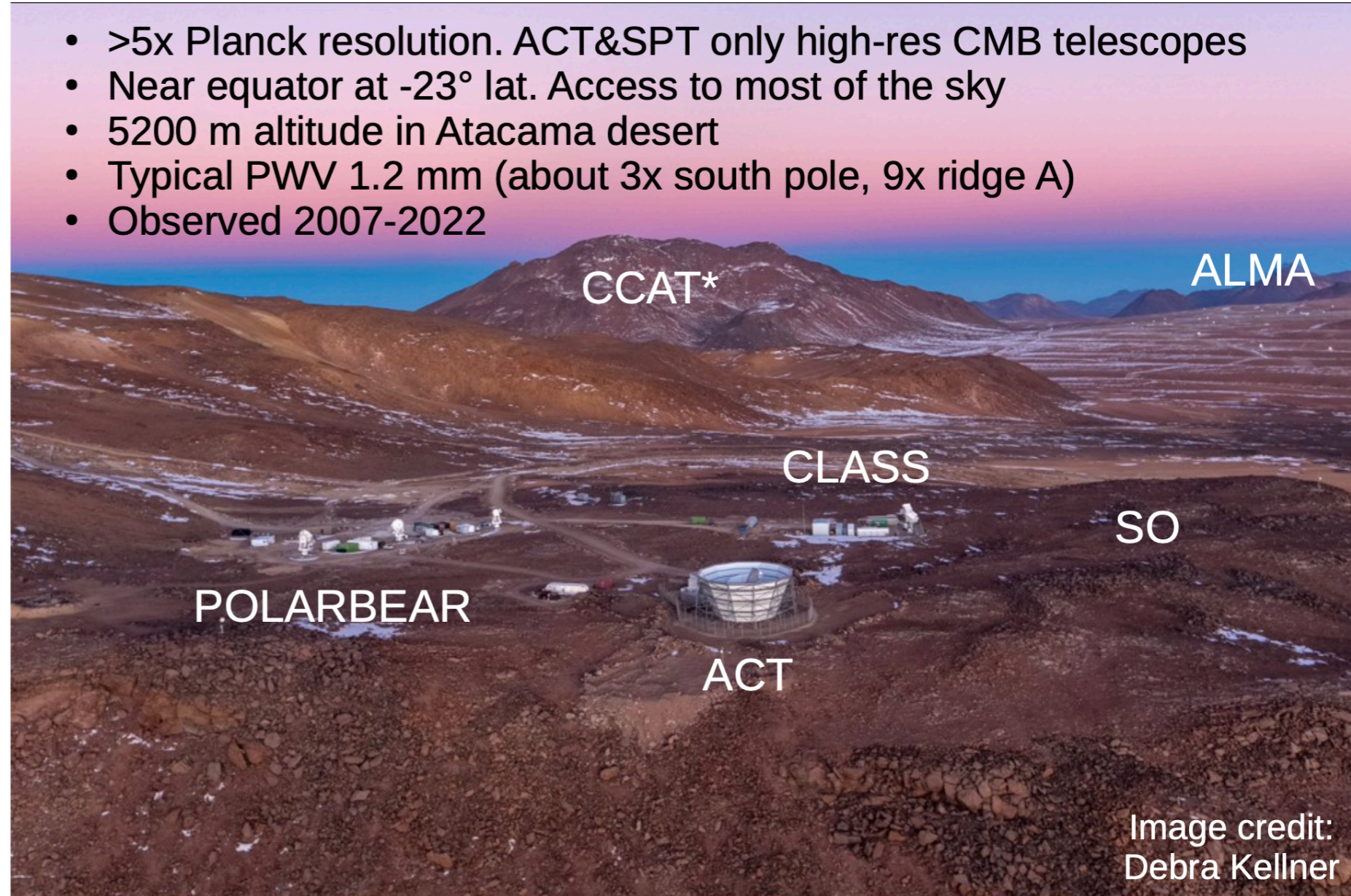
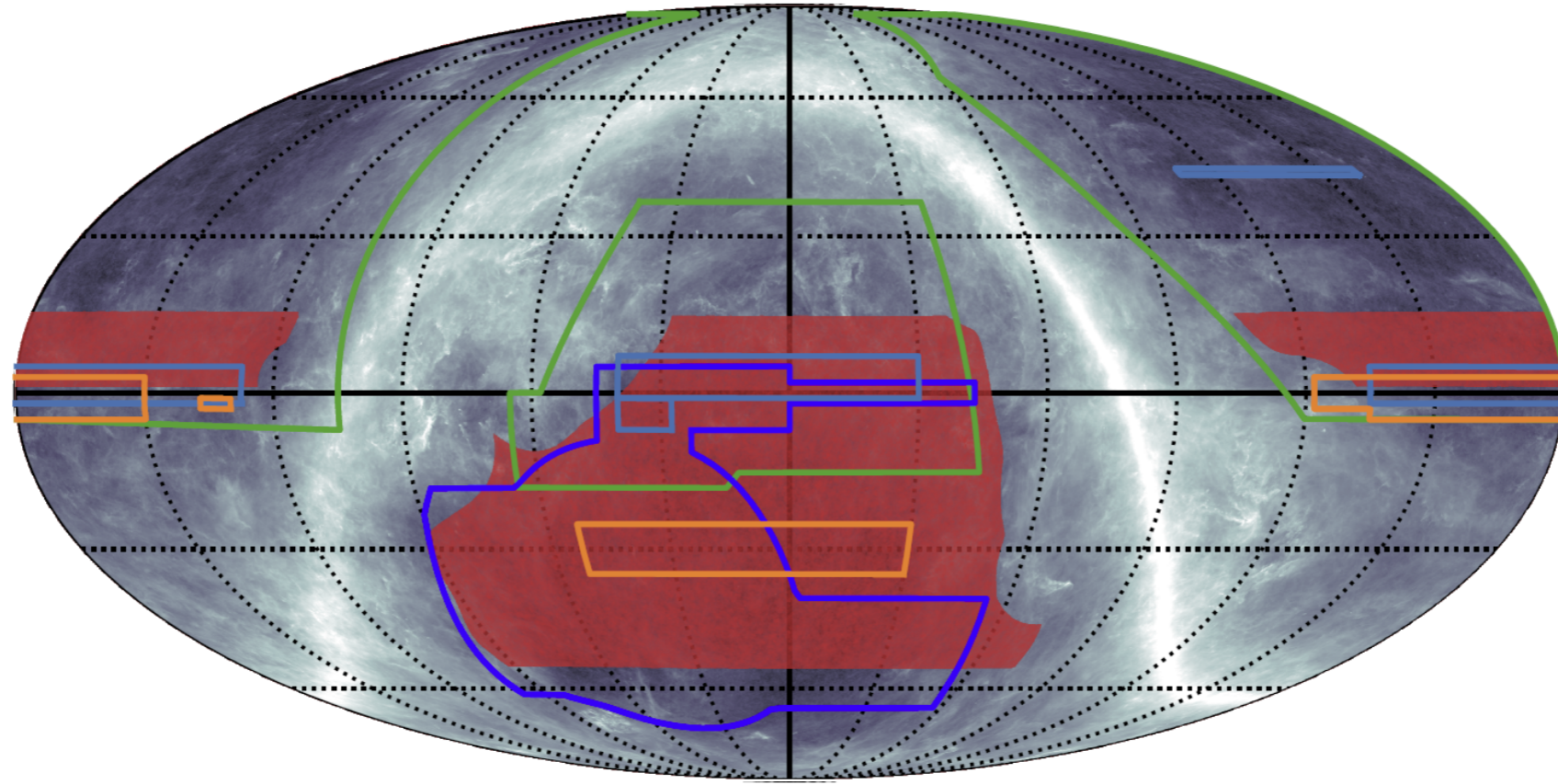


Image credit:
Debra Kellner

Planned future site for CMB-S4 wide-area survey

Current State of the Field: ACT

Colin Hill
Columbia



ACT



SDSS+Legacy Survey



DES



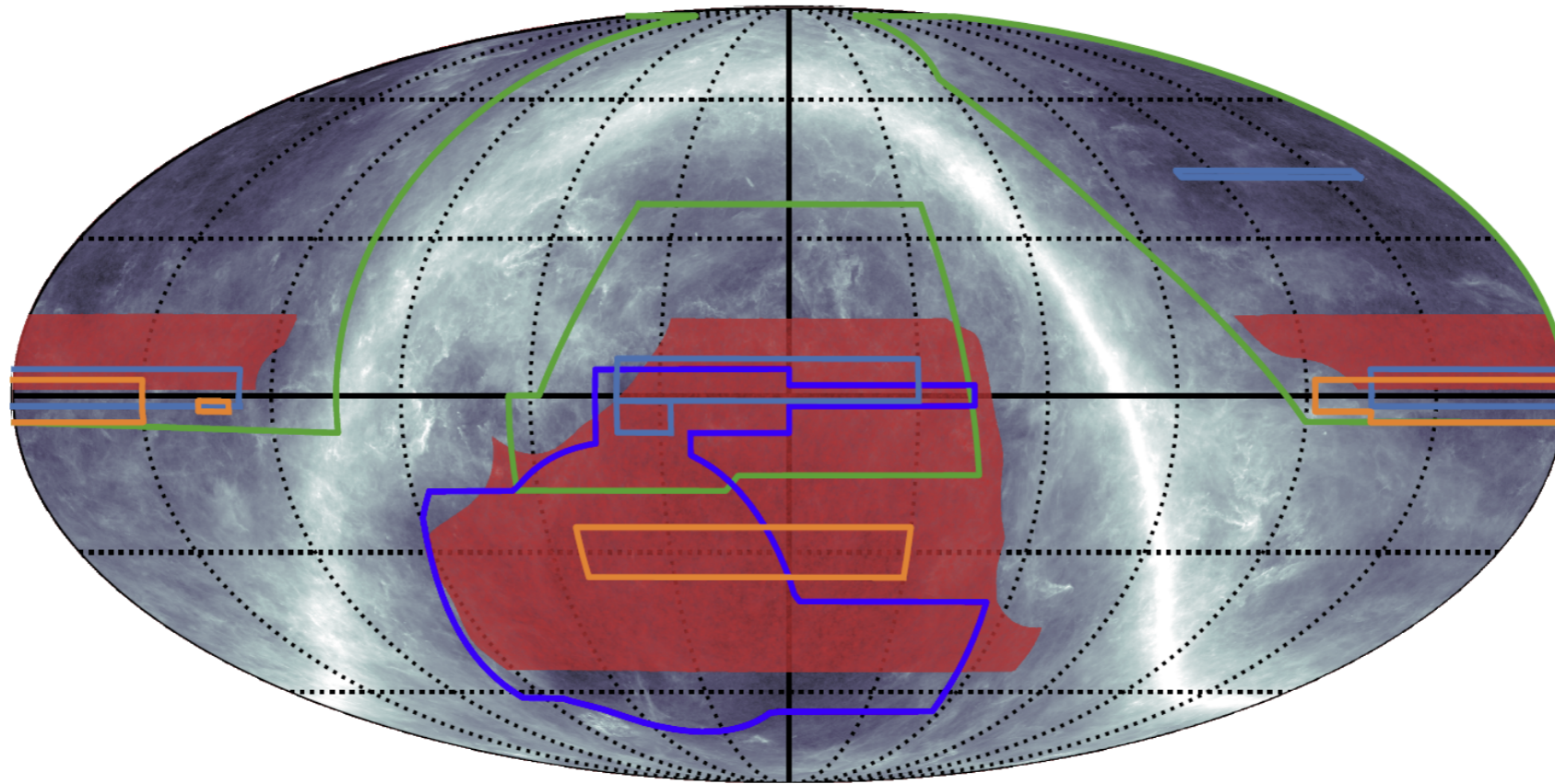
HSC



KiDS

Current State of the Field: ACT

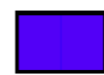
Colin Hill
Columbia



ACT



SDSS+Legacy Survey



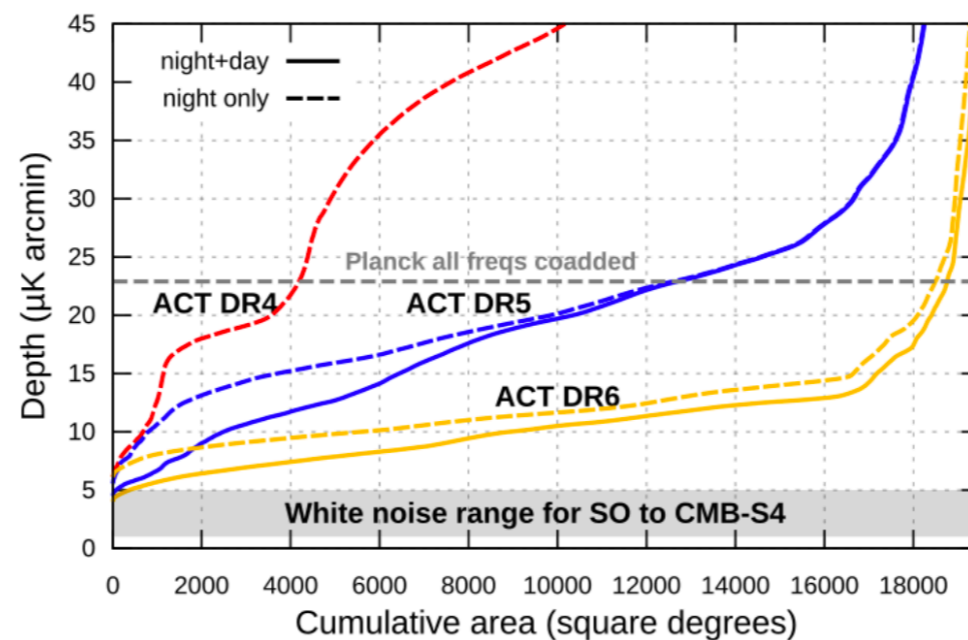
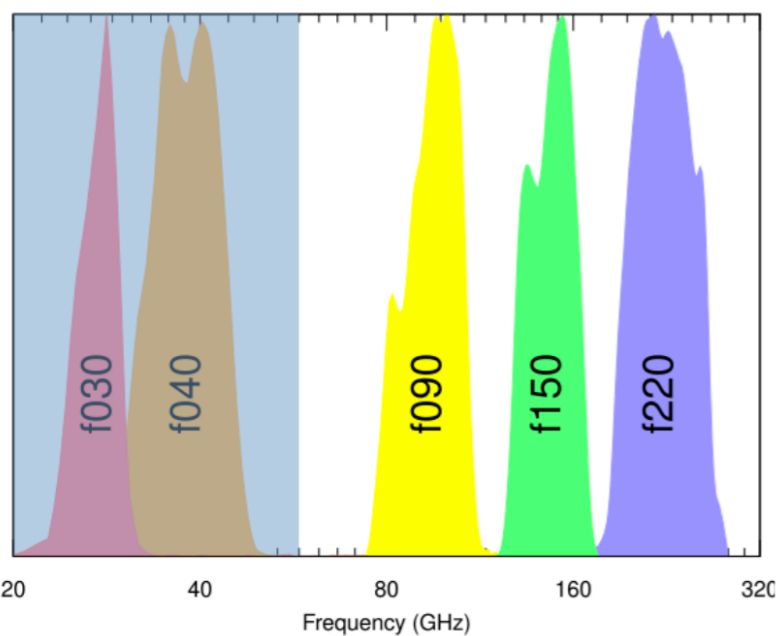
DES



HSC



KIDS



- Observed 2017-2022 in 5 bands
- Combined sensitivity of $6.1 \mu\text{K}/\sqrt{\text{s}}$ (mostly in f090 and f150)
- ACT DR6 coming soonish 😊
- Deeper than Planck over $19000^{\circ 2}$
- Median depth of $10 \mu\text{K arcmin}$
- 10x as much statistical power as DR4 (prev. cosmology release)

Data Release 6 (DR6) expected this year

Current State of the Field: ACT

Colin Hill
Columbia

T

E

B

F

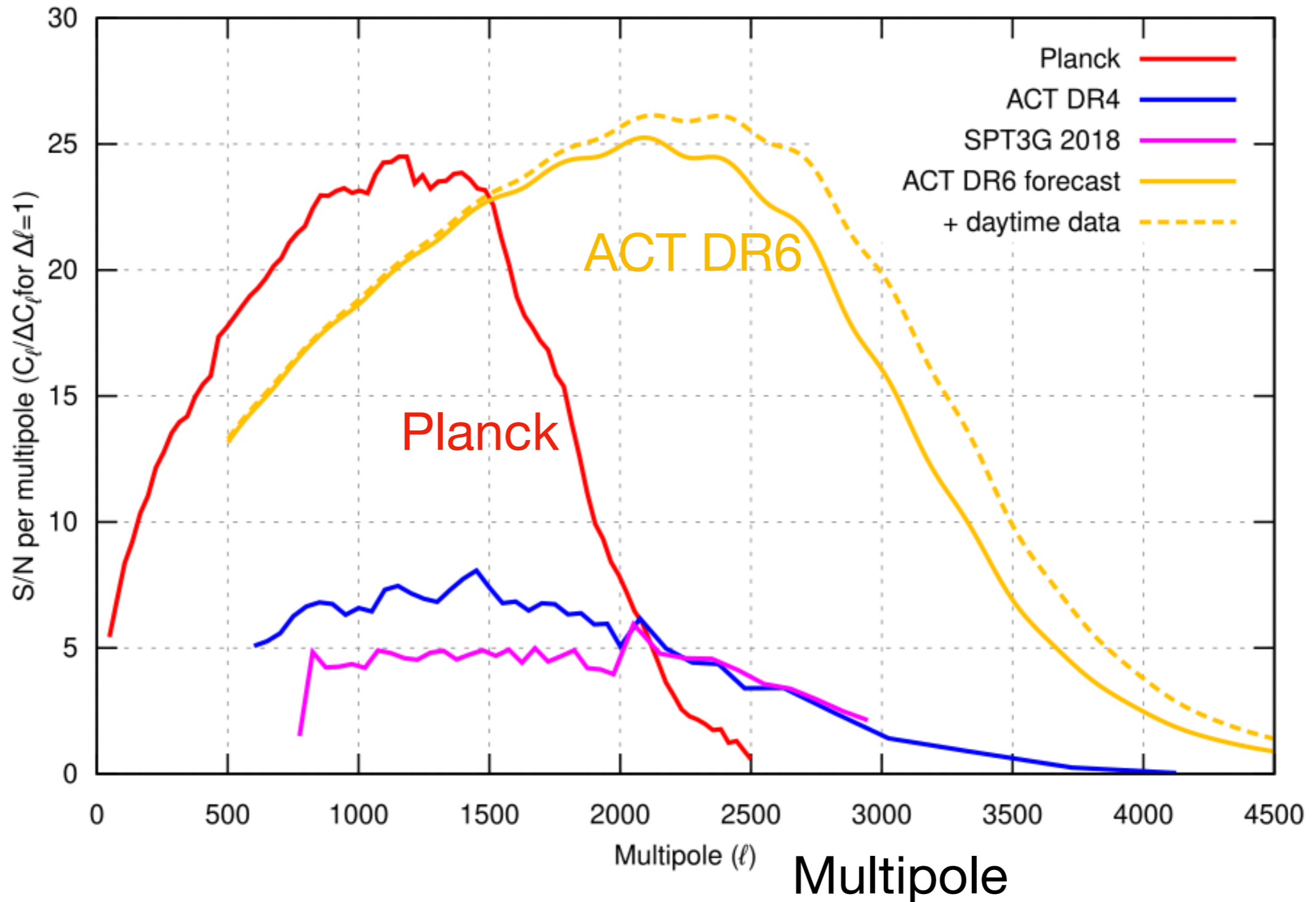
DR6 map
example
(from 4-5 μK
arcmin region)

ACT DR6 Sensitivity

Colin Hill
Columbia

S/N per multipole in TT power spectrum

Preliminary!



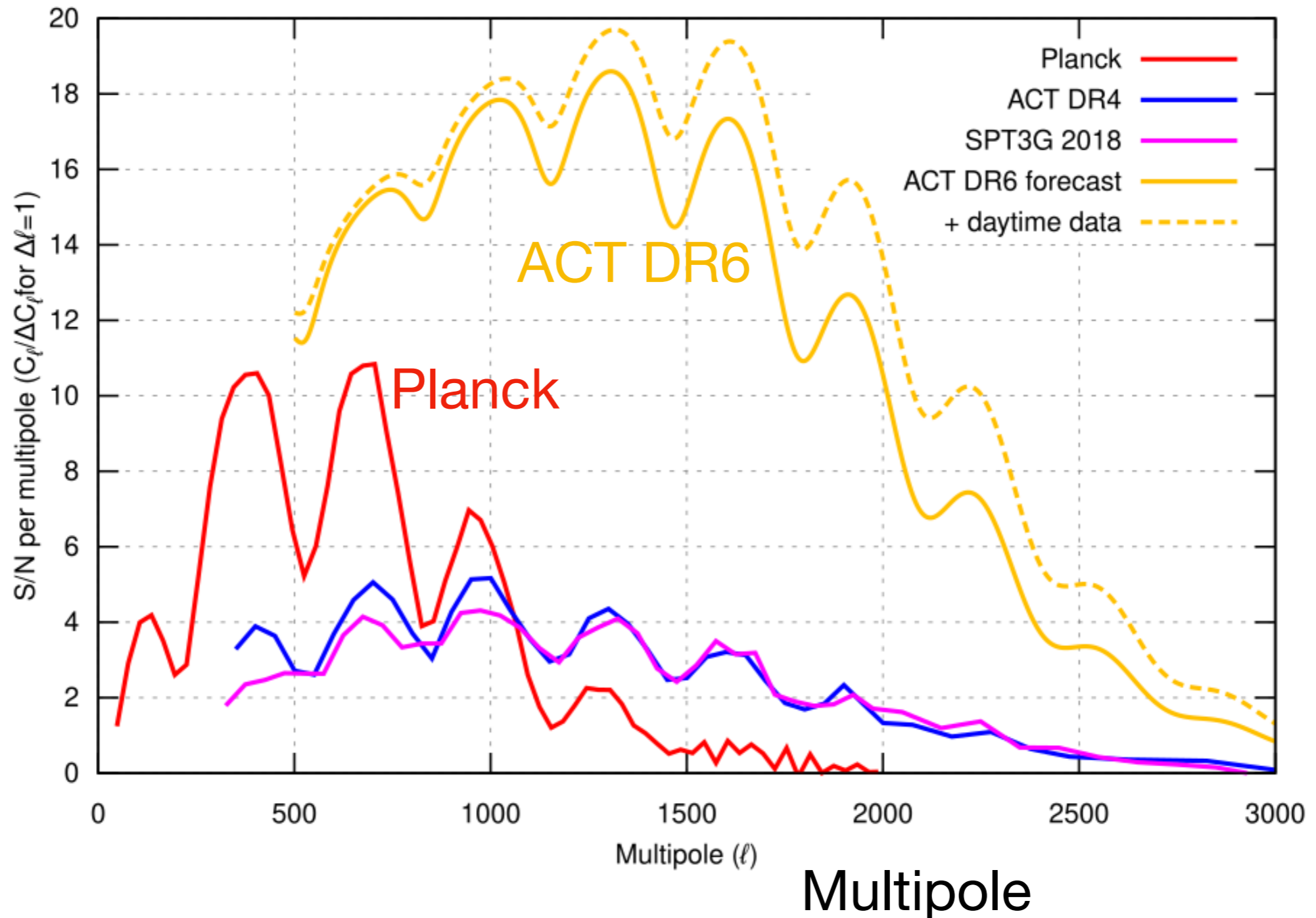
ACT DR6 Sensitivity

Colin Hill
Columbia

S/N per multipole in EE power spectrum

Preliminary!

Big step up
from both
DR4 and
Planck!



EE

ACT DR6: Robustness

End-to-end validation from maps to parameters

- Standard in previous CMB power spectrum analyses: simulate gaussian random fields and run analysis pipeline with the same sky model
- More stringent test in DR6: infer parameters from ~realistic, non-gaussian sky maps with realistic instrument systematics, using analysis pipeline that does not contain models designed to match these simulations

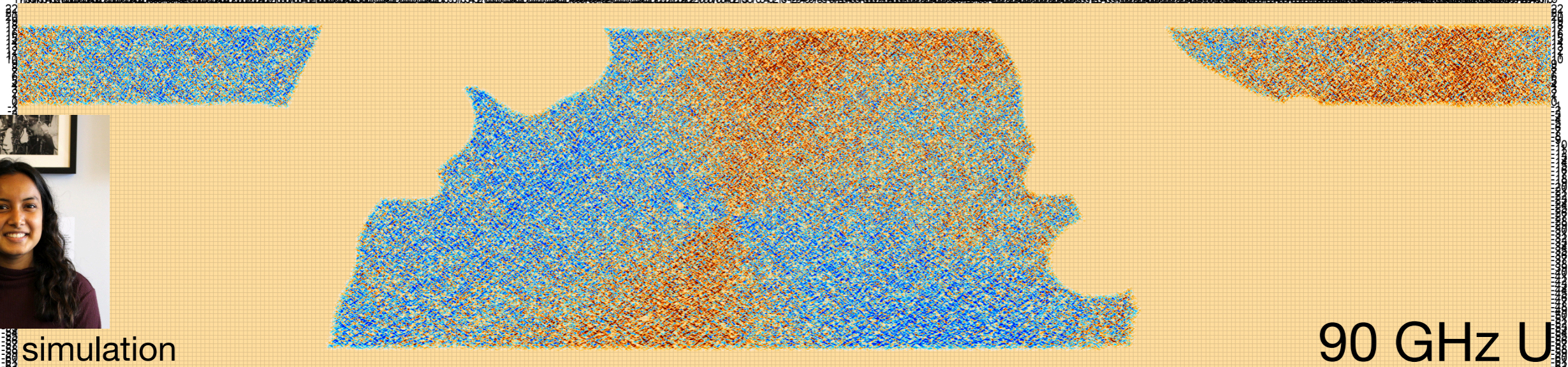
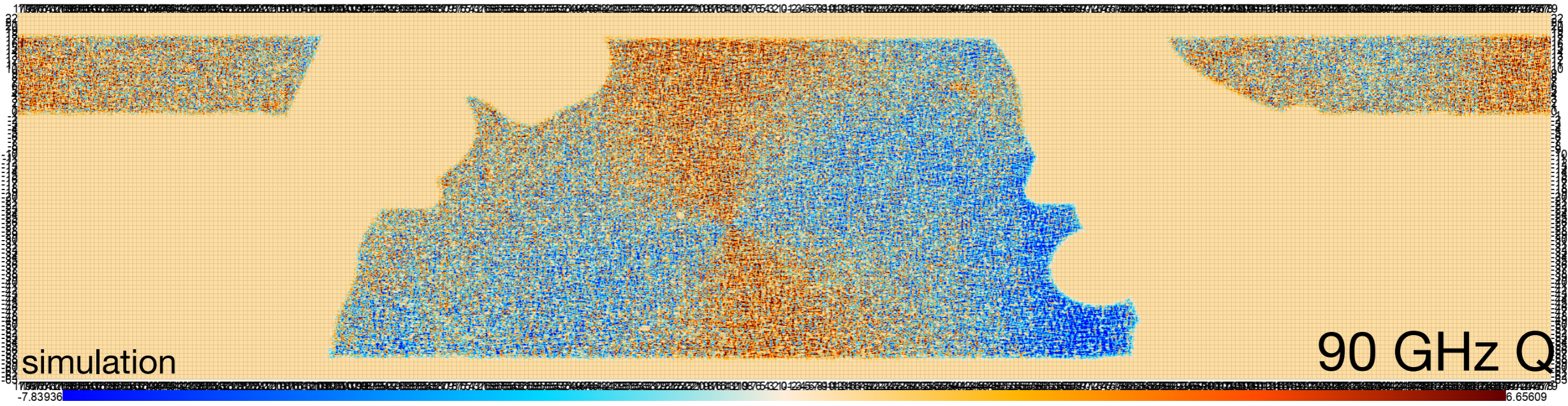
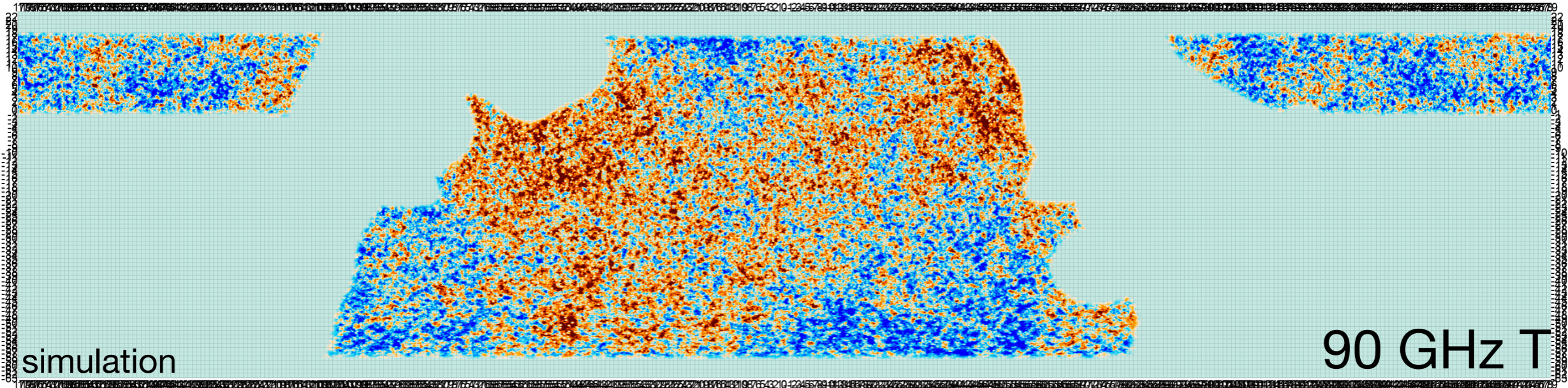
ACT DR6: Robustness

End-to-end validation from maps to parameters

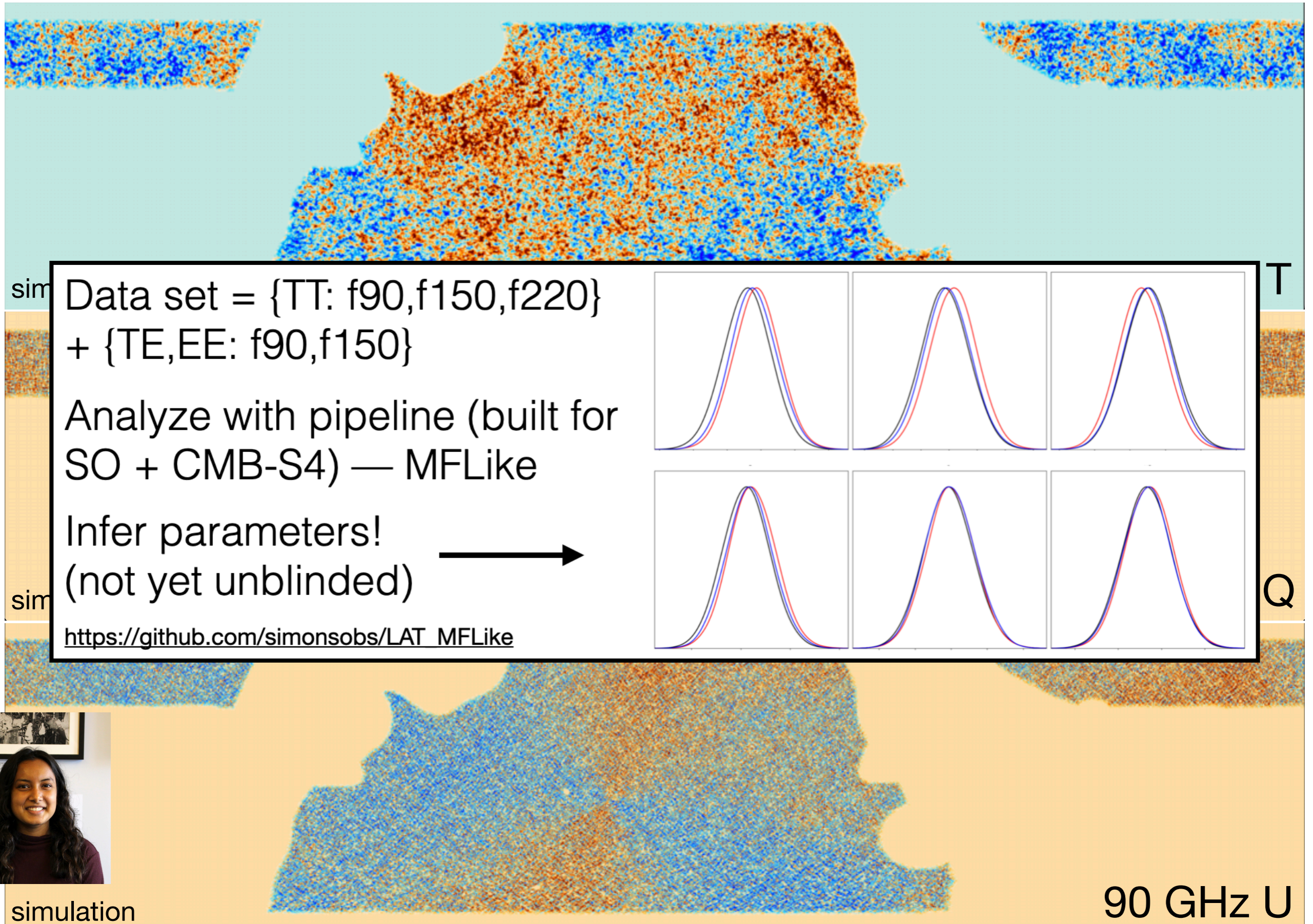
- Standard in previous CMB power spectrum analyses: simulate gaussian random fields and run analysis pipeline with the same sky model
- More stringent test in DR6: infer parameters from ~realistic, non-gaussian sky maps with realistic instrument systematics, using analysis pipeline that does not contain models designed to match these simulations
- Extragalactic fields = *Agora* (Omori 2022): N-body simulation post-processed with detailed models for secondary anisotropies, CIB, sources
- Galactic fields = *PySM3* (Thorne+2017, Zonca+2021)
- Maps for each ACT detector array are generated and processed with beams, passbands, and noise model built from data (Atkins+ 2023)
- Pipeline accelerated by >100x using neural-network-based Boltzmann code emulators (Bolliet, JCH,+ 2023)

ACT DR6: Robustness

Colin Hill
Columbia



ACT DR6: Robustness

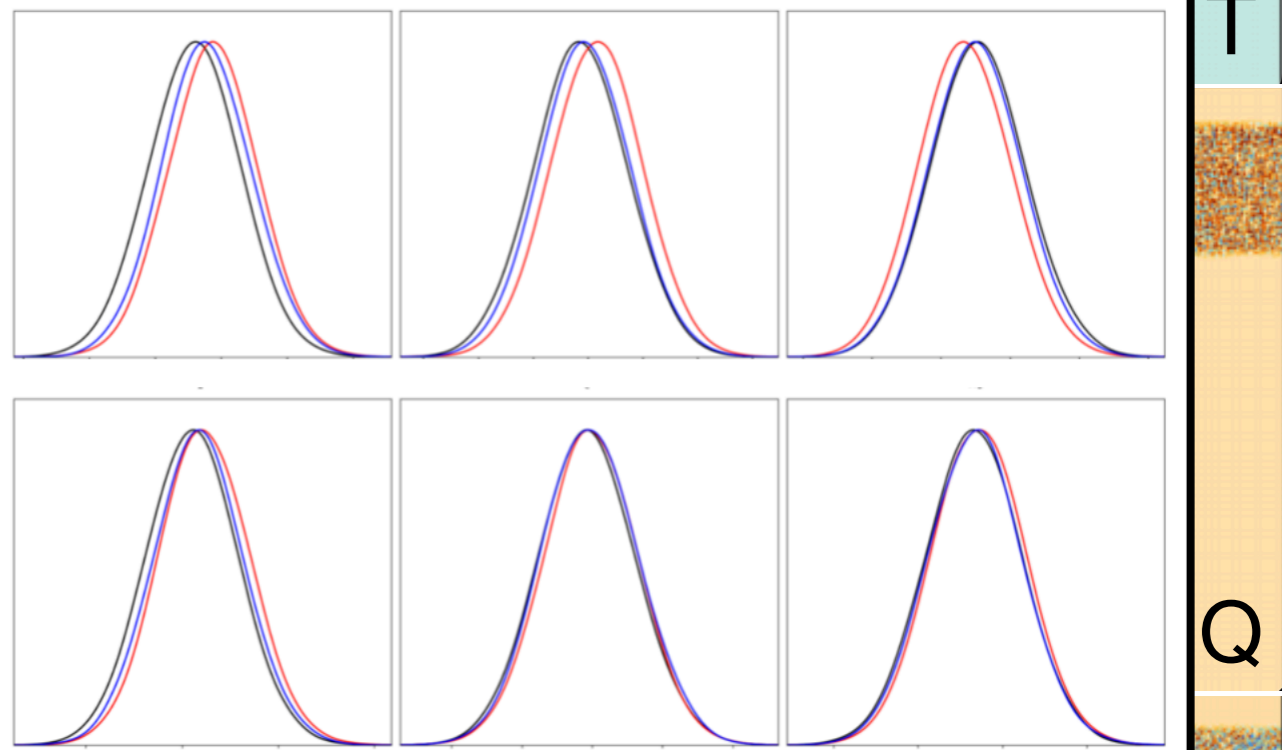


Data set = {TT: f90, f150, f220}
+ {TE, EE: f90, f150}

Analyze with pipeline (built for
SO + CMB-S4) — MFLike

Infer parameters!
(not yet unblinded) →

https://github.com/simonsobs/LAT_MFLike



simulation

ACT DR6 Projections

Λ CDM + extensions

	DR4 + WMAP	Planck	DR6 + Planck
$\sigma(H_0)$	1.1	0.5	0.4
$\sigma(n_s)$	0.006	0.004	0.003
$\sigma(N_{\text{eff}})$	0.3	0.2	0.1

Preliminary Forecast (rounded to 1 s.f.)

Also of interest — running of the spectral index:

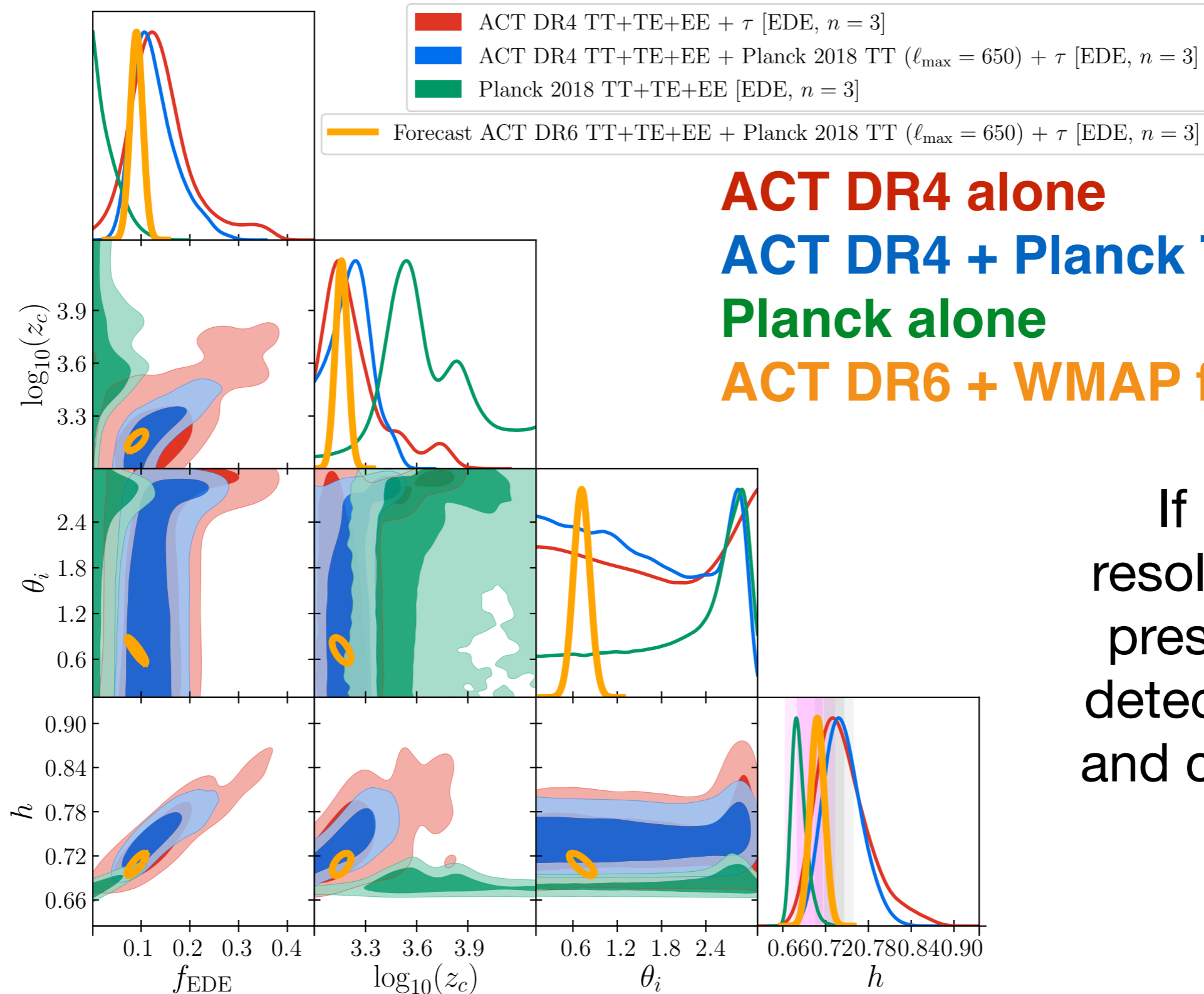
cf. 3σ hint of running from eBOSS Ly-alpha forest at $\alpha_s \sim -0.01$

— could exclude/confirm this hint at moderate S/N in DR6

ACT DR6 Projections

Colin Hill
Columbia

Axion-like early dark energy



ACT DR4 alone

ACT DR4 + Planck TT ($\ell < 650$)

Planck alone

ACT DR6 + WMAP forecast

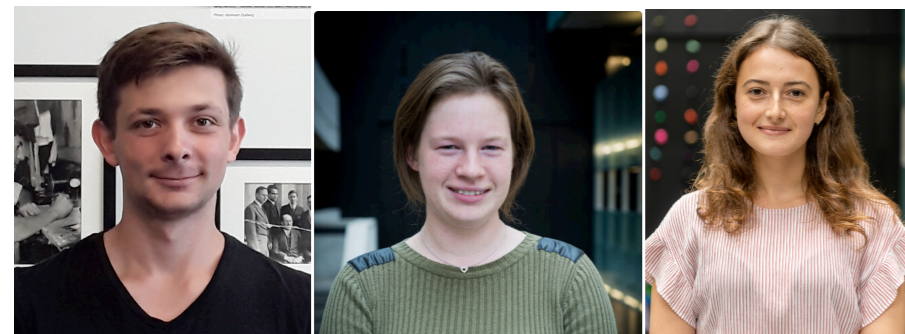
If H_0 -tension-resolving EDE is present, we will detect it at $\sim 10\sigma$ and constrain its dynamics

EDE fraction

Hubble

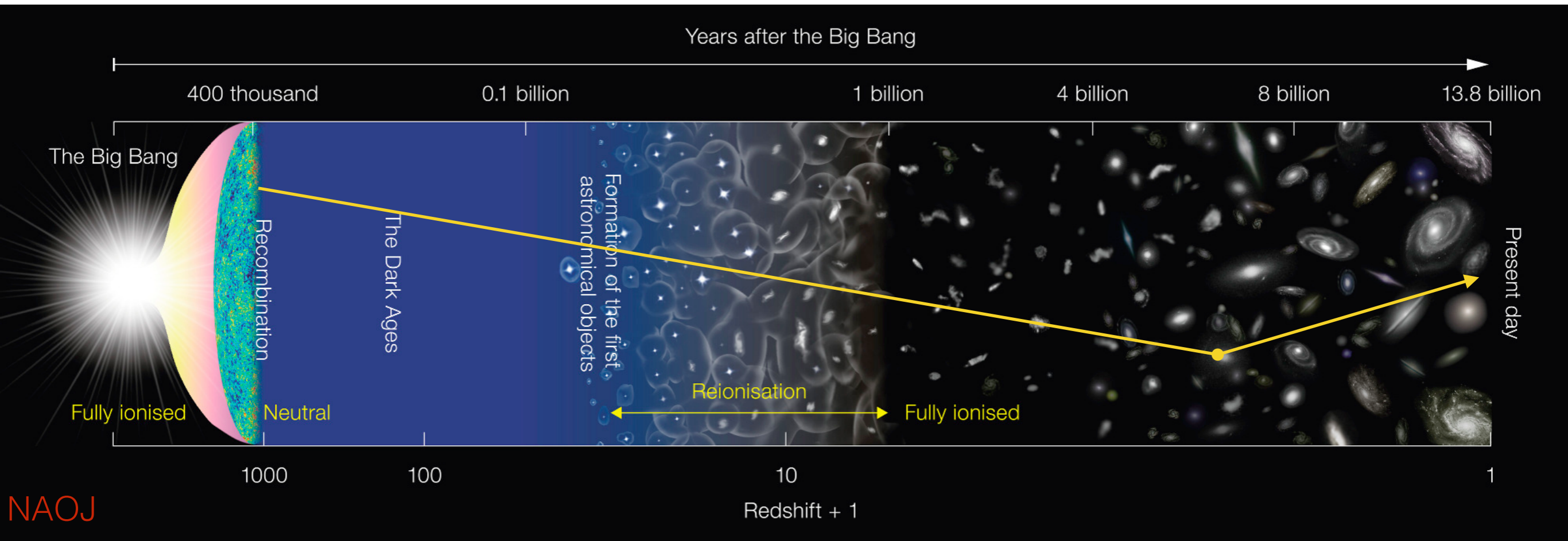
... stay tuned!

BSM Physics in the Secondary CMB



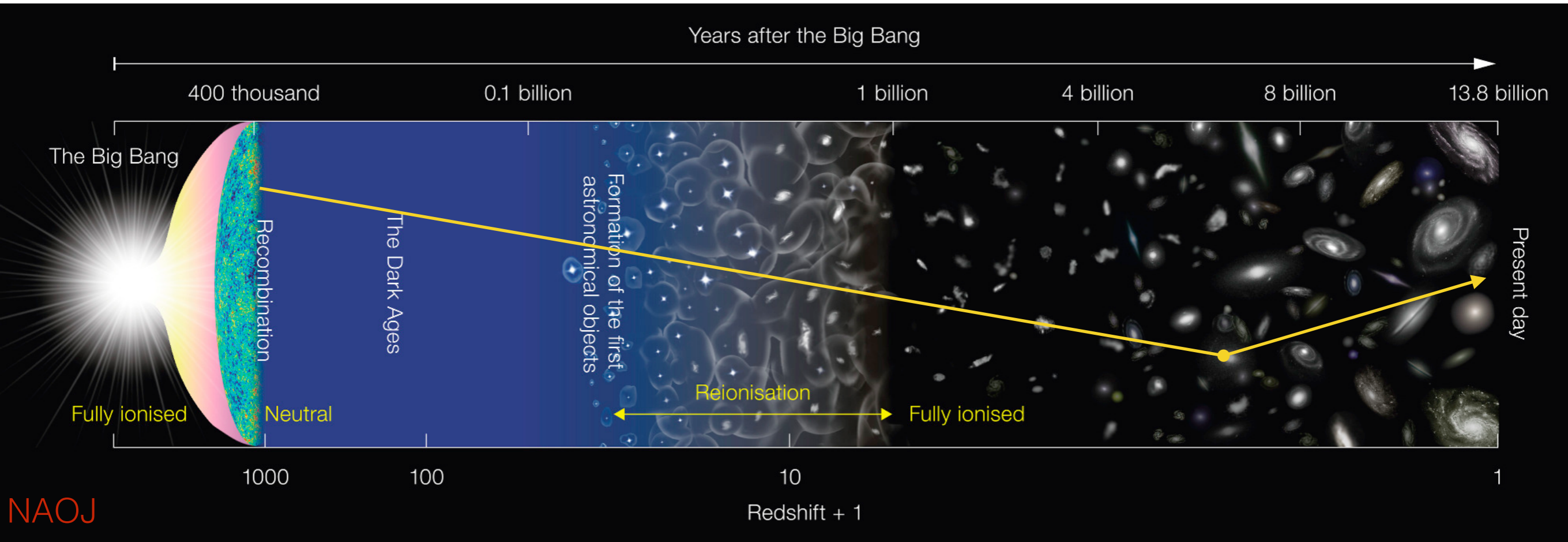
Cosmic Microwave Backlight

Secondary Anisotropies



Cosmic Microwave Backlight

Secondary Anisotropies



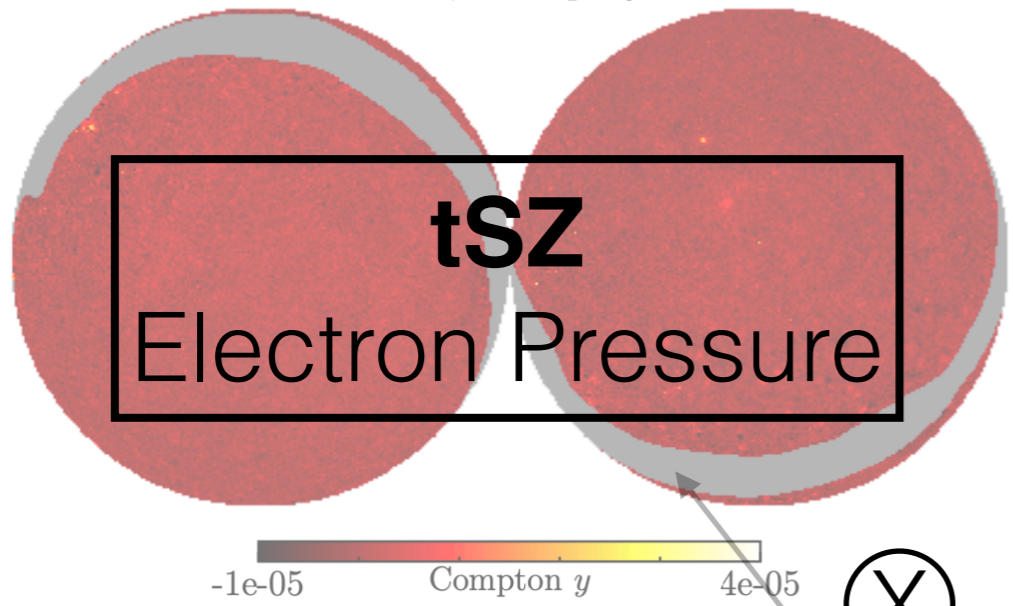
- Deflection: gravitational lensing
- Evolving potentials: integrated Sachs-Wolfe, Rees-Sciama effects
- Scattering: thermal / kinematic Sunyaev-Zel'dovich effects, patchy screening

Cosmic Microwave Backlight

Secondary Anisotropies

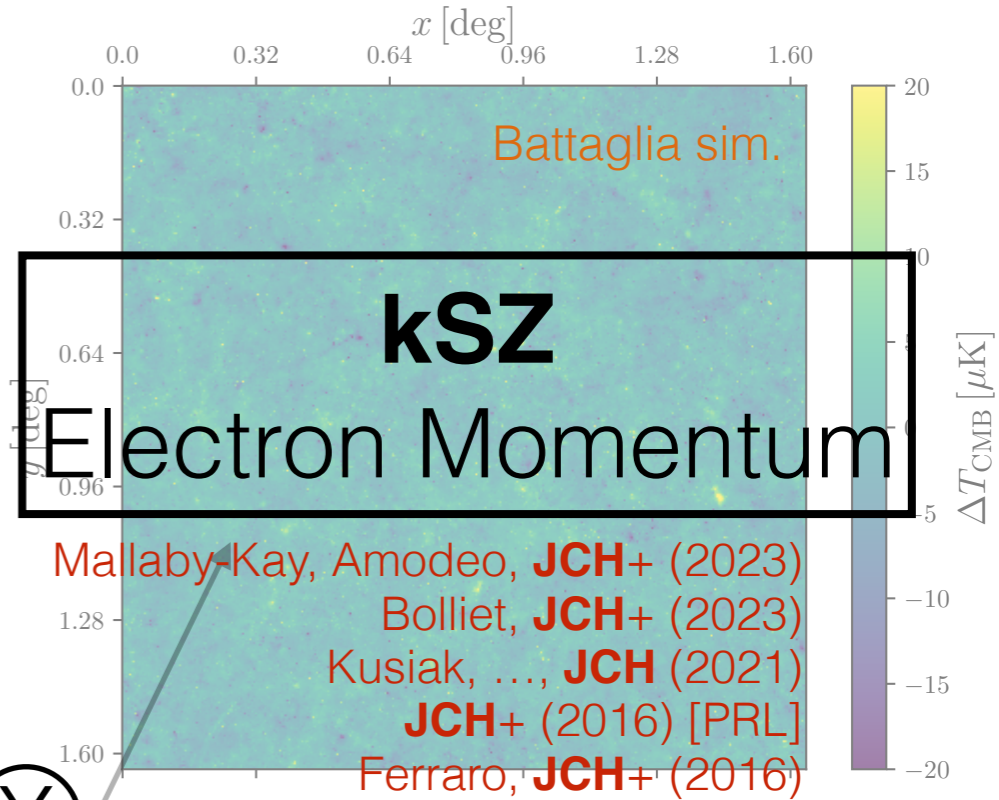
McCarthy & JCH (2023a)

NILC tSZ; no deprojection

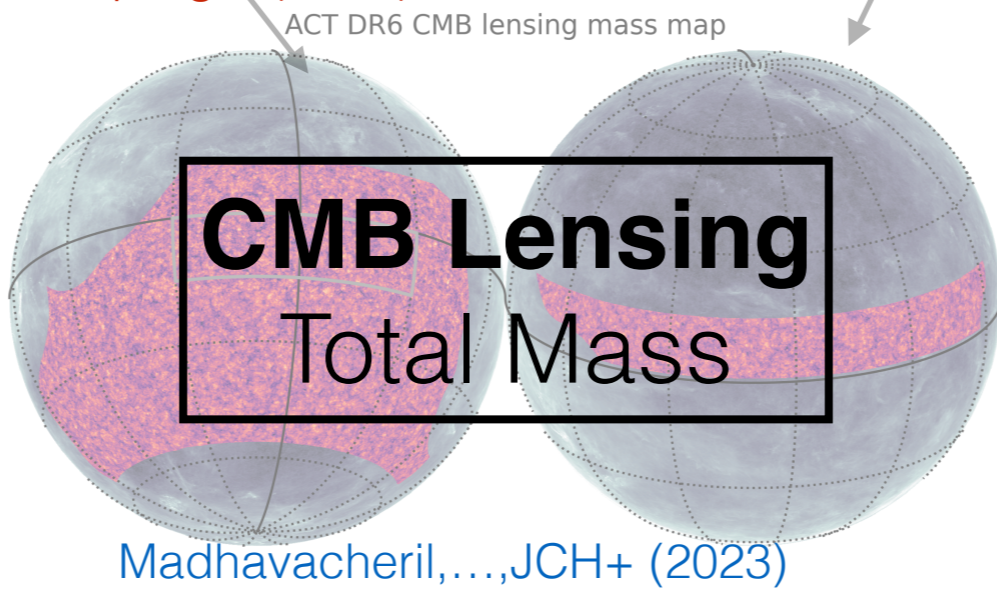


McCarthy & **JCH** (2023a)
 Coulton, Madhavacheril,
 Duivenvoorden, **JCH+** (2023)
 Wadekar, Thiele, **JCH+** (2023)
 Thiele, Wadekar, **JCH+** (2022)
 Madhavacheril, **JCH+** (2020)
 Pandey, Baxter, **JCH** (2019)
 Thiele, **JCH**, & Smith (2019)
JCH+ (2018)
 Alonso, **JCH+** (2018)
JCH+ (2015) [PRL]
 Greco, **JCH+** (2015)
JCH+ (2014)
JCH & Pajer (2013)
JCH & Sherwin (2013)
 Wilson, Sherwin, **JCH+** (2012)

McCarthy & **JCH** (2023b)
 Madhavacheril & **JCH** (2018)
 Battaglia, **JCH**, & Murray (2015)
JCH & Spergel (2014)



Mallaby-Kay, Amodeo, **JCH+** (2023)
 Bolliet, **JCH+** (2023)
 Kusiak, ..., **JCH** (2021)
JCH+ (2016) [PRL]
 Ferraro, **JCH+** (2016)
 Cai, Madhavacheril, **JCH**, Kosowsky (2022)
 Ferraro & **JCH** (2018)

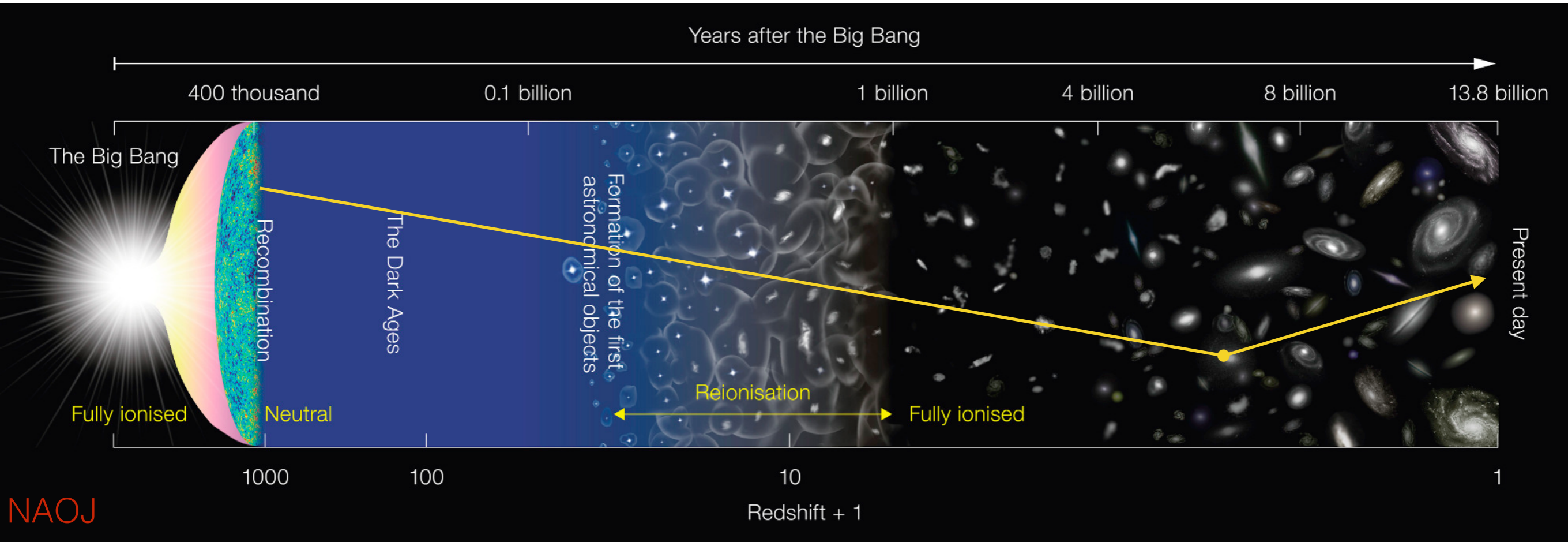


Madhavacheril, ..., JCH+ (2023)

Marques, Liu, Huffenberger, **JCH+** (2021)
 Yu, **JCH**, & Sherwin (2017)
 Liu, **JCH+** (2016)
 Liu & **JCH** (2015)

Cosmic Microwave Backlight

Secondary Anisotropies



- Deflection: gravitational lensing
 - Evolving potentials: integrated Sachs-Wolfe, Rees-Sciama effects
 - Scattering: thermal / kinematic Sunyaev-Zel'dovich effects, patchy screening
- + BSM conversion: dark screening**

Dark Screening in the CMB

BSM Portals

Only a few well-motivated, renormalizable interactions allowed by SM symmetries that provide a portal between the SM and the dark sector:

Portal	Particles	Operator(s)
“Vector”	Dark photons	$-\frac{\epsilon}{2 \cos \theta_W} B_{\mu\nu} F'^{\mu\nu}$
“Axion”	Pseudoscalars	$\frac{a}{f_a} F_{\mu\nu} \tilde{F}^{\mu\nu}, \frac{a}{f_a} G_{i\mu\nu} \tilde{G}_i^{\mu\nu}, \frac{\partial_\mu a}{f_a} \bar{\psi} \gamma^\mu \gamma^5 \psi$
“Higgs”	Dark scalars	$(\mu S + \lambda S^2) H^\dagger H$
“Neutrino”	Sterile neutrinos	$y_N L H N$

Dark Screening in the CMB

BSM Portals

Only a few well-motivated, renormalizable interactions allowed by SM symmetries that provide a portal between the SM and the dark sector:

Portal	Particles	Operator(s)
“Vector”	Dark photons	$-\frac{\epsilon}{2 \cos \theta_W} B_{\mu\nu} F'^{\mu\nu}$
“Axion”	Pseudoscalars	$\frac{a}{f_a} F_{\mu\nu} \tilde{F}^{\mu\nu}, \frac{a}{f_a} G_{i\mu\nu} \tilde{G}_i^{\mu\nu}, \frac{\partial_\mu a}{f_a} \bar{\psi} \gamma^\mu \gamma^5 \psi$
“Higgs”	Dark scalars	$(\mu S + \lambda S^2) H^\dagger H$
“Neutrino”	Sterile neutrinos	$y_N L H N$

Dark Screening in the CMB

BSM Portals

Only a few well-motivated, renormalizable interactions allowed by SM symmetries that provide a portal between the SM and the dark sector:

Portal	Particles	Operator(s)
“Vector”	Dark photons	$-\frac{\epsilon}{2 \cos \theta_W} B_{\mu\nu} F'^{\mu\nu}$
“Axion”	Pseudoscalars	$\frac{a}{f_a} F_{\mu\nu} \tilde{F}^{\mu\nu}, \frac{a}{f_a} G_{i\mu\nu} \tilde{G}_i^{\mu\nu}, \frac{\partial_\mu a}{f_a} \bar{\psi} \gamma^\mu \gamma^5 \psi$
“Higgs”	Dark scalars	$(\mu S + \lambda S^2) H^\dagger H$
“Neutrino”	Sterile neutrinos	$y_N L H N$

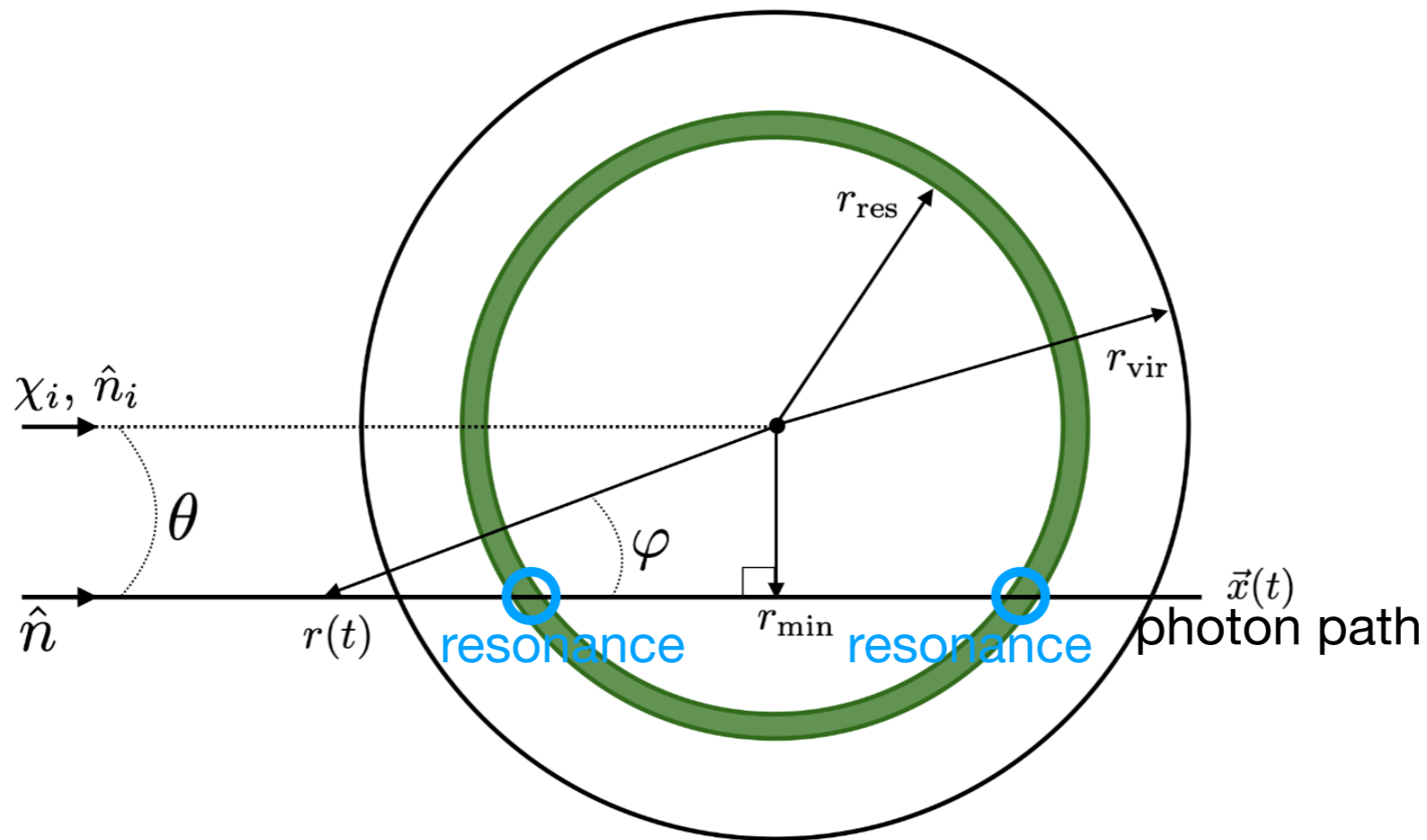
Dominant effect relevant to CMB: resonant conversion when “plasma mass” of CMB photon = dark photon mass or axion mass

→ Sensitive to mass range $\sim 10^{-13}$ eV — 10^{-11} eV

Dark Screening in the CMB

(Massive) Dark Photon

Halo model viewpoint:



resonance location
depends on DP mass
and electron density
profile of halo



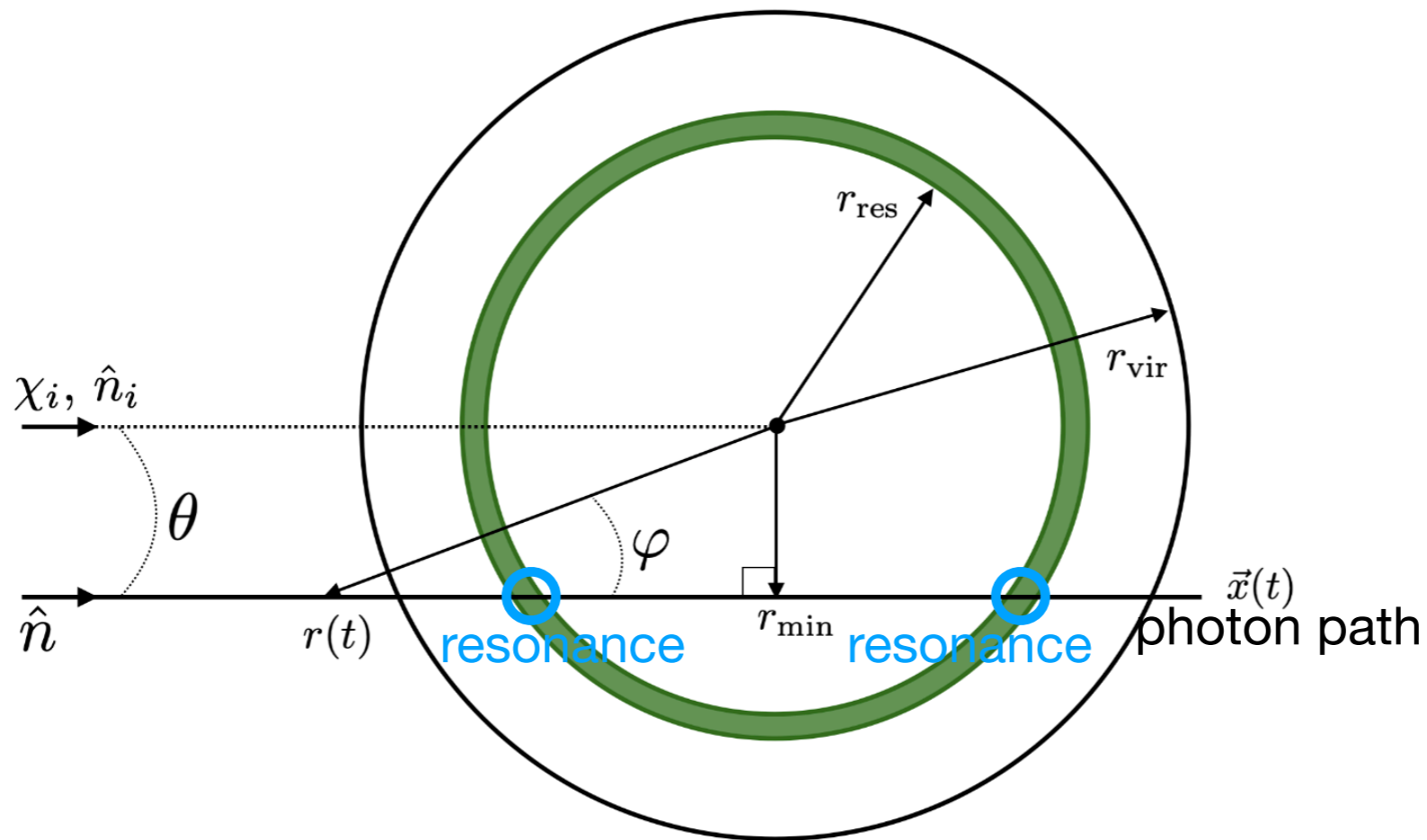
→ **Spatially varying spectral distortion in the CMB, which traces LSS**

(just like, e.g., the thermal SZ effect)

Dark Screening in the CMB

Axion-Like Particle

Halo model viewpoint:



resonance location
depends on axion
mass and electron
density profile of halo

signal strength
depends on magnetic
field within halo



→ **Spatially varying spectral distortion in the CMB, which traces LSS**

(just like, e.g., the thermal SZ effect)

Dark Screening in the CMB

Distortion SEDs

Dark
photon: $\frac{\Delta T(x)}{T_{\text{CMB}}} \propto -\frac{\epsilon^2 m_{A'}^2}{x} \left(\frac{1 - e^{-x}}{x} \right)$

Axion: $\frac{\Delta T(x)}{T_{\text{CMB}}} \propto -\frac{g_{a\gamma\gamma}^2 B^2}{m_a^2} x \left(\frac{1 - e^{-x}}{x} \right)$

$$x \equiv h\nu / (k_B T_{\text{CMB}})$$

Dark Screening in the CMB

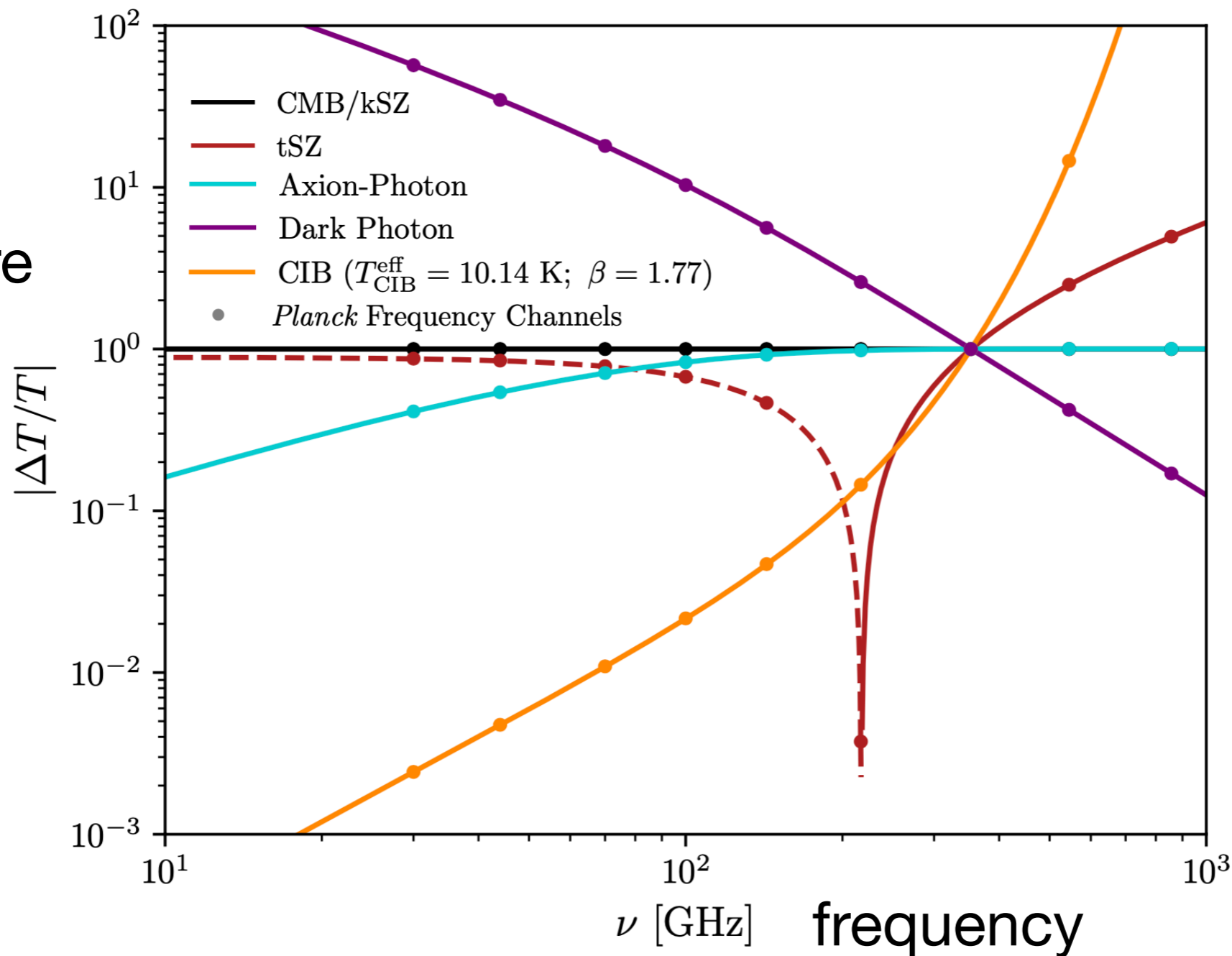
Distortion SEDs

Dark photon: $\frac{\Delta T(x)}{T_{\text{CMB}}} \propto -\frac{\epsilon^2 m_{A'}^2}{x} \left(\frac{1 - e^{-x}}{x} \right)$

Axion: $\frac{\Delta T(x)}{T_{\text{CMB}}} \propto -\frac{g_{a\gamma\gamma}^2 B^2}{m_a^2} x \left(\frac{1 - e^{-x}}{x} \right)$

CMB
temperature
fluctuation

$x \equiv h\nu / (k_B T_{\text{CMB}})$



all SEDs
normalized to
1 at 353 GHz

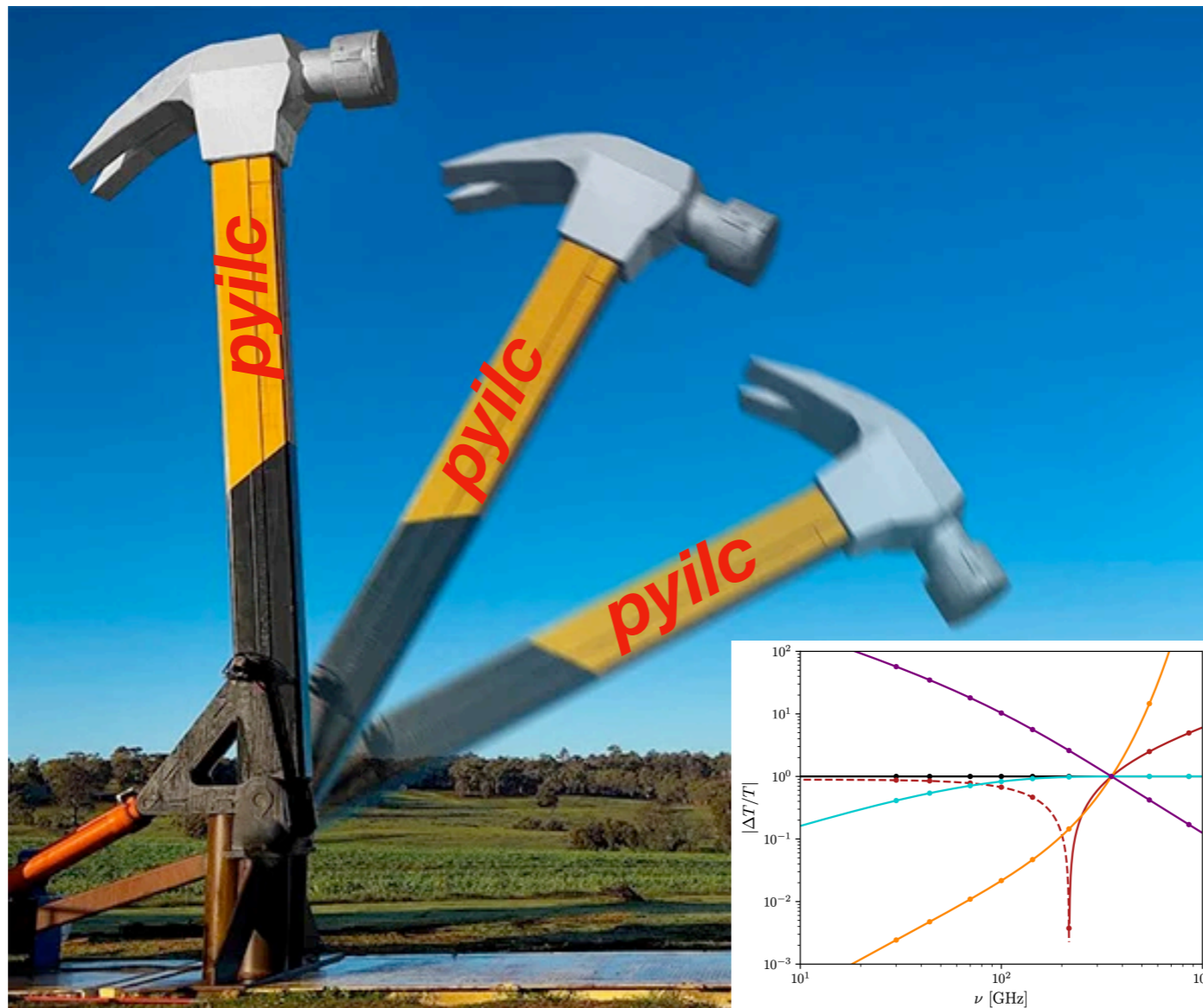
Dark Screening in the CMB

Distortion SEDs

Dark photon: $\frac{\Delta T(x)}{T_{\text{CMB}}} \propto -\frac{\epsilon^2 m_{A'}^2}{x} \left(\frac{1 - e^{-x}}{x} \right)$

Axion: $\frac{\Delta T(x)}{T_{\text{CMB}}} \propto -\frac{g_{a\gamma\gamma}^2 B^2}{m_a^2} x \left(\frac{1 - e^{-x}}{x} \right)$

$x \equiv h\nu / (k_B T_{\text{CMB}})$



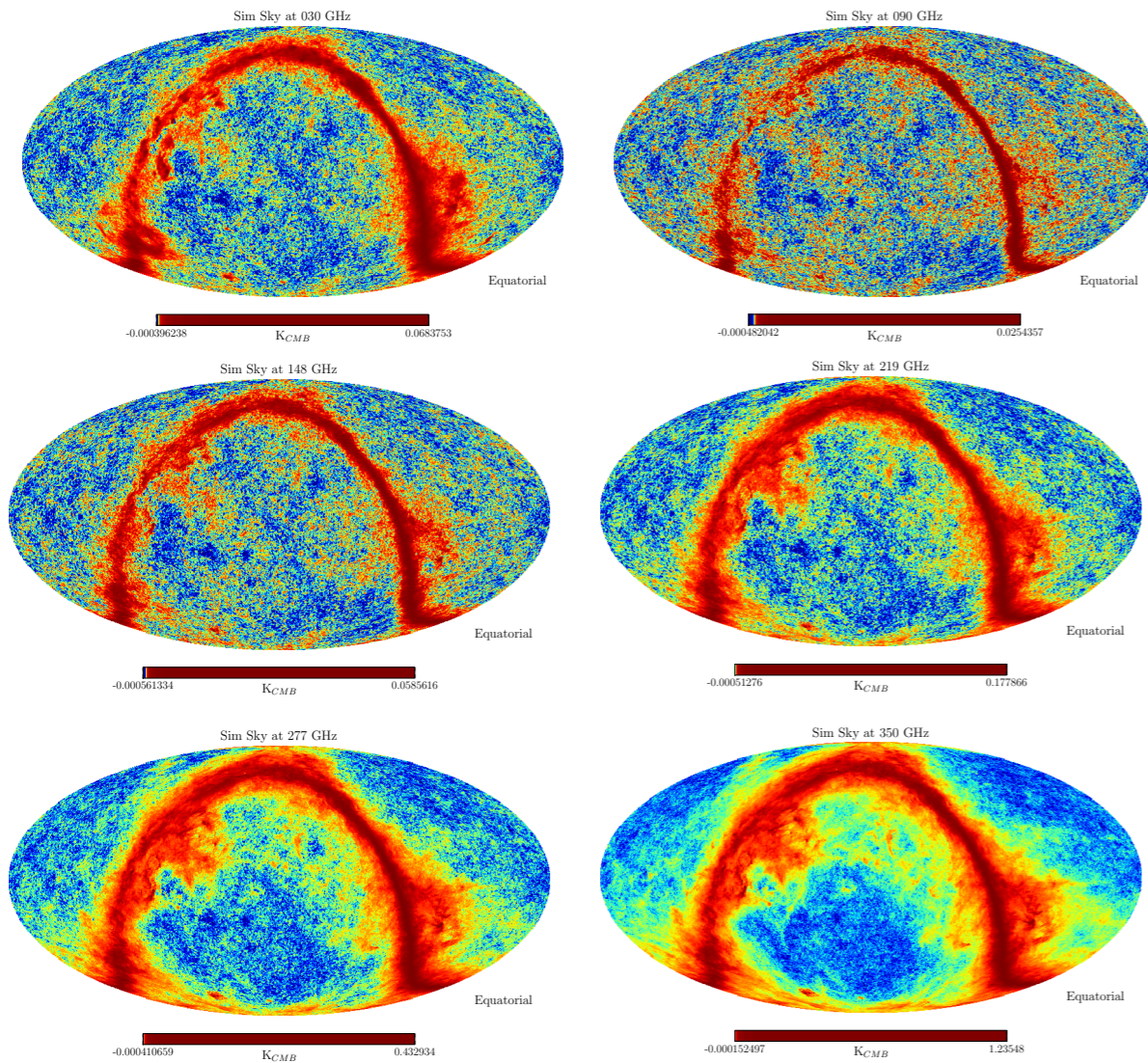
Crucial:
instrument
passbands and
beams

Dark Screening: Extraction

Colin Hill
Columbia

Internal Linear Combination

“semi-blind” approach to component separation



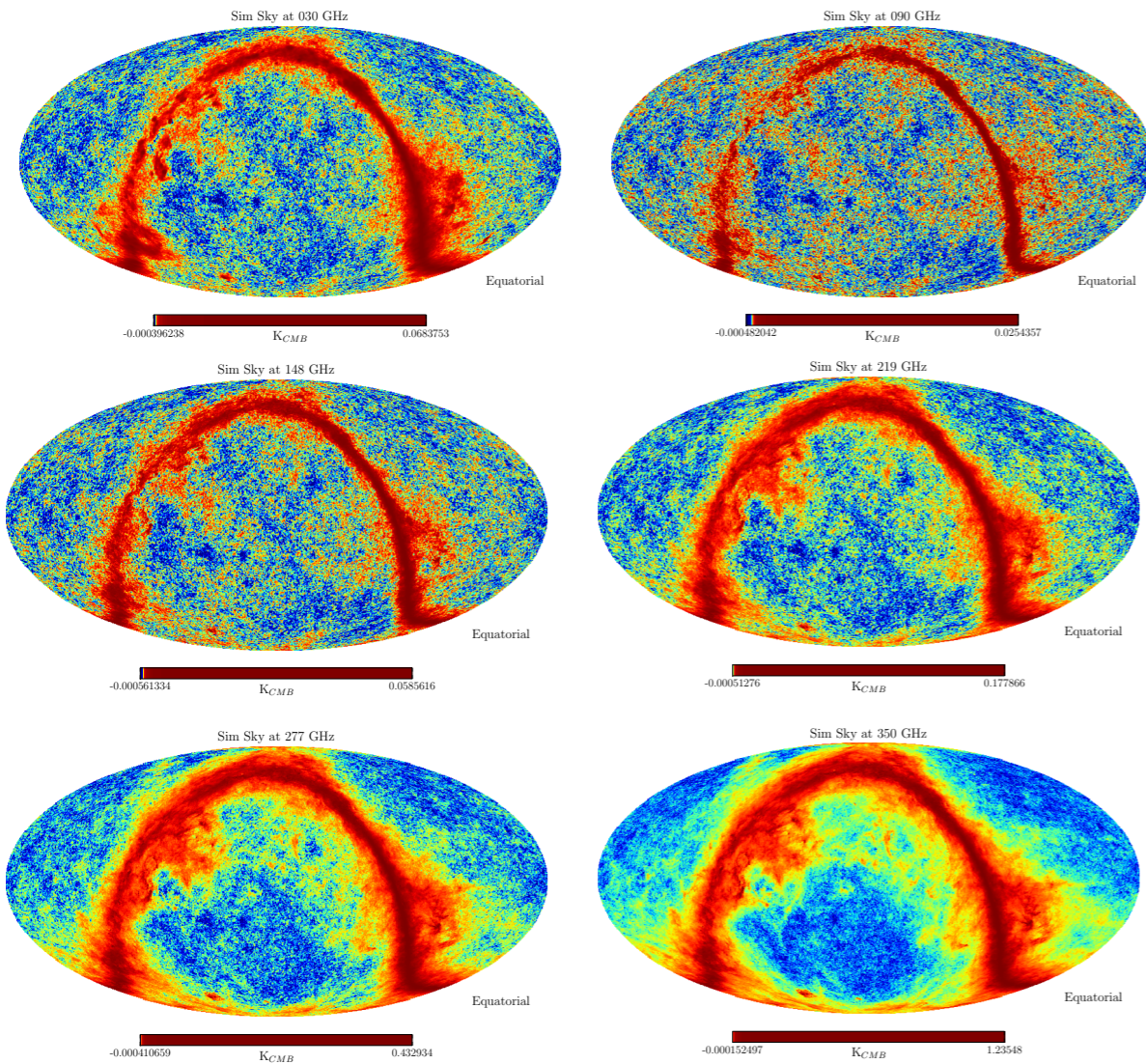
frequency maps

Dark Screening: Extraction

Colin Hill
Columbia

Internal Linear Combination

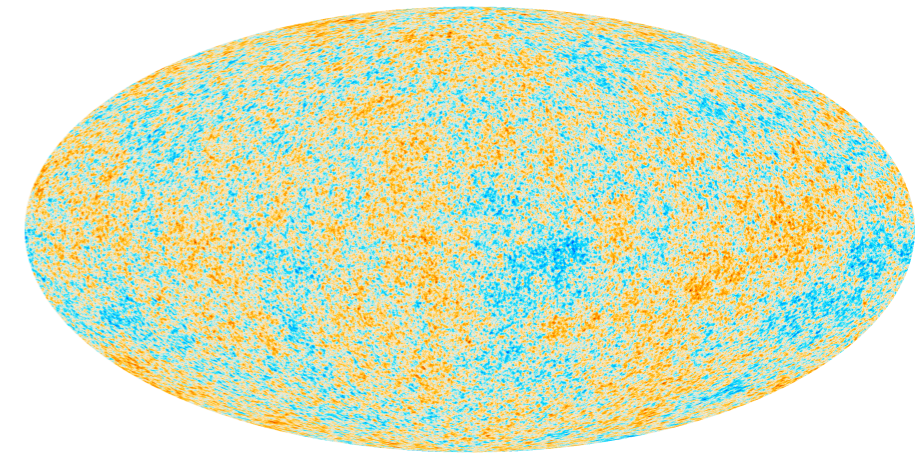
“semi-blind” approach to component separation



find linear
combination
with



minimum
variance and
unbiased
response to
signal of
interest



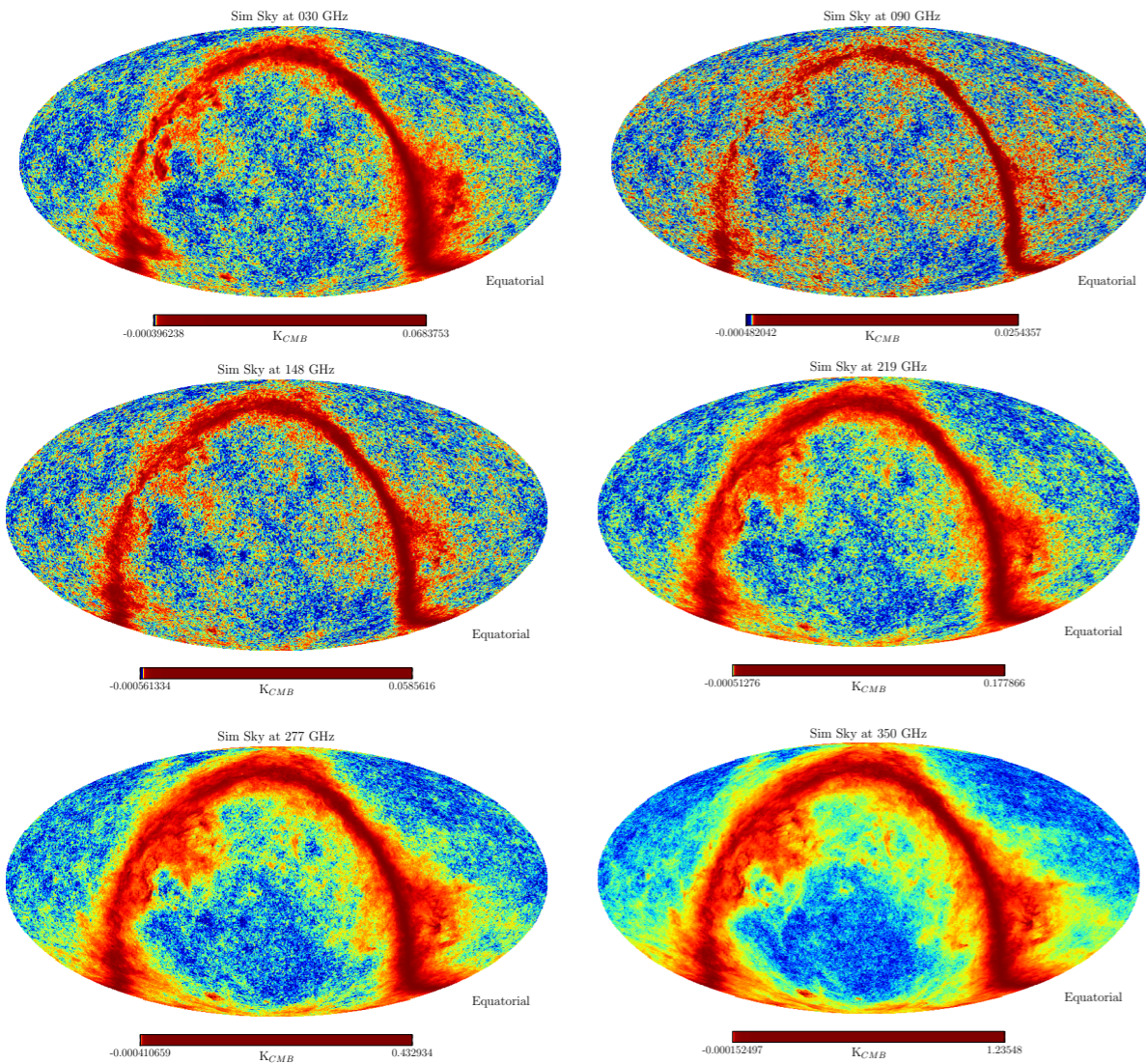
frequency maps

Dark Screening: Extraction

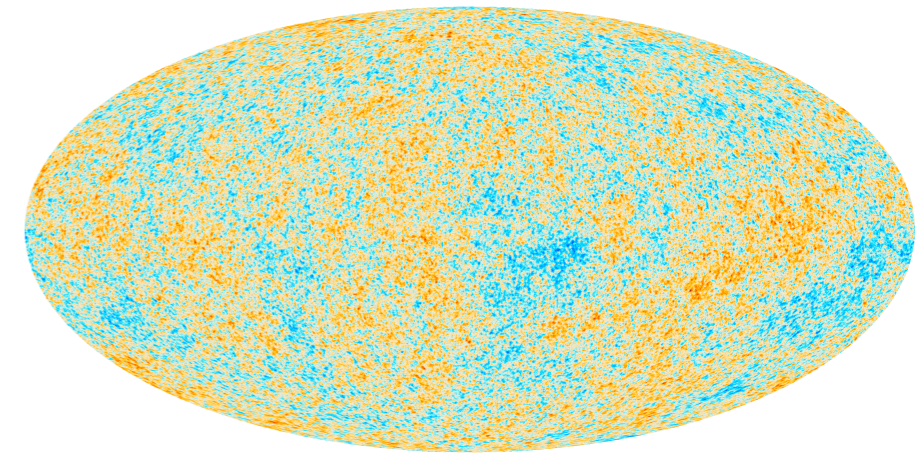
Colin Hill
Columbia

Internal Linear Combination

“semi-blind” approach to component separation



find linear
combination
with
→
minimum
variance and
unbiased
response to
signal of
interest



Flexibility: domain on which to do linear combination (we use needlets)

Extension: impose constraints to null (“deproject”) contaminants

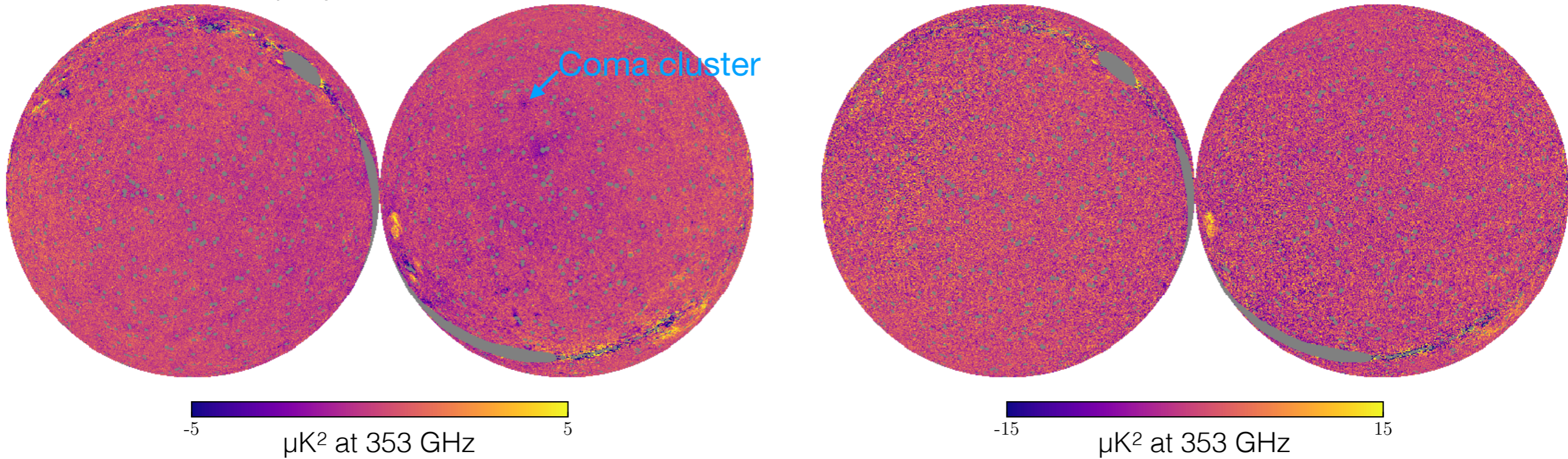
Dark Screening: Extraction

Colin Hill
Columbia

First Maps of Dark Photon-Induced Patchy Screening

No deprojection constraints

tSZ+CIB+dCIB/d β deprojection constraints



<https://github.com/jcolinhill/pyilc>

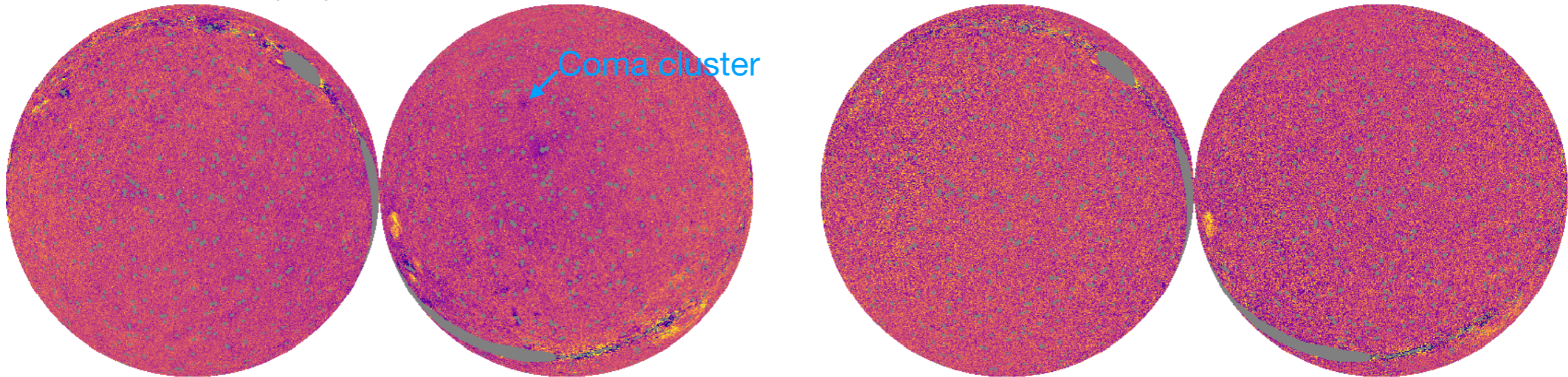
Dark Screening: Extraction

Colin Hill
Columbia

First Maps of Dark Photon-Induced Patchy Screening

No deprojection constraints

tSZ+CIB+dCIB/d β deprojection constraints

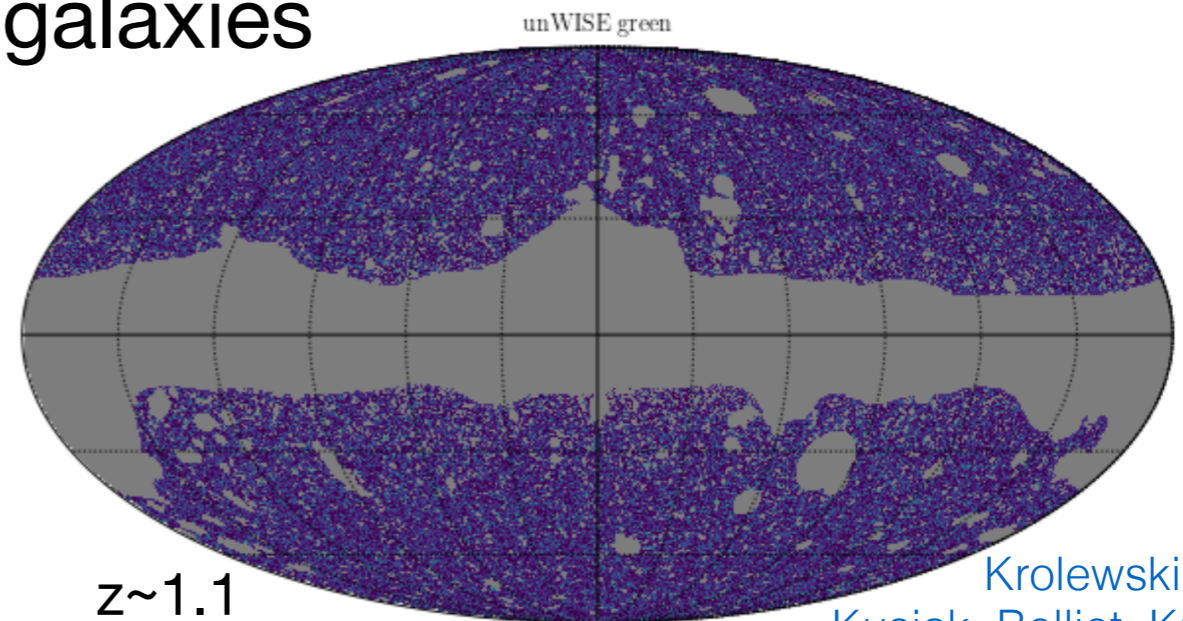
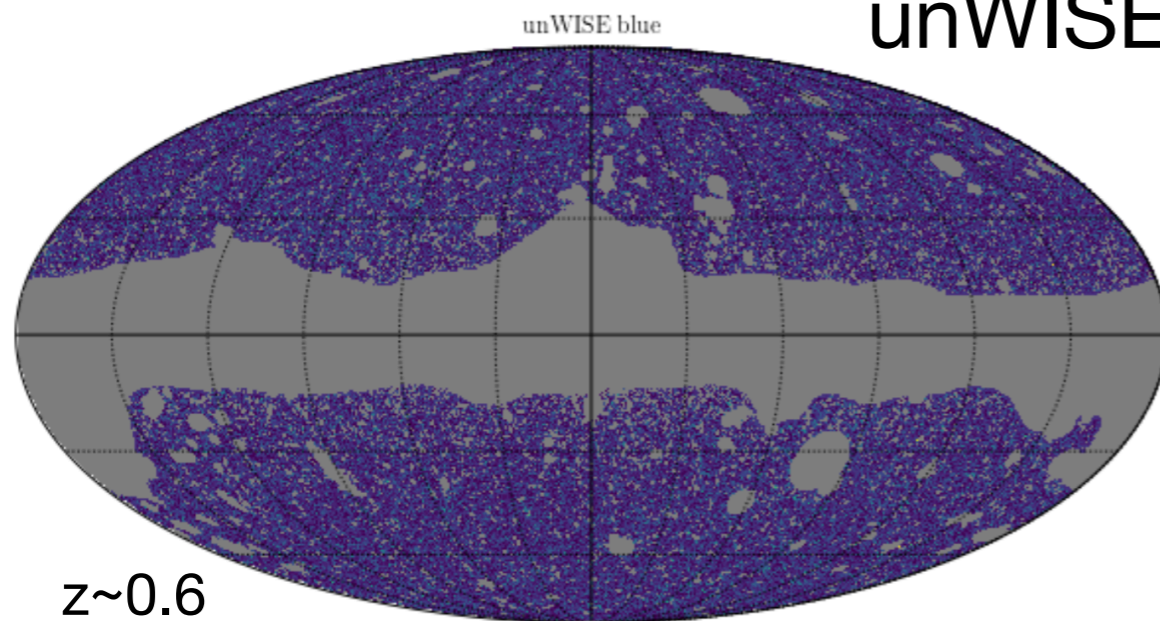


-5 μK^2 at 353 GHz 5

-15 μK^2 at 353 GHz 15

X

unWISE galaxies



δ_{g-1} 6.0898

δ_{g-1} 6.81664

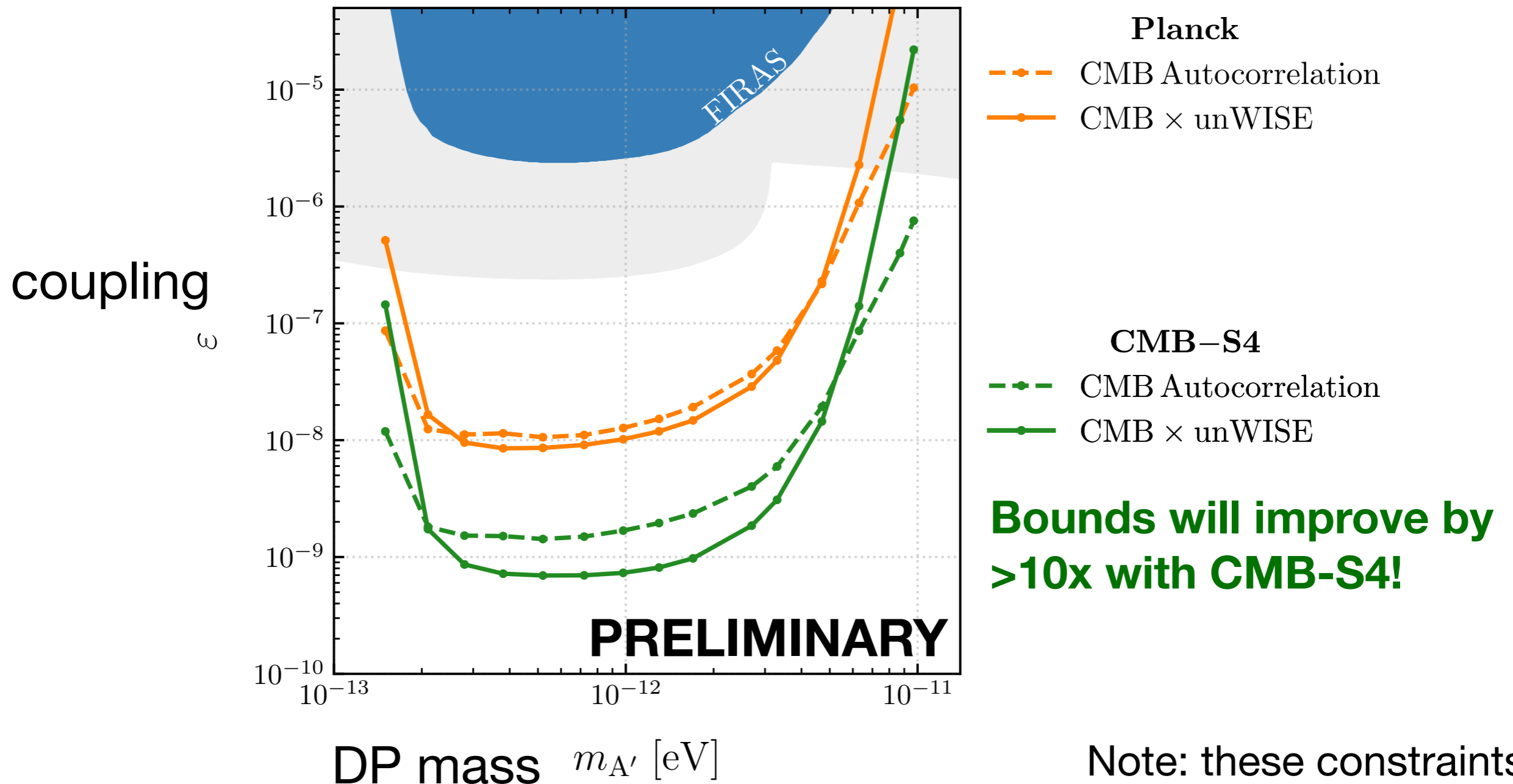
Krolewski+ (2020)
Kusiak, Bolliet, Krolewski,
JCH (2022)

Dark Photon Screening

Colin Hill
Columbia

Constraints on SM photon - DP coupling

Tightest constraints on this coupling in the mass range accessible to CMB



Note: these constraints do
not require the DP to
comprise the dark matter

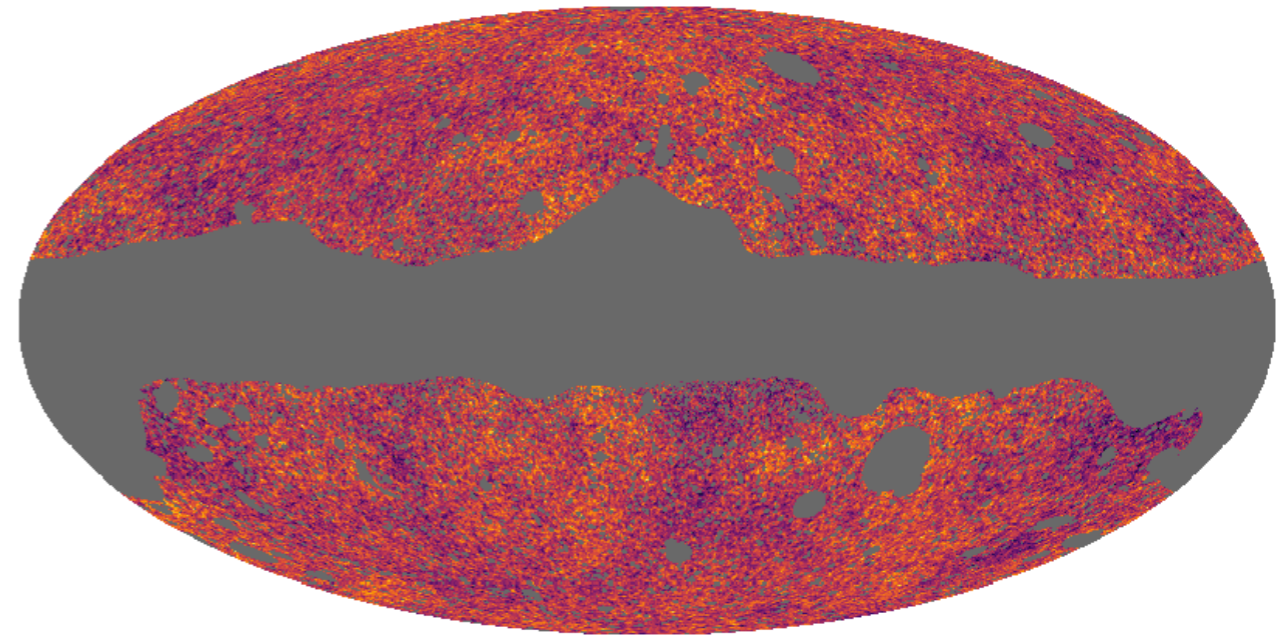
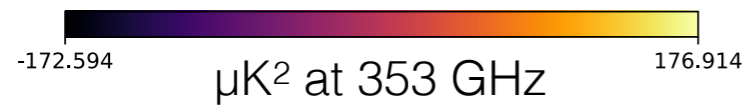
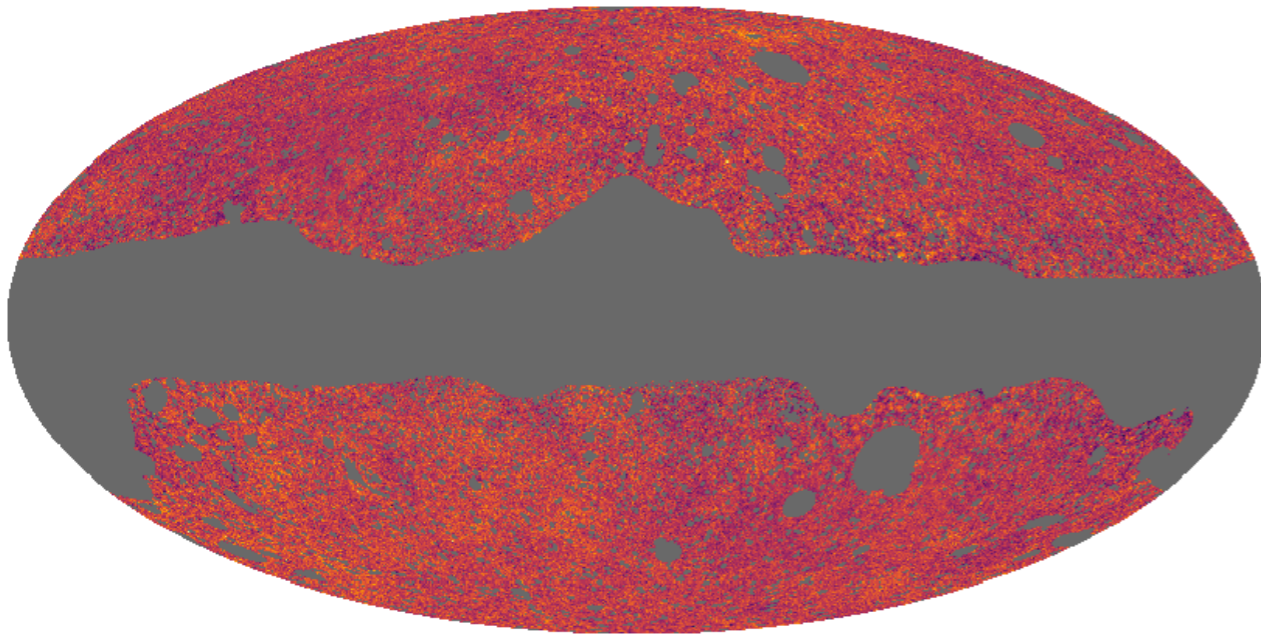
Axion Screening: Extraction

Colin Hill
Columbia

First Maps of Axion-Induced Patchy Screening

No deprojection constraints

tSZ+CIB+dCIB/d β deprojection constraints



<https://github.com/jcolinhill/pyilc>

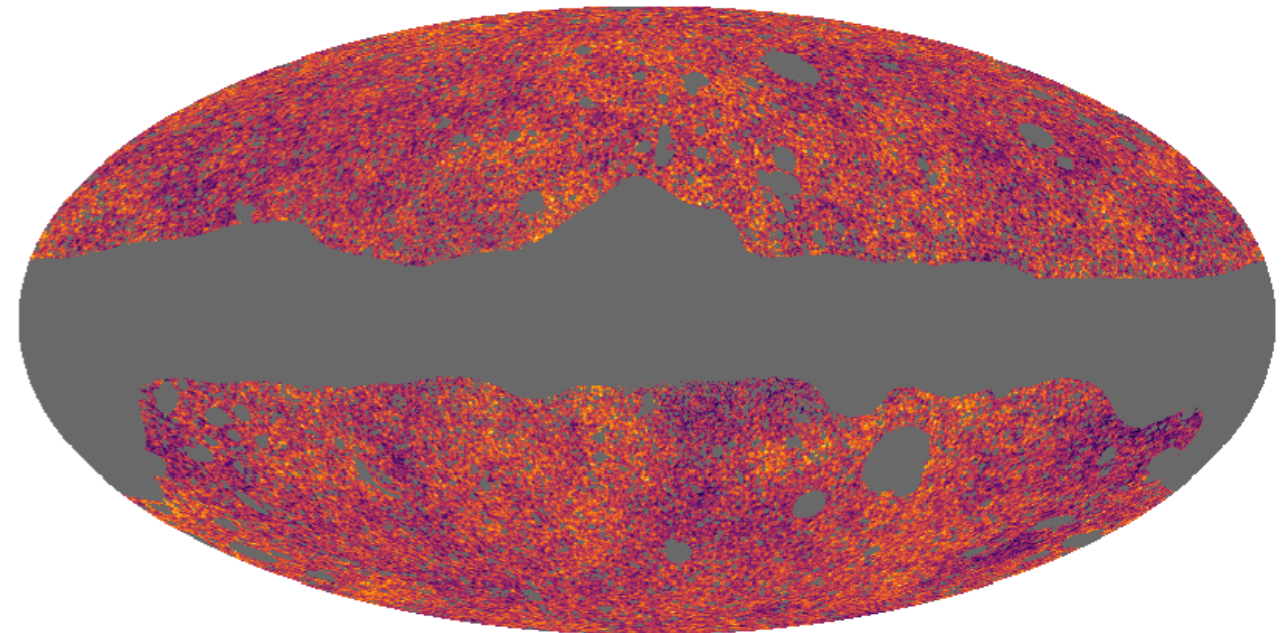
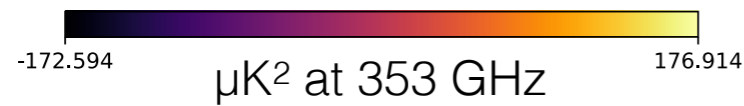
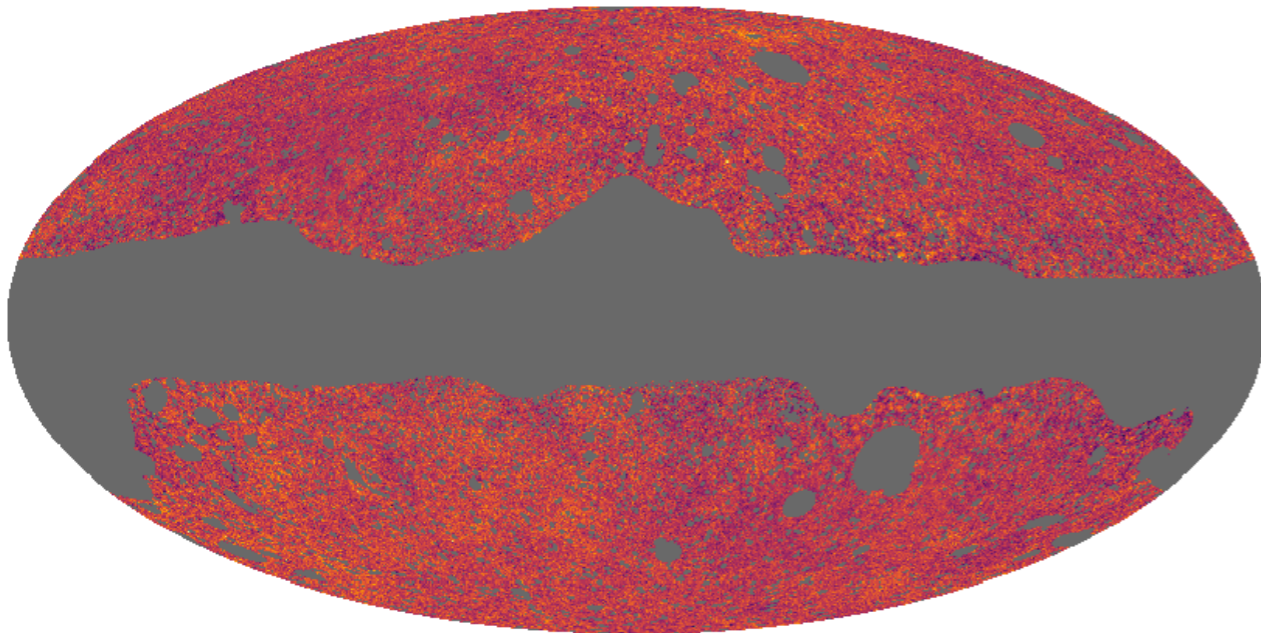
Axion Screening: Extraction

Colin Hill
Columbia

First Maps of Axion-Induced Patchy Screening

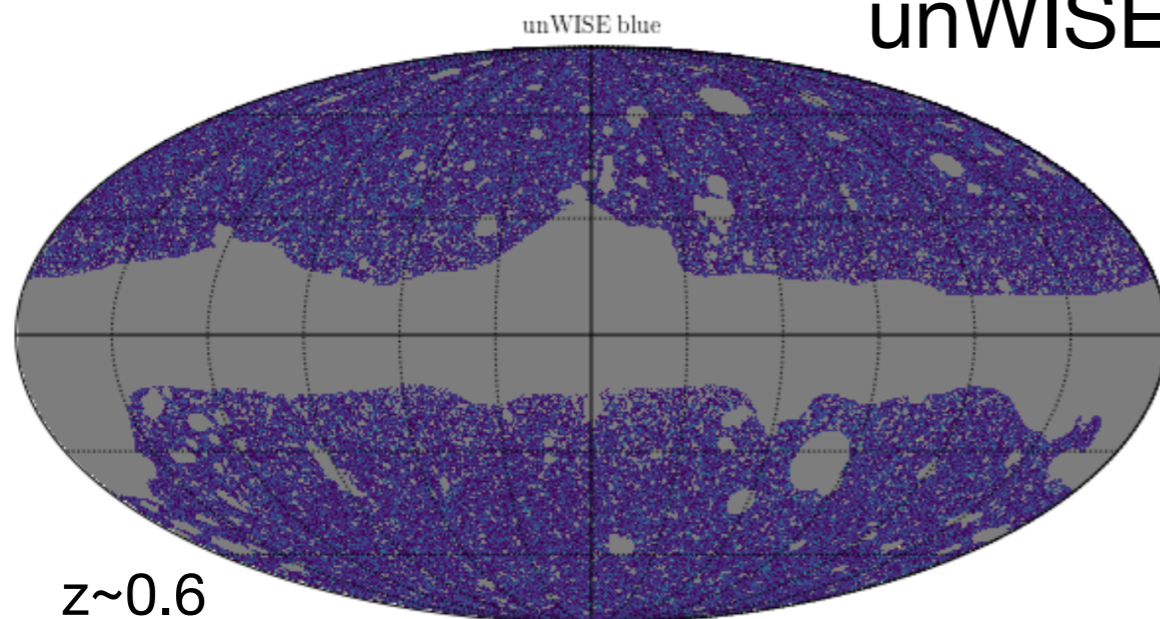
No deprojection constraints

tSZ+CIB+dCIB/d β deprojection constraints

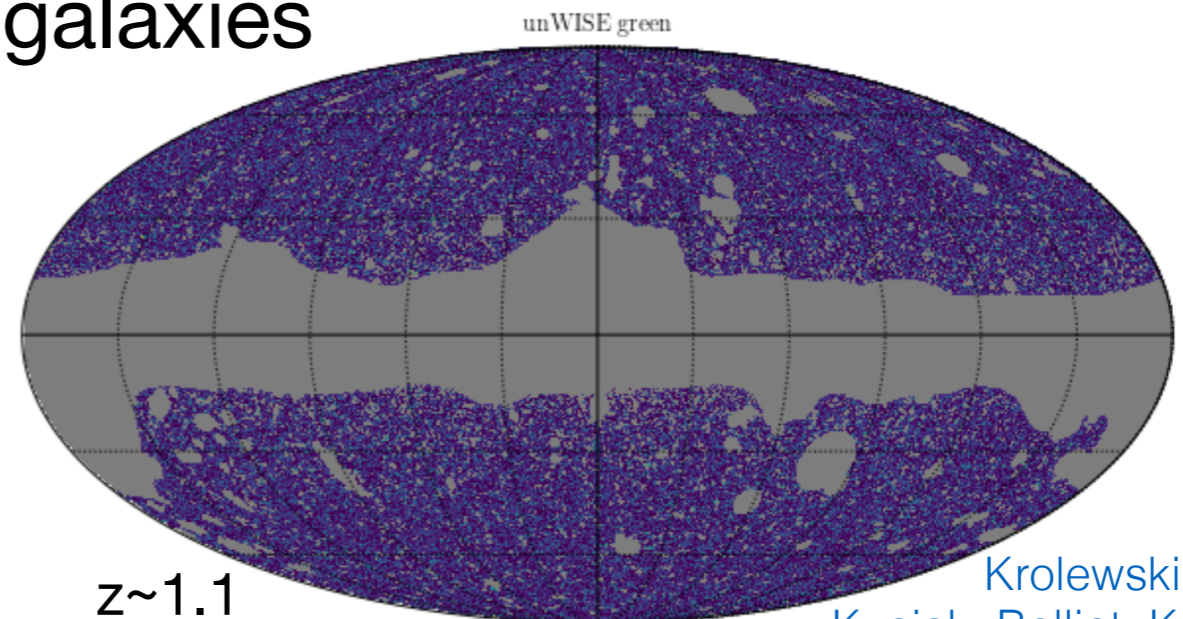


X

unWISE galaxies



z~0.6



z~1.1



Krolewski+ (2020)
Kusiak, Bolliet, Krolewski,
JCH (2022)

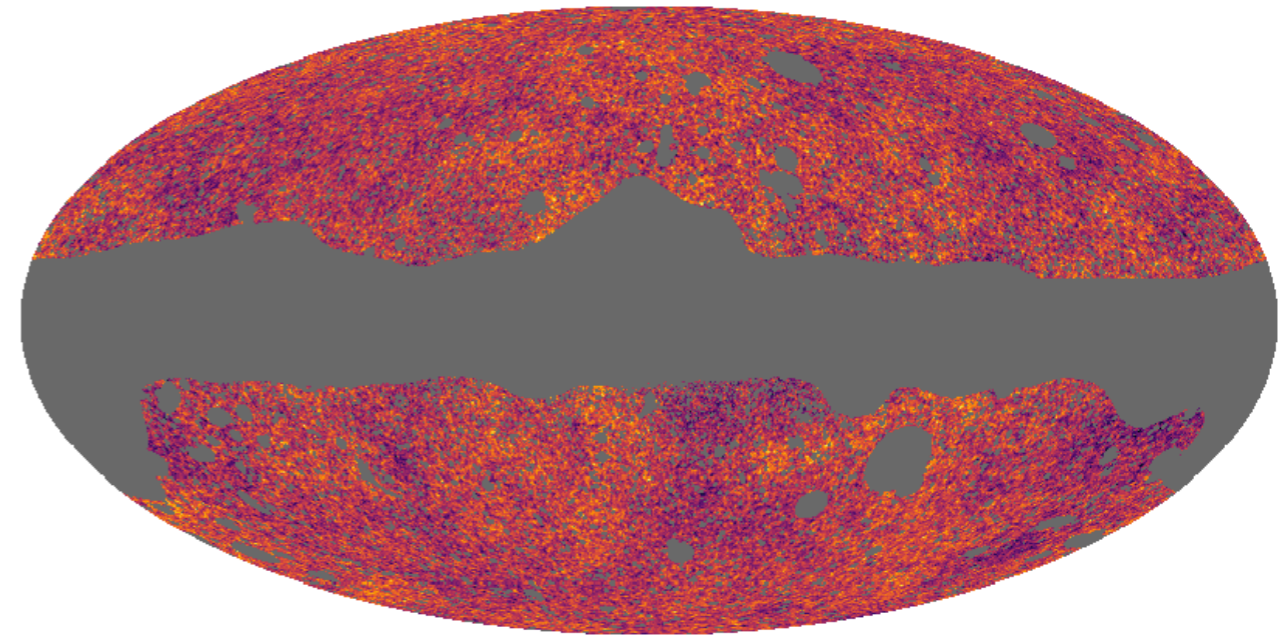
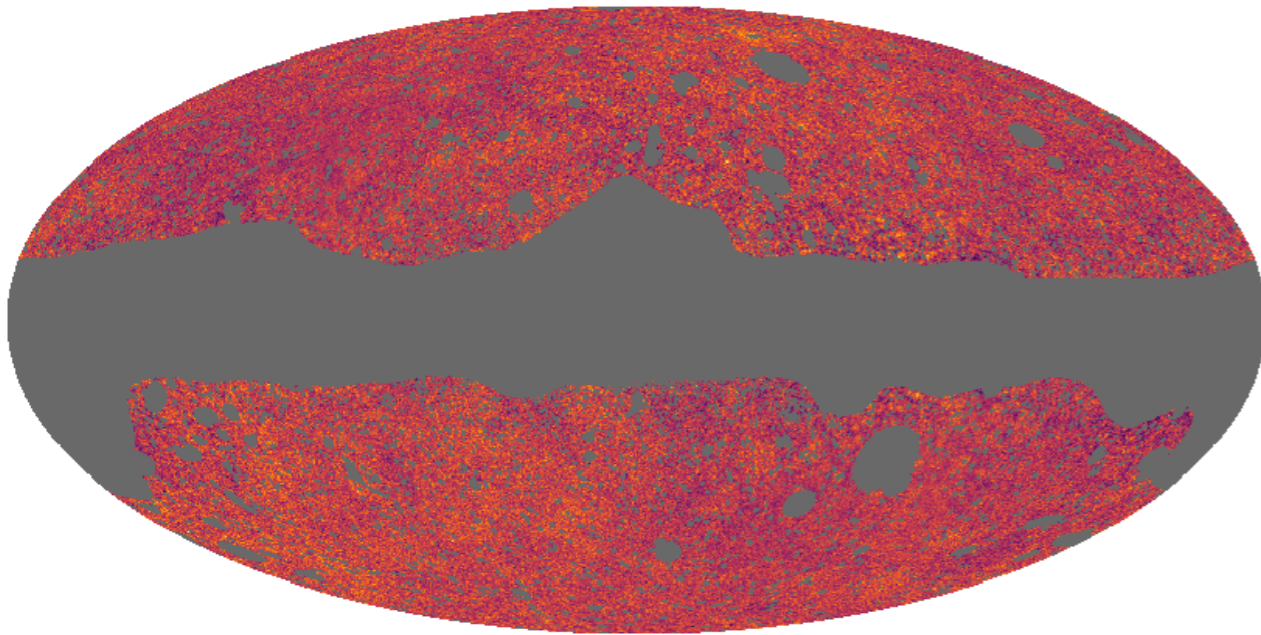
Axion Screening: Extraction

Colin Hill
Columbia

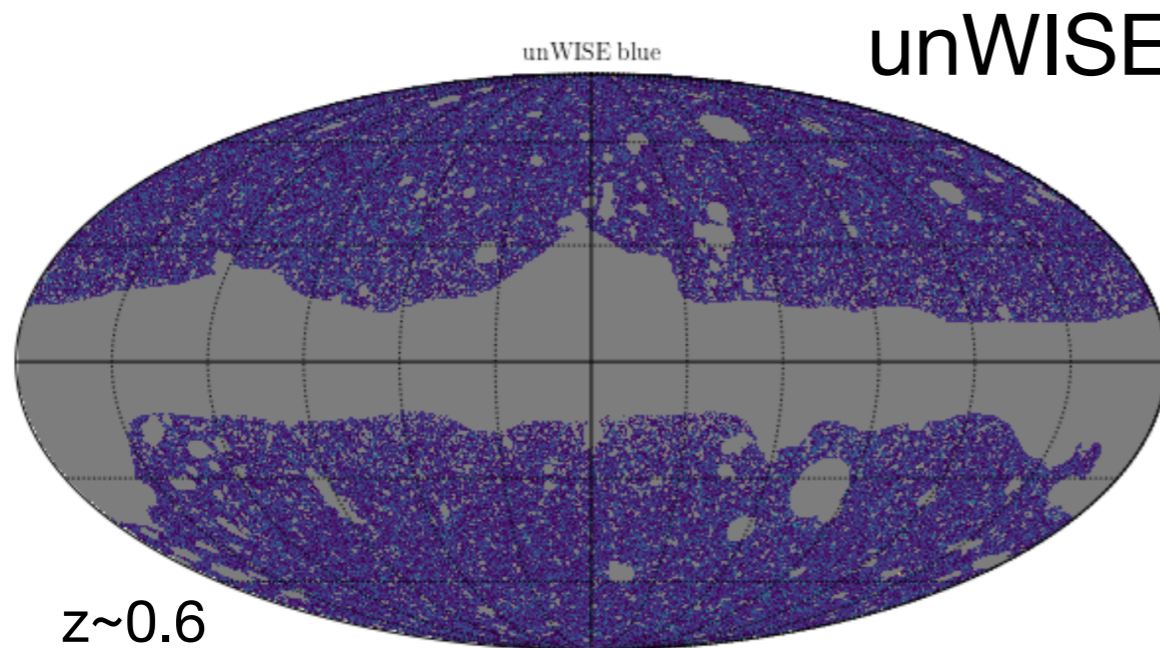
First Maps of Axion-Induced Patchy Screening

No deprojection constraints

tSZ+CIB+dCIB/d β deprojection constraints



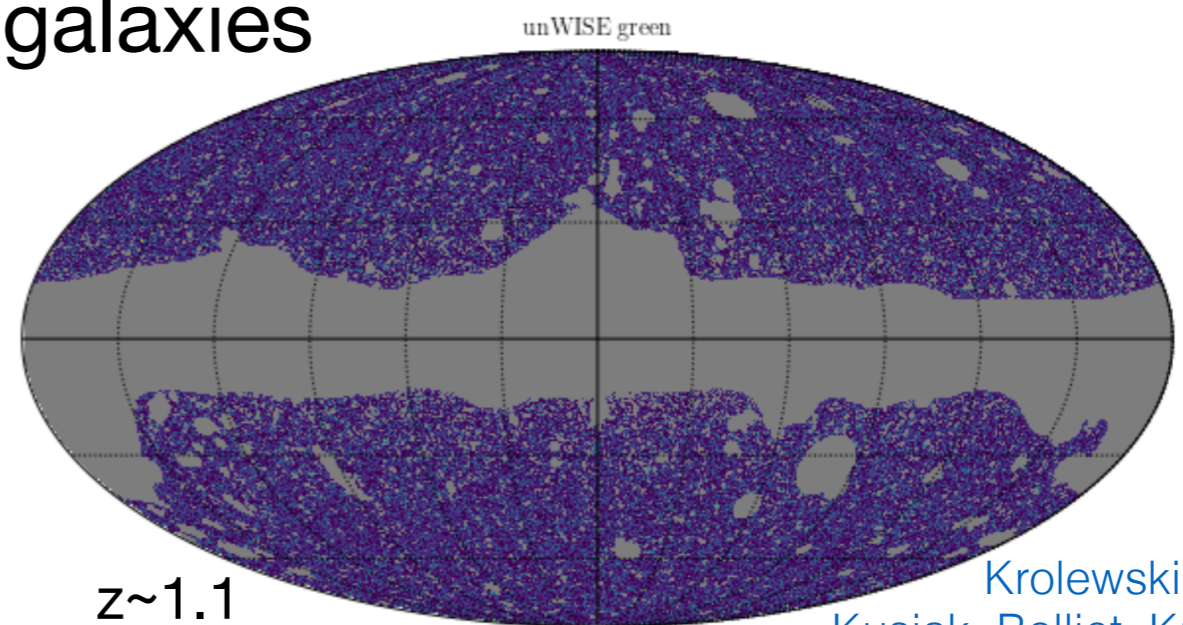
Work in progress to extract bound on axion-photon coupling



z~0.6



unWISE galaxies



z~1.1



Krolewski+ (2020)
Kusiak, Bolliet, Krolewski,
JCH (2022)

BSM Physics in CMB Secondary Anisotropies

Takeaways

- CMB is a uniquely powerful probe of well-motivated BSM models
- We have just started to scratch the surface of this line of research — these are the very first such constraints! Much more to do: e.g., axion spectral distortions also affect polarization. Other signals are possible directly in the time-ordered data (Fedderke+19)

BSM Physics in CMB Secondary Anisotropies

Takeaways

- CMB is a uniquely powerful probe of well-motivated BSM models
- We have just started to scratch the surface of this line of research — these are the very first such constraints! Much more to do: e.g., axion spectral distortions also affect polarization. Other signals are possible directly in the time-ordered data (Fedderke+19)
- Expect at least order of magnitude gains with CMB-S4
- Robustness of these constraints (or a detection) is directly coupled to understanding of the instrument:
 - Passbands: frequency-dependent BSM physics
 - Beams: power spectrum interpretation
 - Polarization angles: birefringence

New Tools for New Physics



Motivation

Foregrounds are non-Gaussian, but our semi-blind methods (e.g., ILC) generally use only two-point information

Can we do better?

Motivation

Can we do better?

Signal-preserving CMB component separation with machine learning

Simple, but naive, approach:

$$\hat{T}^{\text{pred, coi}} = f(T^i)$$

predicted map of component of
interest (e.g., CMB B-modes)

arbitrary non-linear function of
frequency maps

One can train a machine learning model (e.g., a CNN) to learn $f(T^i)$

However, this approach is unlikely to be robust:

- Results would be highly sensitive to mismatch between simulations and data
- No guarantee of unbiasedness/signal preservation
- Lacks the interpretability of the ILC or similar methods

Our Approach

Signal-preserving CMB component separation with machine learning

Consider the usual ILC estimate: $\hat{T}^{\text{ILC}}(p) = T^{\text{coi}}(p) + \Delta T^{\text{ILC}}(p)$
ILC residual w.r.t. true signal

We seek an estimate of the ILC residual: $\Delta \hat{T}^{\text{ILC}}(p)$

We can then obtain a cleaner final map by subtracting this estimate

Our Approach

Signal-preserving CMB component separation with machine learning

Consider the usual ILC estimate: $\hat{T}^{\text{ILC}}(p) = T^{\text{coi}}(p) + \Delta T^{\text{ILC}}(p)$
 ILC residual w.r.t. true signal

We seek an estimate of the ILC residual: $\Delta \hat{T}^{\text{ILC}}(p)$

We can then obtain a cleaner final map by subtracting this estimate

Our approach:

- Compute ILC estimate and subtract it from each frequency map:

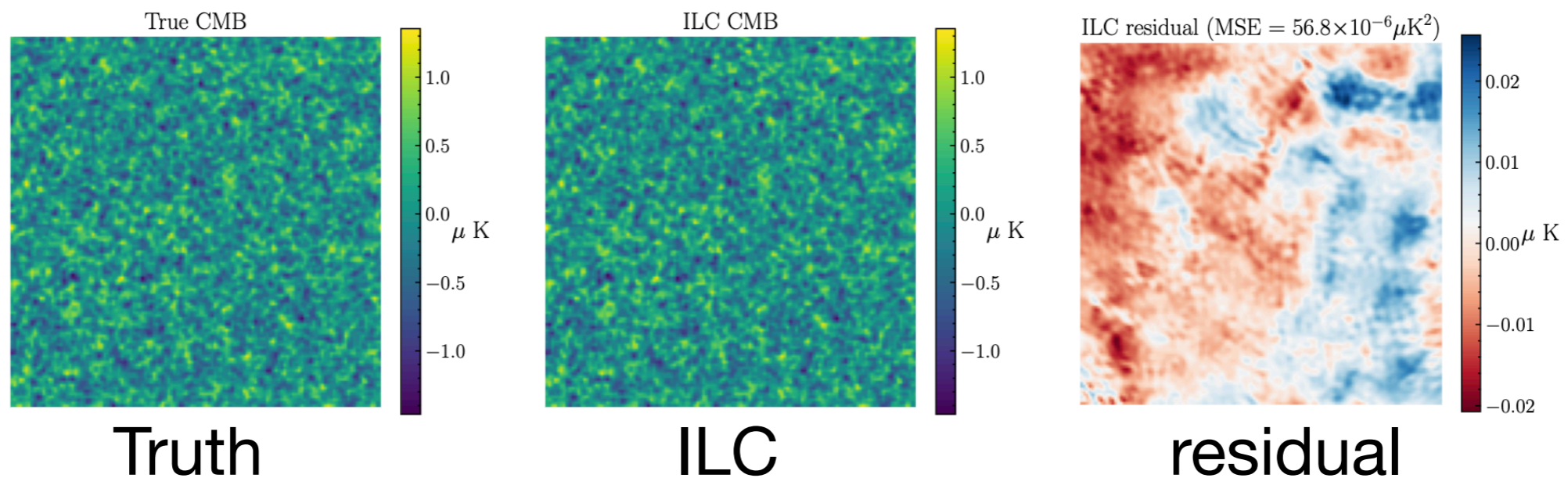
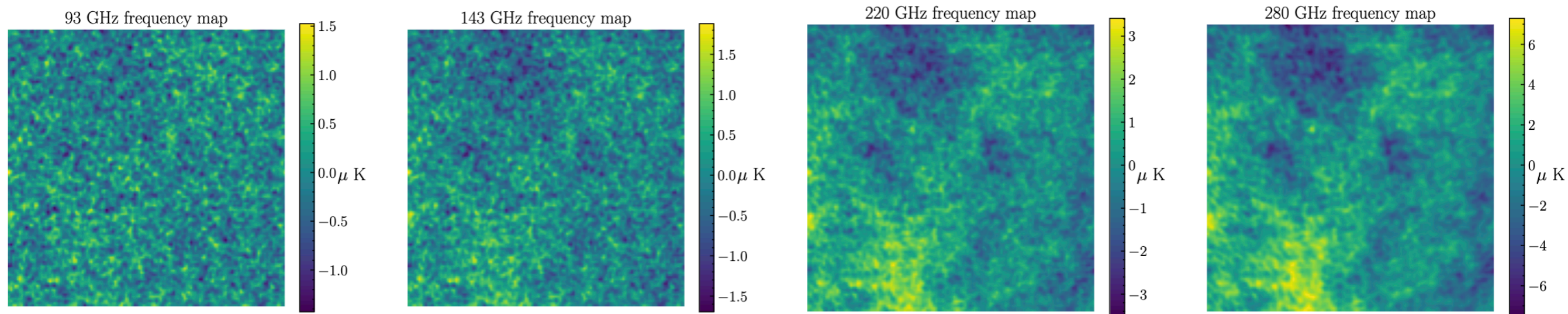
$$\hat{F}_i \equiv T_i - \hat{T}^{\text{ILC}}$$

- Use simulations to train a CNN to predict $\Delta \hat{T}^{\text{ILC}}(p)$ using \hat{F}_i
- Subtract this estimate to obtain a cleaner — and still unbiased — map of the component of interest: $\hat{T} = T^{\text{ILC}} - \Delta \hat{T}^{\text{ILC}}$

Application: B-modes

Colin Hill
Columbia

Simulations: dust + synchrotron + CMB (~ 1000 maps, 10×10 deg 2)

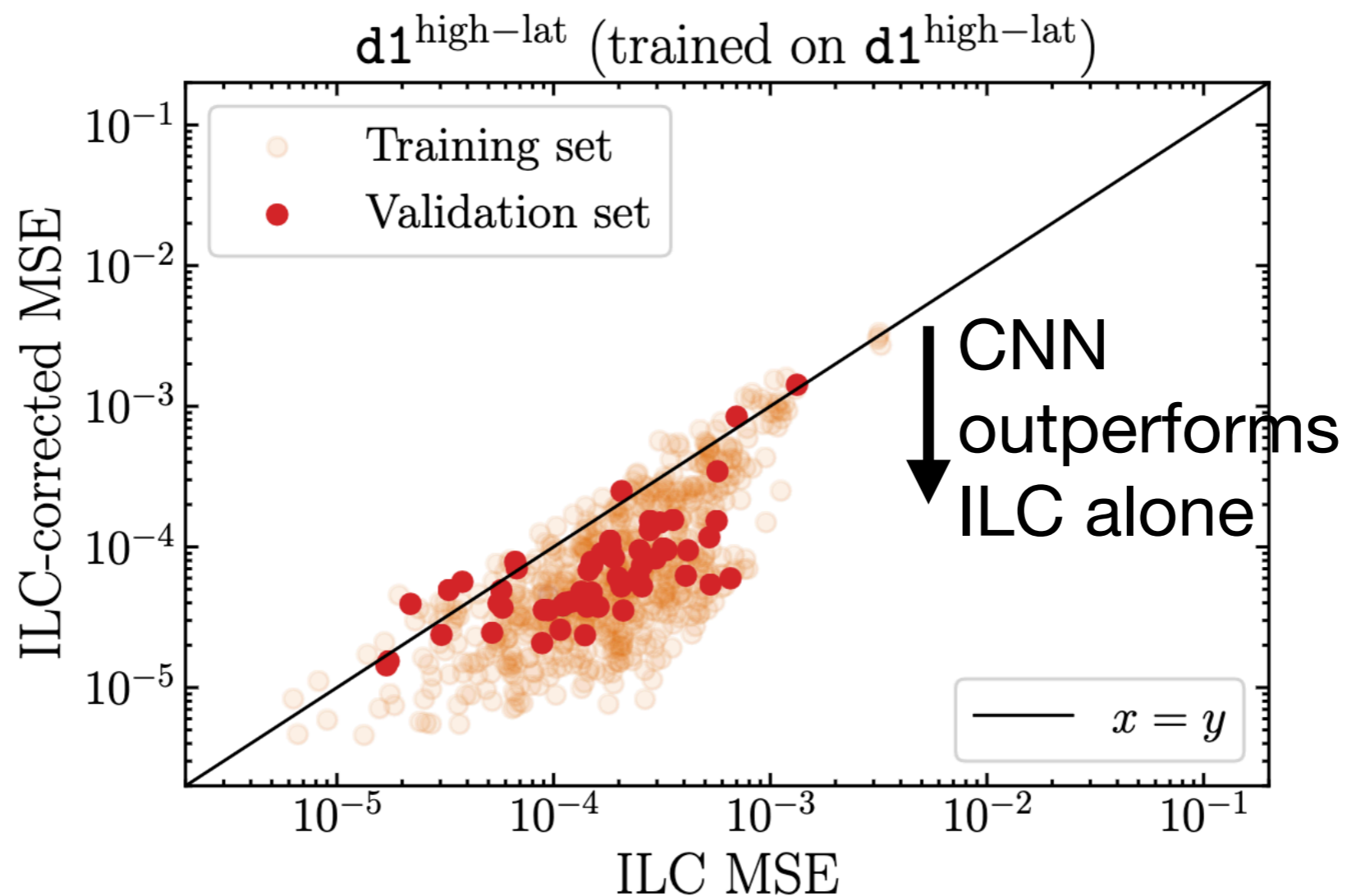


ILC clearly leaves
anisotropic residuals

Application: B-modes

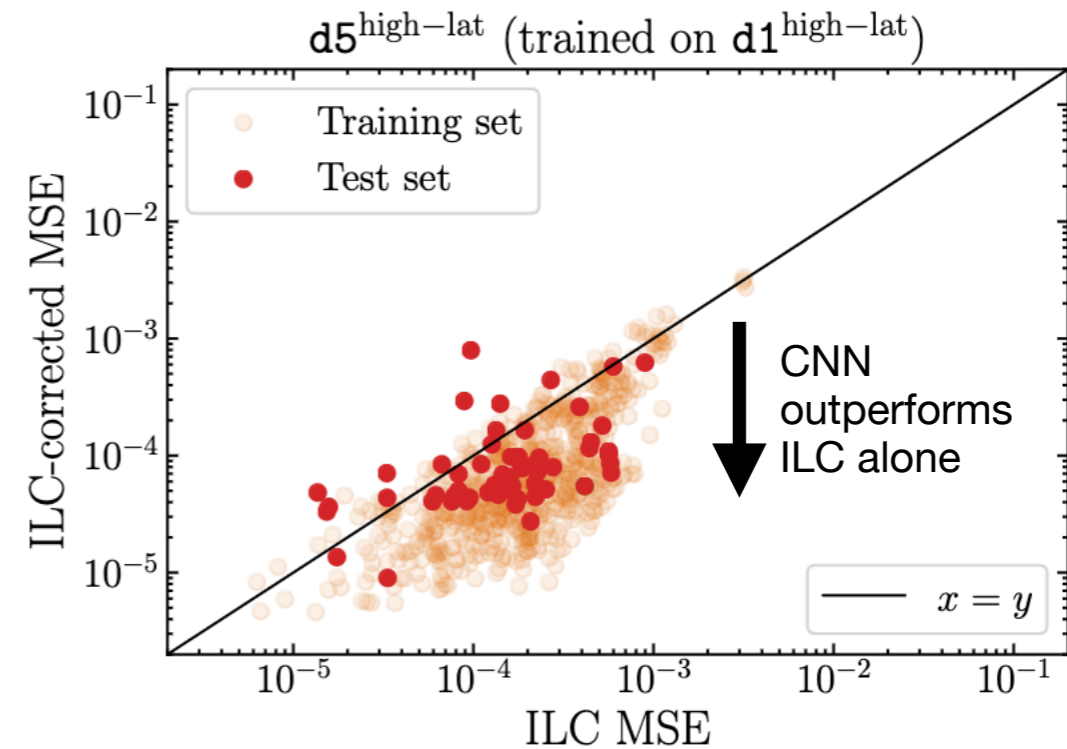
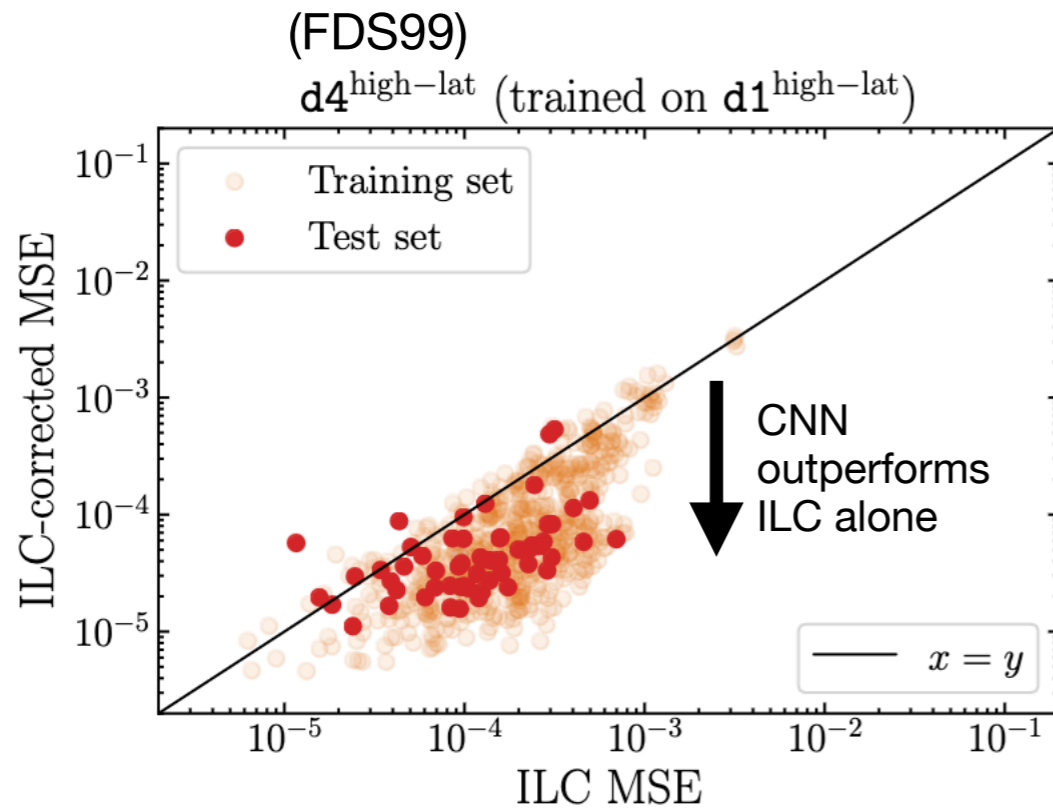
Loss function:
$$L = \sum_i \frac{1}{N_i} \sum_p \left(\Delta T^{\hat{\text{ILC}}}(p) - \Delta T^{\text{ILC}}(p) \right)^2 \quad N_i \equiv \sum_p \Delta T_i^{\text{ILC}}(p)$$

Assess performance via mean-squared error on $10 \times 10 \text{ deg}^2$ maps:



Application: B-modes

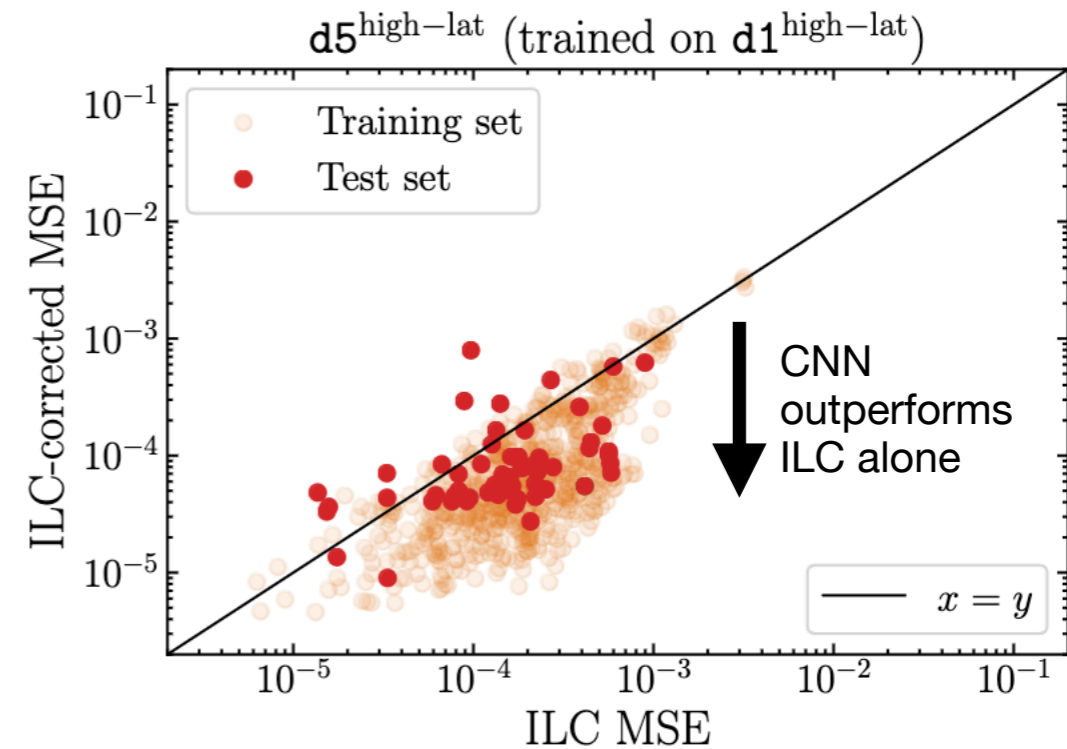
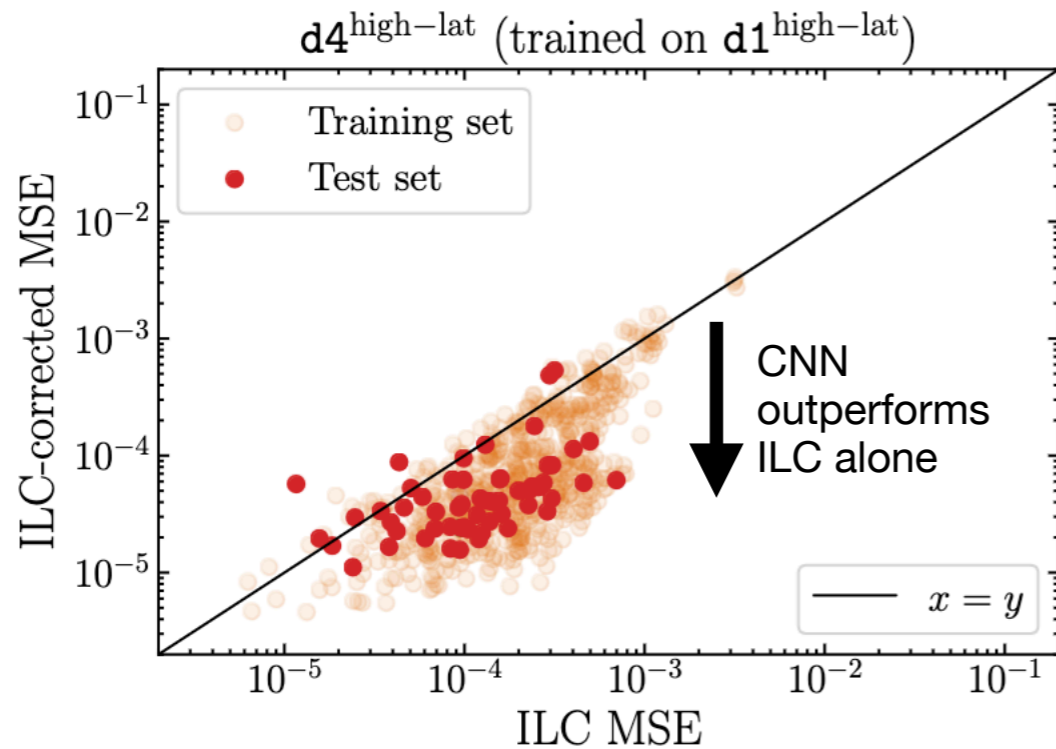
Does it work for dust models on which the CNN was not trained?



Application: B-modes

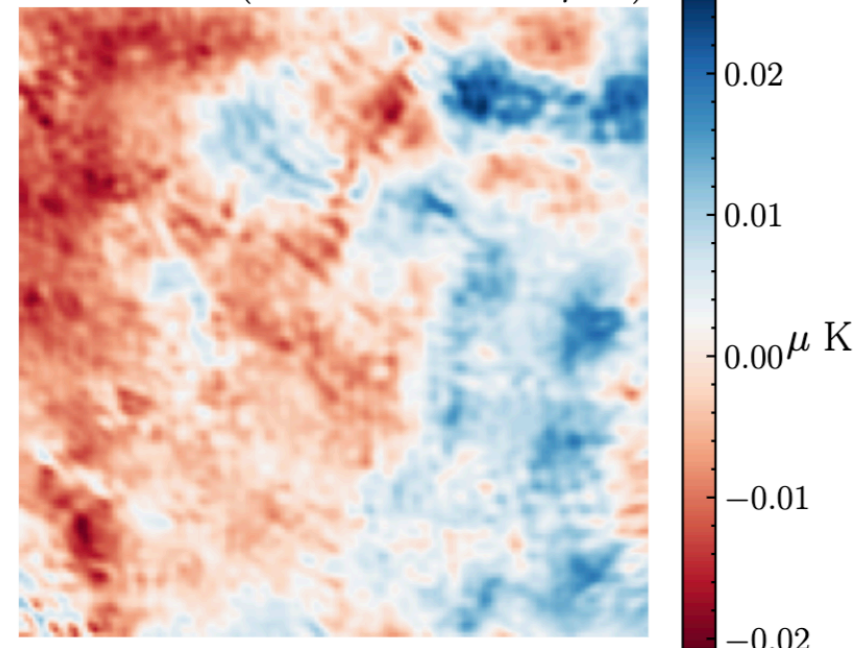
Colin Hill
Columbia

Does it work for dust models on which the CNN was not trained? Yes

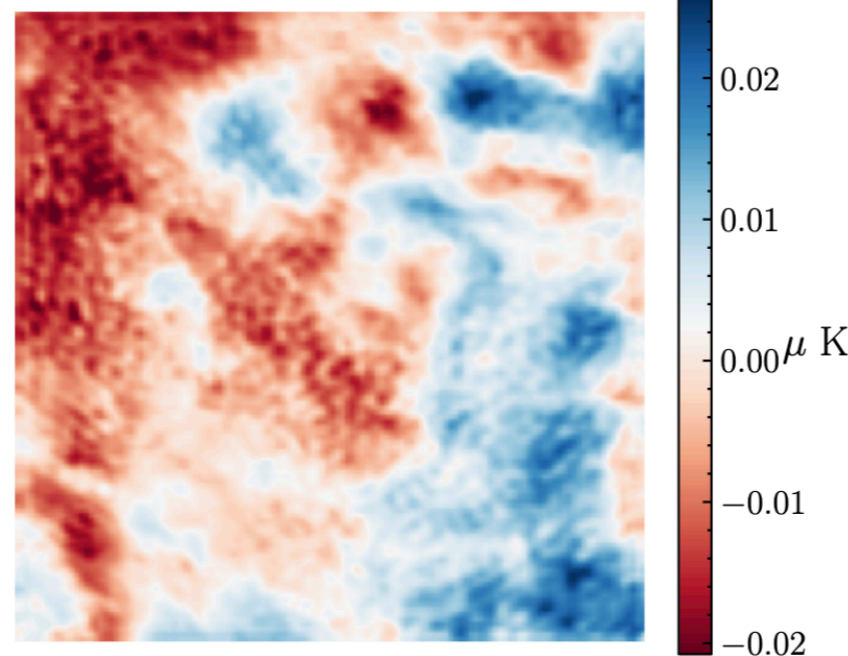


Is it learning the residual successfully? Yes

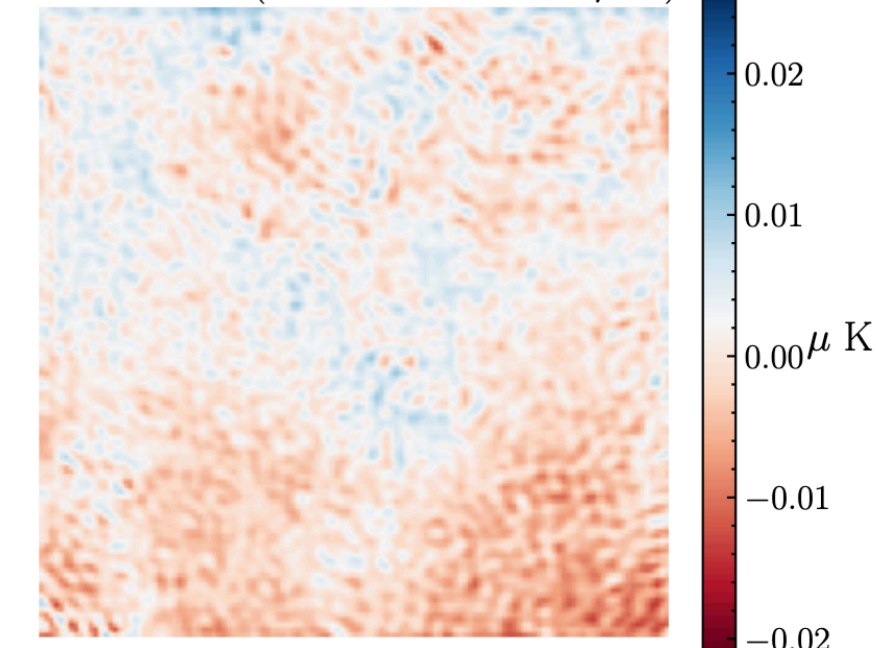
ILC residual (MSE = $56.8 \times 10^{-6} \mu\text{K}^2$)



NN correction



NN Residual (MSE = $19.91 \times 10^{-6} \mu\text{K}^2$)



New Tools

Takeaways

- In the foreground-dominated era, large gains may be wrought from new methods (we see up to $\sim 3x$ reduction in foreground “noise”)
Crucial to maximize CMB-S4 primordial B-mode science
- We also find similar success in application to CMB+tSZ simulations

New Tools

Takeaways

- In the foreground-dominated era, large gains may be wrought from new methods (we see up to $\sim 3x$ reduction in foreground “noise”)
 - Crucial to maximize CMB-S4 primordial B-mode science**
- We also find similar success in application to CMB+tSZ simulations
- Much more still to do:
 - Inclusion of noise and instrumental systematics
 - Scale up the model to realistic map sizes
 - This will require additional simulations — need new methods
 - Determine what the ML model is learning
 - Can we build a simple analytic statistic that performs nearly as well?

Related work in progress: tools to enable cosmological parameter inference from needlet ILC CMB maps (2403.02261 + to appear)

Outlook:
Simons Observatory
Advanced SO
CMB-S4

Landscape

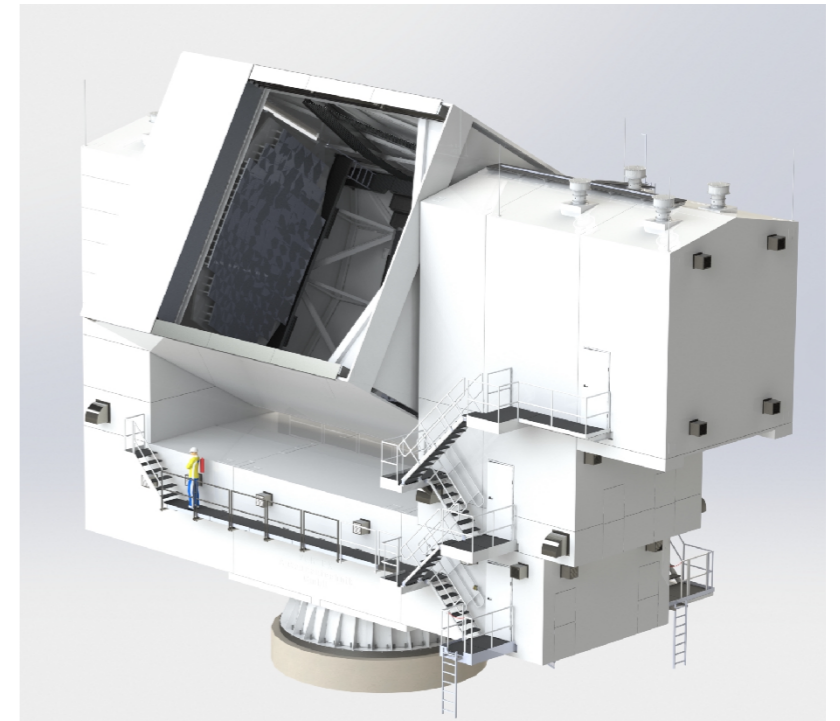
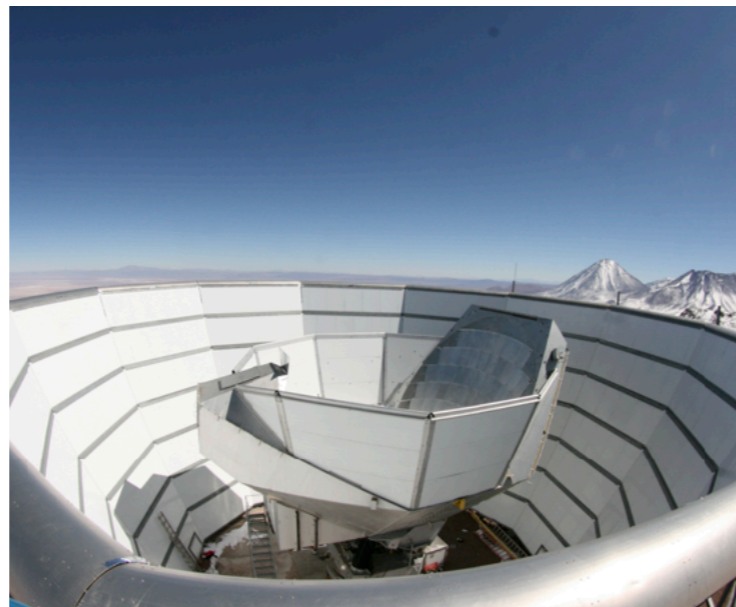
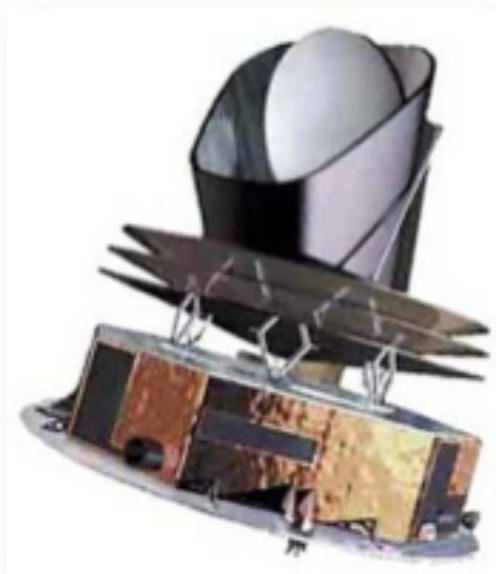
Planck



ACT



SO Large Aperture Telescope



Final data 2018/2020
100% sky

0.35 — 10 mm (9 bands)
5 — 33' resolution

Observations through 8/2022
40% sky
Noise ~3 times < Planck
1.4 — 10 mm (5 bands)
1 — 7' resolution

*[South Pole Telescope - same
timeframe]*

Observations 2024 - ~29
40% sky
Noise ~3 times < ACT
1 — 10 mm (6 bands)
1 — 7' resolution

+ ~6 low-resolution SATs
with additional bands

Landscape

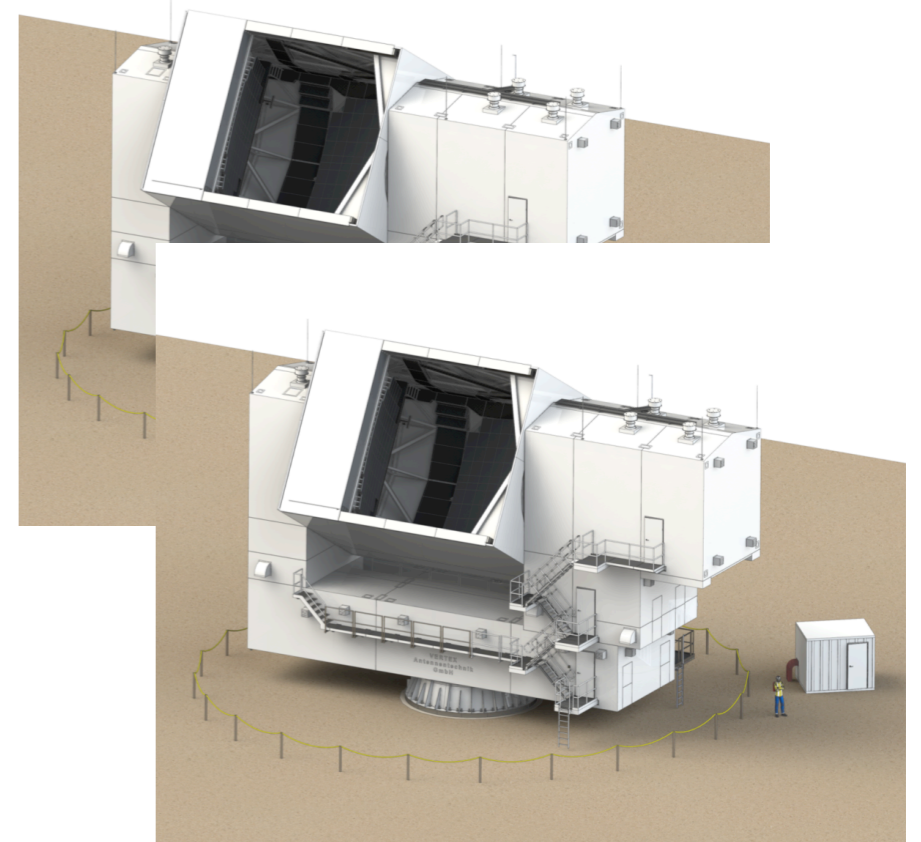
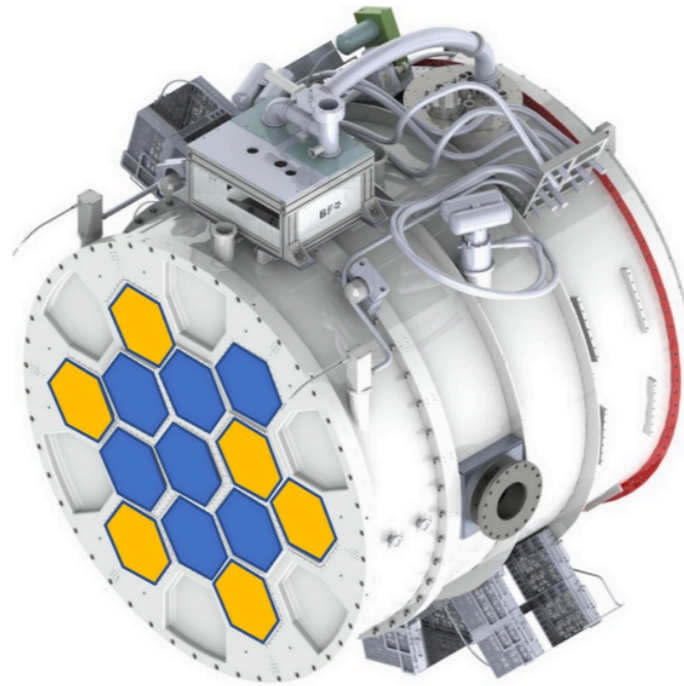
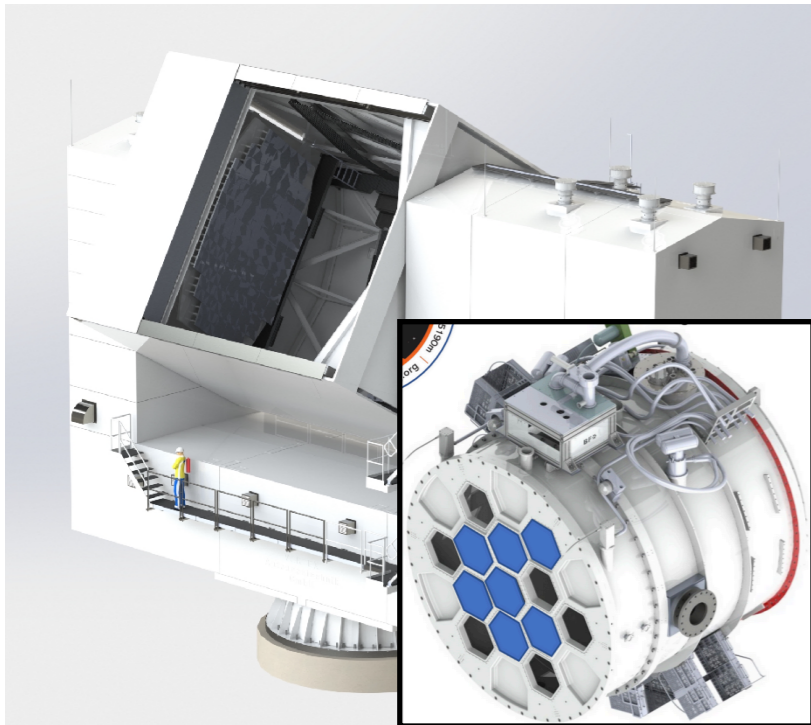
SO



Advanced SO



CMB-S4 Large Aperture Telescopes



Observations 2024 - ~29
40% sky
Noise ~3 times < ACT
| — 10 mm (6 bands)
| — 7' resolution

Observations ~2028 - 2033
40% sky
Noise ~1.7 times < SO
| — 10 mm (6 bands)
| — 7' resolution

Observations ~2030 - 2037
70% sky
Noise ~2.4 times < Adv. SO
| — 10 mm (6 bands)
| — 7' resolution

JCH: Co-Project Scientist

+ ~9 low-resolution SATs
with additional bands

Landscape

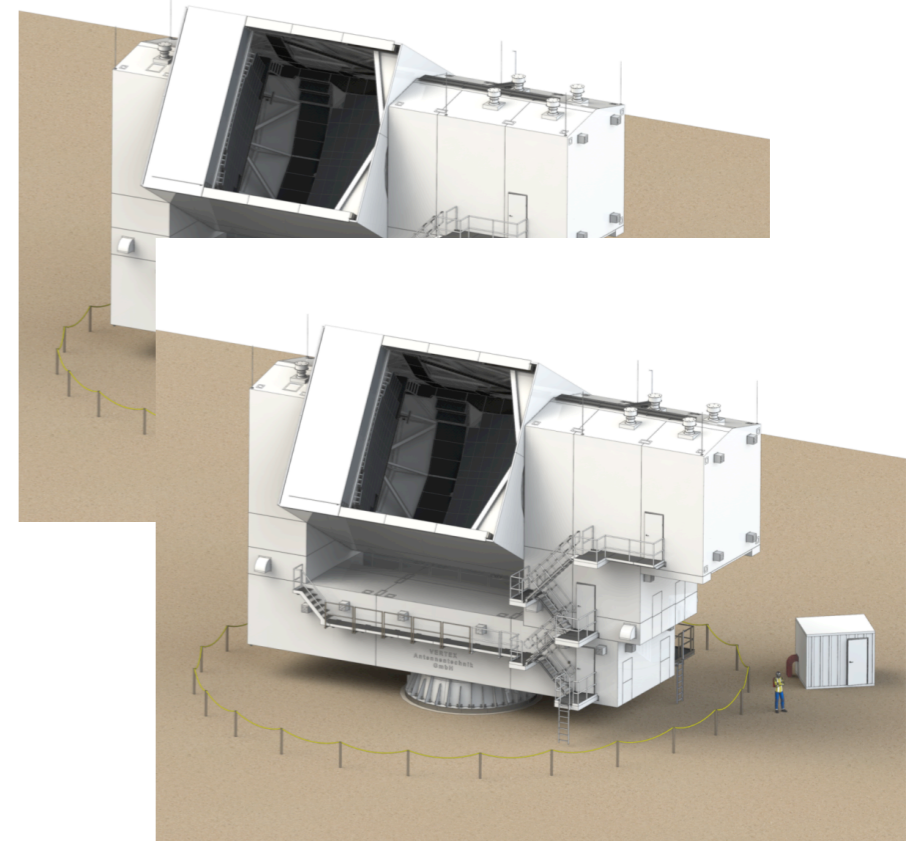
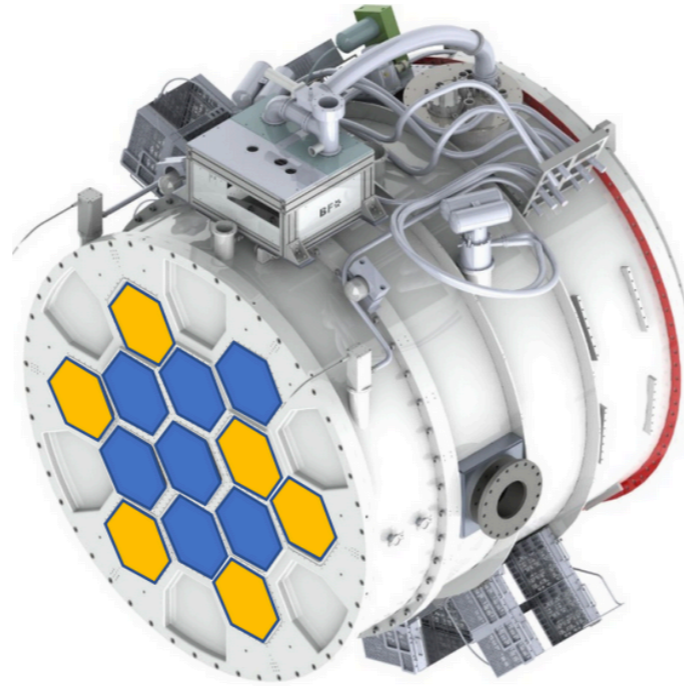
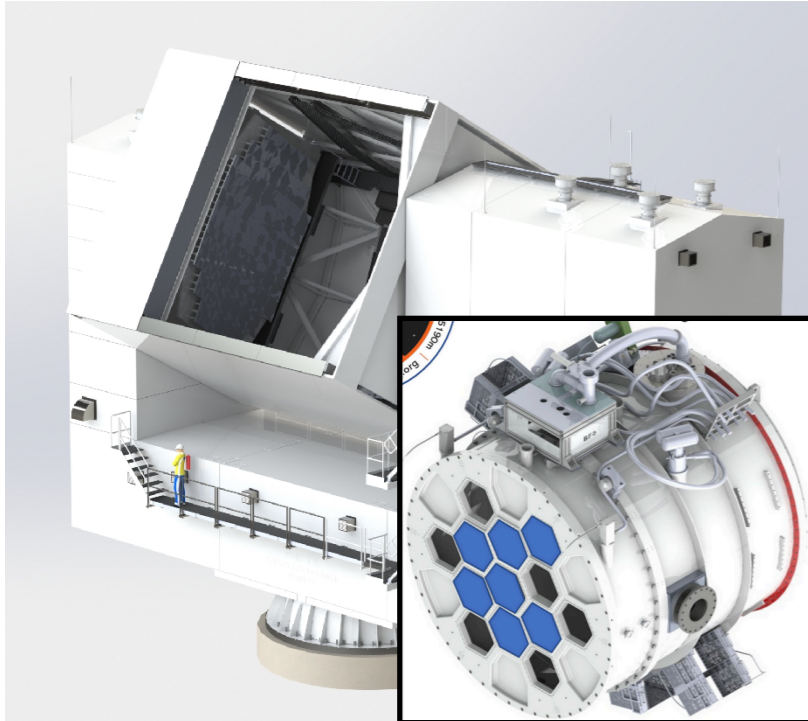
SO



Advanced SO



CMB-S4 Large Aperture Telescopes



Observations 2024 - ~29

40% sky

Noise ~3 times < ACT

l — 10 mm (6 bands)

l — 7' resolution

Observations ~2028 - 2033

40% sky

Noise ~1.7 times < SO

l — 10 mm (6 bands)

l — 7' resolution

Observations ~2030 - 2037

70% sky

Noise ~2.4 times < Adv. SO

l — 10 mm (6 bands)

l — 7' resolution

**SO analysis = essential training
ground + preparation for CMB-S4**

+ ~9 low-resolution SATs
with additional bands

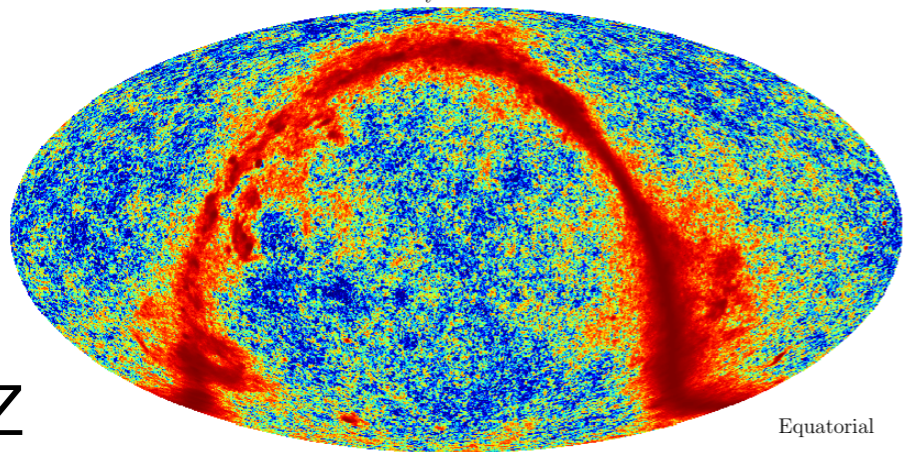
CMB-S4: Optimization

Colin Hill
Columbia

Baseline LAT design for allocation of detectors across frequencies was determined by my work

30
GHz

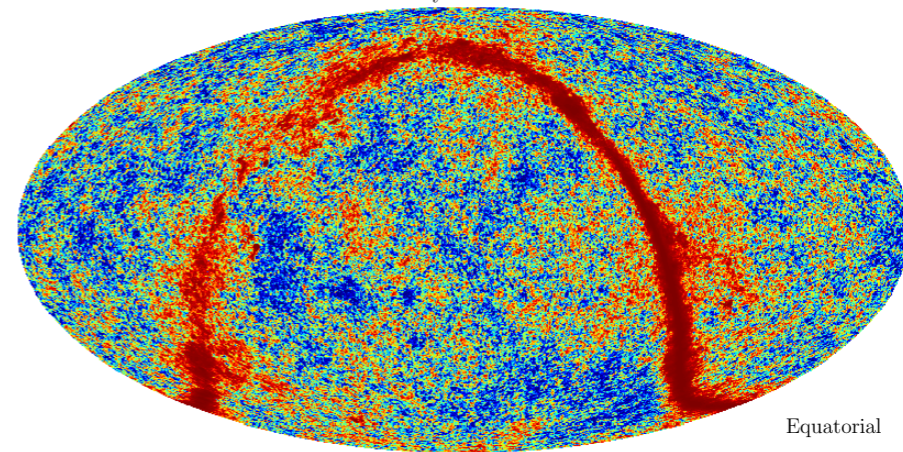
Sim Sky at 030 GHz



-0.000396238 K_{CMB} 0.0683753

90
GHz

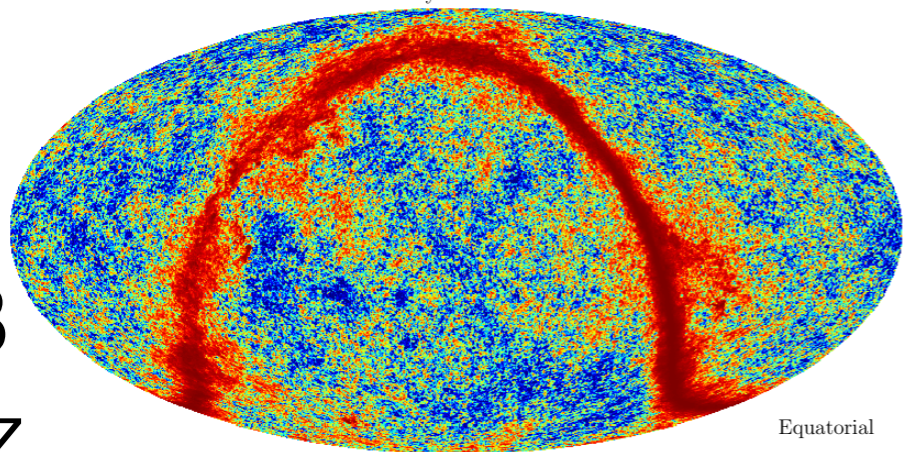
Sim Sky at 090 GHz



-0.000482042 K_{CMB} 0.0254357

148
GHz

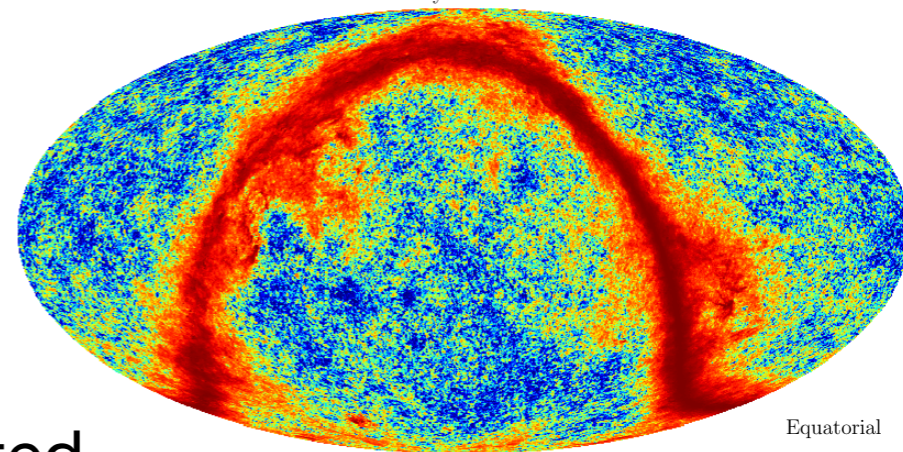
Sim Sky at 148 GHz



-0.000561334 K_{CMB} 0.0585616

219
GHz

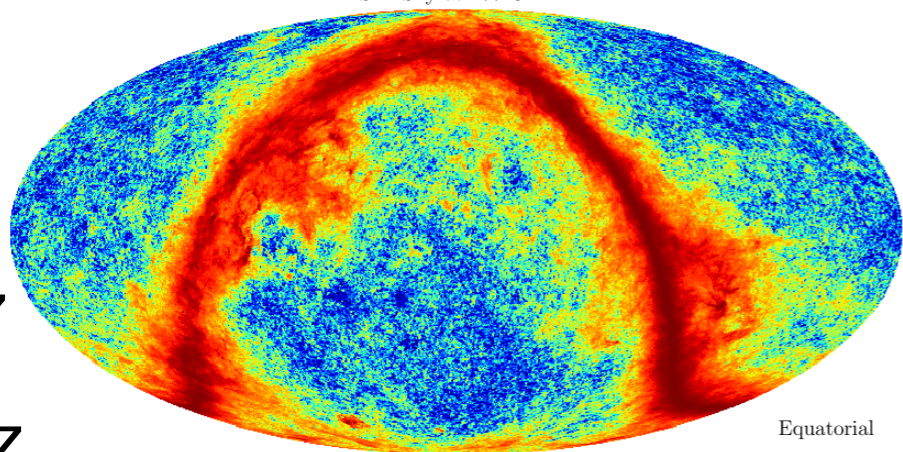
Sim Sky at 219 GHz



-0.00051276 K_{CMB} 0.177866

277
GHz

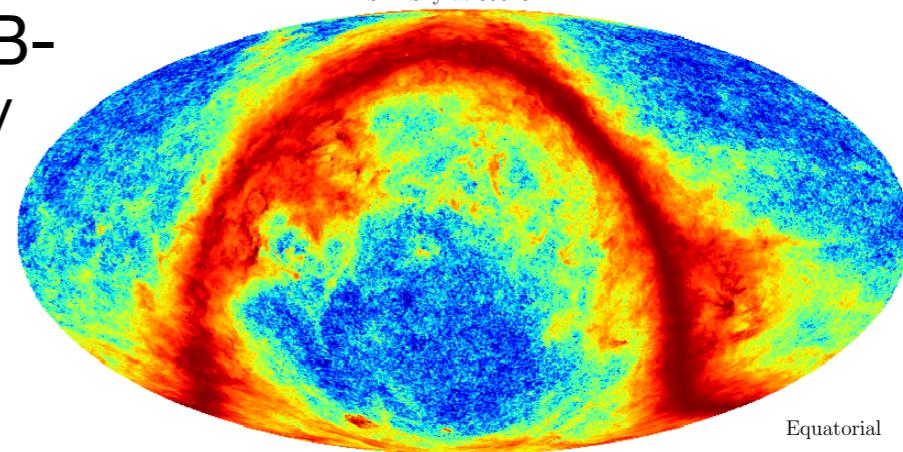
Sim Sky at 277 GHz



-0.000410659 K_{CMB} 0.432934

350
GHz

Sim Sky at 350 GHz



-0.000152497 K_{CMB} 1.23548

Built from updated
Sehgal+2009 sims
+ PySM1 + CMB-
S4 noise model/
calculator

CMB-S4: Optimization

Colin Hill
Columbia

Sampling over $\sim 10^5$ possible detector distributions, performing component separation, and obtaining S/N on key science targets yielded the baseline CMB-S4 LAT configuration

Chile (Wide Field Survey –	ULF	LF	MF	HF
N_{tubes} per LAT	0	2	12	5

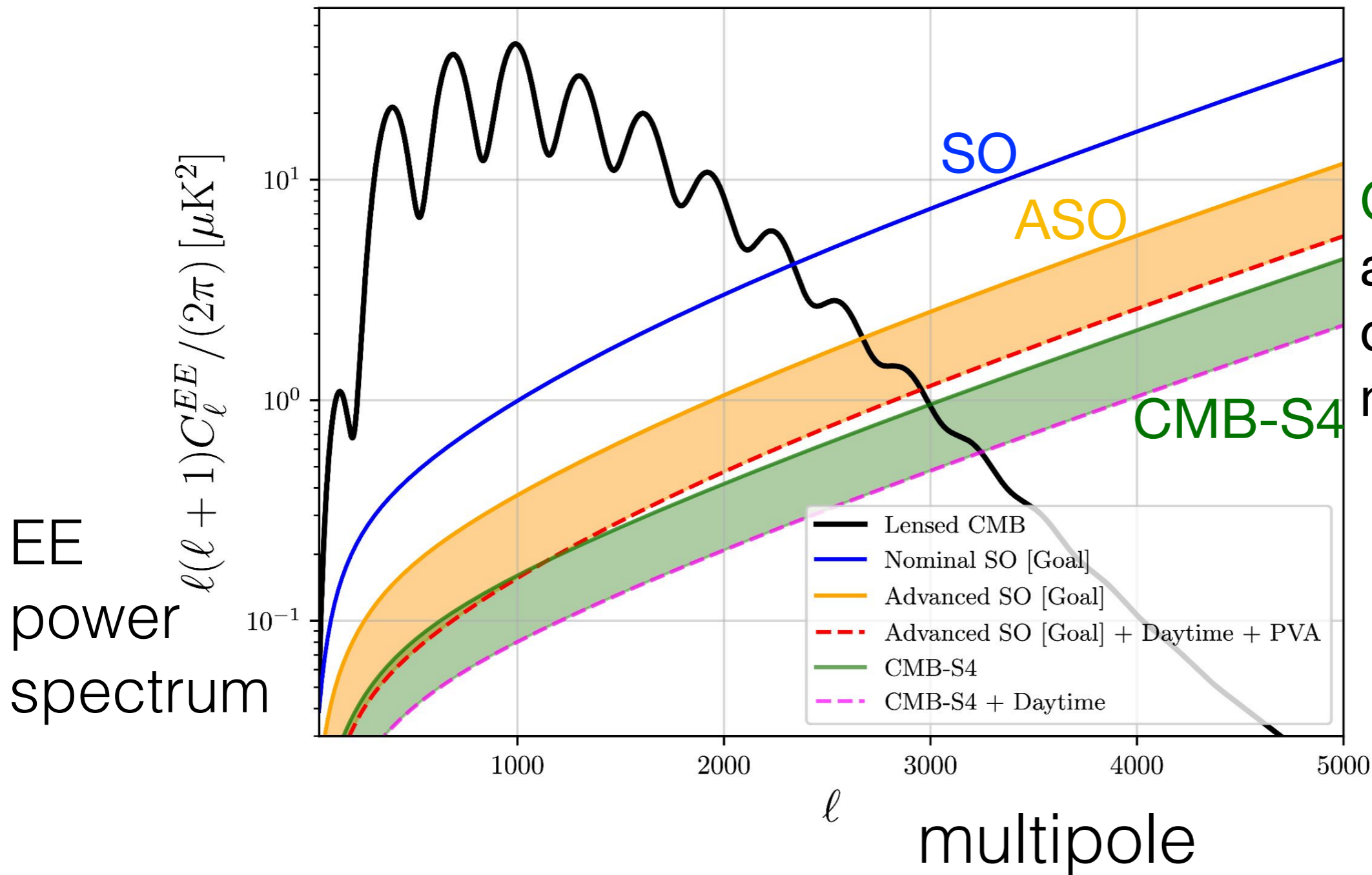
See appendices of CMB-S4 Decadal Survey Report (2019); results used in dozens of forecasts (e.g., Alvarez, Ferraro, **JCH**,+ 2021)

CMB-S4: Optimization

Colin Hill
Columbia

Sampling over $\sim 10^5$ possible detector distributions, performing component separation, and obtaining S/N on key science targets yielded the baseline CMB-S4 LAT configuration

EE (post-component-separation noise curves)



CMB-S4: ~3x
as many signal-
dominated E-
modes as SO!

**Immense
discovery
potential**

Outlook

Takeaways

- The **fundamental physics case of CMB-S4 is broad and diverse** — much more than “measurement of one number”
- Many avenues and opportunities for seeking BSM physics, some of which we are only beginning to explore now
- At least ~15-20 years of cutting-edge instrumentation, analysis, and science awaits — with major discoveries hopefully to come
- Crucial: **to avoid systematic error/bias, a global viewpoint of all aspects of the experiment is essential**, from the details of the hardware to the final scientific interpretation.

Cosmic Microwave Background

Astro2020: “To address the major science questions identified by the Panel on Cosmology, the cosmic microwave background (CMB) remains the single most important phenomenon that can be observed ...”

- What seeded the initial fluctuations?

Inflation?

- What are the constituents of the dark sector?

Neutrinos — are there other light particles?

- How can we use the CMB as a particle-physics detector?

Beyond-Standard-Model physics signatures?

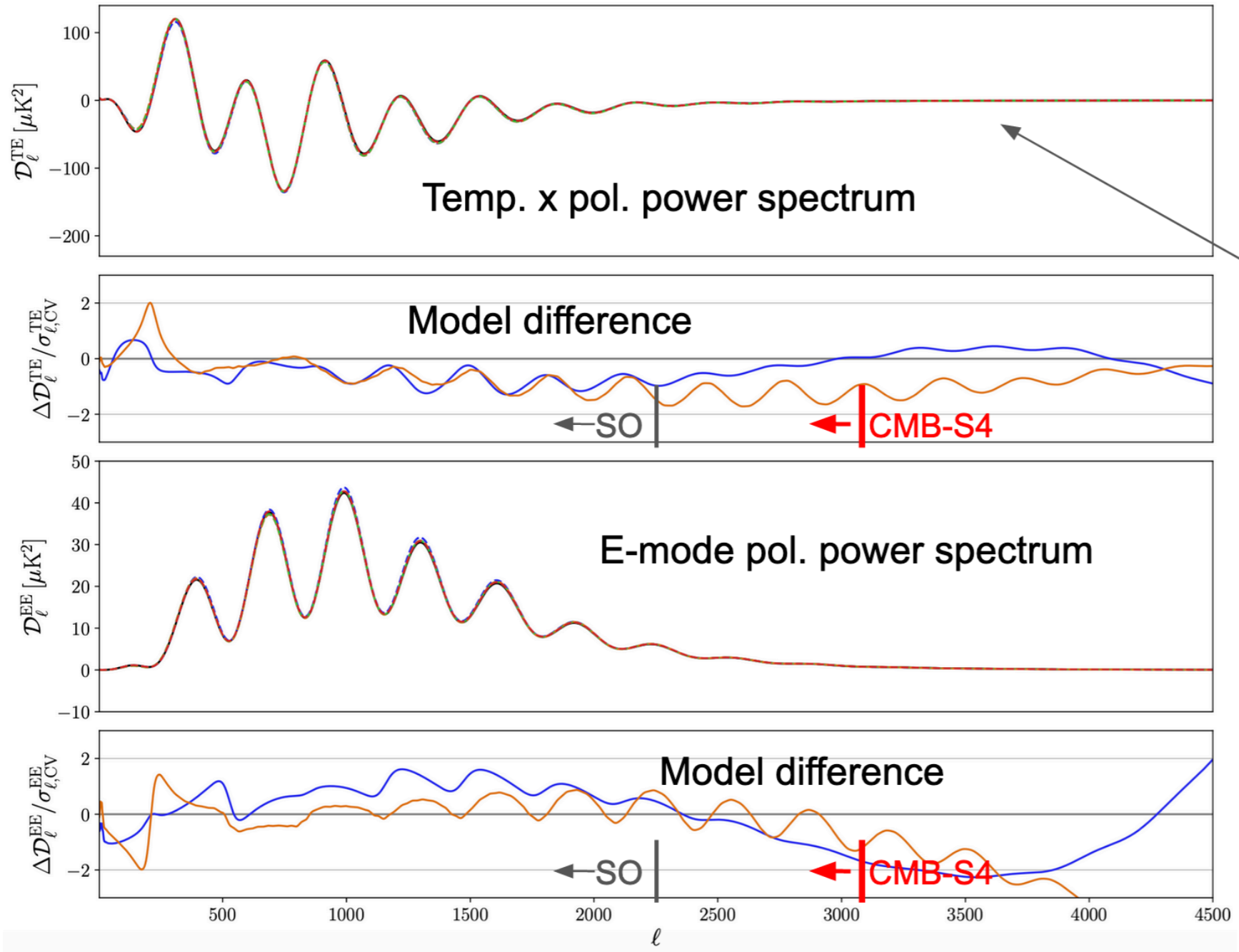
Incredibly rich and diverse science case for upcoming CMB experiments! New tools and close interface between analysis and instrumentation will enable breakthroughs.



SIMONS OBSERVATORY

Bonus

CMB-S4: Opening Up Discovery Space



Example: early dark energy (EDE) scenario

Idea: brief period of cosmic acceleration just prior to recombination

Best-fit EDE and Λ CDM models to various data sets

ACT best-fit EDE - Planck best-fit Λ CDM
ACT+low-ell-TT best-fit EDE - Planck best-fit Λ CDM

Key differences are seen in pol. power spectra – but signal is tiny

We need as many high-S/N modes as possible to maximize discovery potential – low noise and wide area:

$\sim 2\sigma$ hint in ACT DR4 $\rightarrow 60\sigma$ in CMB-S4

Hill et al. [ACT] (2021)

We are looking for tiny signals – detailed characterization of instrument will be essential to avoid systematic error

Dark Screening in the CMB

(Massive) Dark Photon

Kinetic mixing between SM photon and dark photon (DP):

$$\mathcal{L} = -\frac{1}{4}F_{\mu\nu}F^{\mu\nu} - \frac{1}{4}F'_{\mu\nu}F'^{\mu\nu} - \frac{m_{A'}^2}{2}A'_\mu A'^\mu - \frac{\varepsilon}{2}F_{\mu\nu}F'^{\mu\nu} + A^\mu J_\mu$$

SM photon DP DP mass term SM-DP kinetic mixing

Dark Screening in the CMB

(Massive) Dark Photon

Kinetic mixing between SM photon and dark photon (DP):

$$\mathcal{L} = \underbrace{-\frac{1}{4}F_{\mu\nu}F^{\mu\nu}}_{\text{SM photon}} - \underbrace{\frac{1}{4}F'_{\mu\nu}F'^{\mu\nu}}_{\text{DP}} - \underbrace{\frac{m_{A'}^2}{2}A'_\mu A'^\mu}_{\text{DP mass term}} - \underbrace{\frac{\varepsilon}{2}F_{\mu\nu}F'^{\mu\nu}}_{\text{SM-DP kinetic mixing}} + A^\mu J_\mu$$

Dominant effect relevant to CMB: resonant conversion

SM photon acquires “plasma mass” post-reionization:

$$m_\gamma = \sqrt{4\pi\alpha n_e/m_e} = 3.7 \times 10^{-11} \text{ eV} \sqrt{\frac{n_e}{\text{cm}^{-3}}}$$

If this plasma mass = DP mass, resonant conversion occurs ($\sim \varepsilon^2$):

$$P_{\gamma \rightarrow A'} = \sum_{t_{\text{res}}} \frac{\pi \varepsilon m_{A'}^2}{\omega(t_{\text{res}})} \times \varepsilon \left| \frac{d}{dt} \ln m_\gamma^2(\vec{x}(t)) \right|_{t=t_{\text{res}}}^{-1}$$

Dark Screening in the CMB

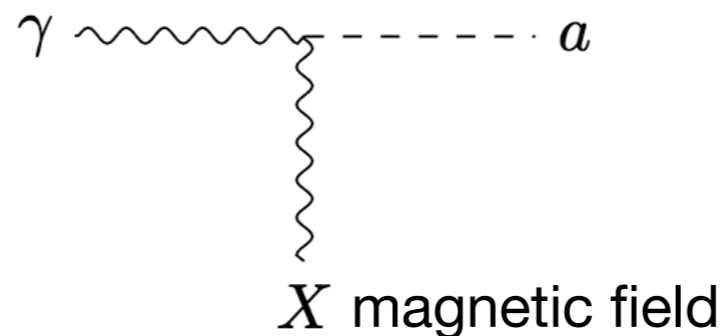
Axion-Like Particle

Axion-photon coupling:

$$\mathcal{L}_{a\gamma\gamma} = -\frac{1}{4} g_{a\gamma\gamma} F_{\mu\nu} \tilde{F}^{\mu\nu} a = -g_{a\gamma\gamma} \mathbf{E} \cdot \mathbf{B} a$$

SM photon
axion

Photon-axion
conversion in
magnetic field:



Dark Screening in the CMB

Axion-Like Particle

Axion-photon coupling:

$$\mathcal{L}_{a\gamma\gamma} = -\frac{1}{4}g_{a\gamma\gamma}F_{\mu\nu}\tilde{F}^{\mu\nu}a = -g_{a\gamma\gamma}\mathbf{E}\cdot\mathbf{B}a$$

SM photon axion

Dominant effect relevant to CMB: resonant conversion

SM photon acquires “plasma mass” post-reionization:

$$m_\gamma = \sqrt{4\pi\alpha n_e/m_e} = 3.7 \times 10^{-11} \text{ eV} \sqrt{\frac{n_e}{\text{cm}^{-3}}}$$

If this plasma mass = axion mass, resonant conversion occurs in a background magnetic field ($\sim B^2 g_{a\gamma\gamma}^2$):

$$P(A_{\parallel} \rightarrow a)_{\text{res}} \simeq \frac{\pi\omega g_{a\gamma\gamma}^2 B^2}{m_a^2} \left| \frac{d \ln m_\gamma^2}{dt} \right|_{t_{\text{res}}}^{-1}$$

How do we measure H_0 ?

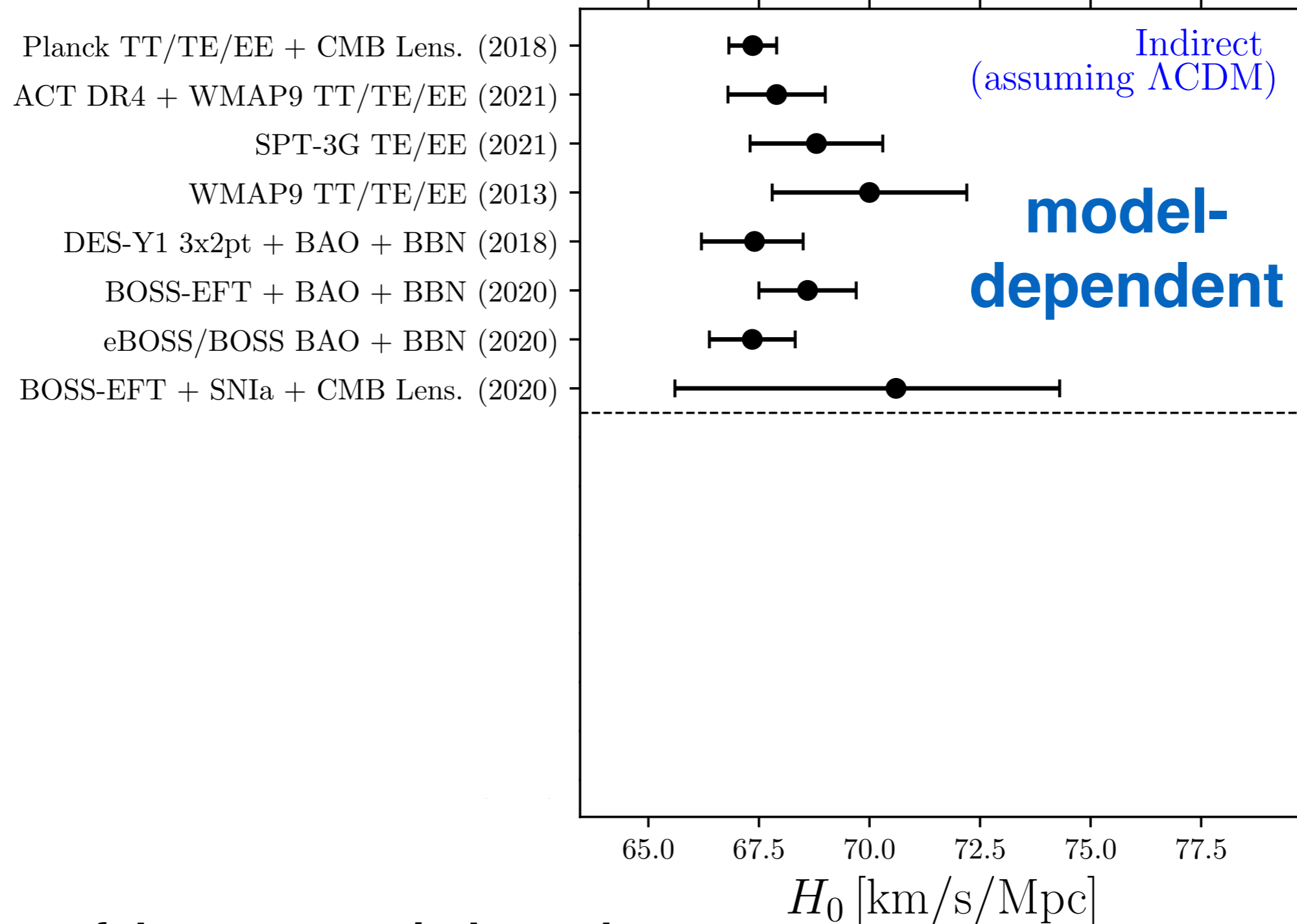
Method 1: measure the distance-redshift relation in the nearby universe, e.g., using the classical distance ladder (same method as Hubble himself) — infer H_0 “directly”

Method 2: fit a detailed cosmological model to data from cosmic microwave background and/or large-scale structure surveys — infer H_0 “indirectly”

The Hubble Situation

My personal view: observational situation remains unclear

(Incomplete) H_0 Compilation as of 22 February 2022



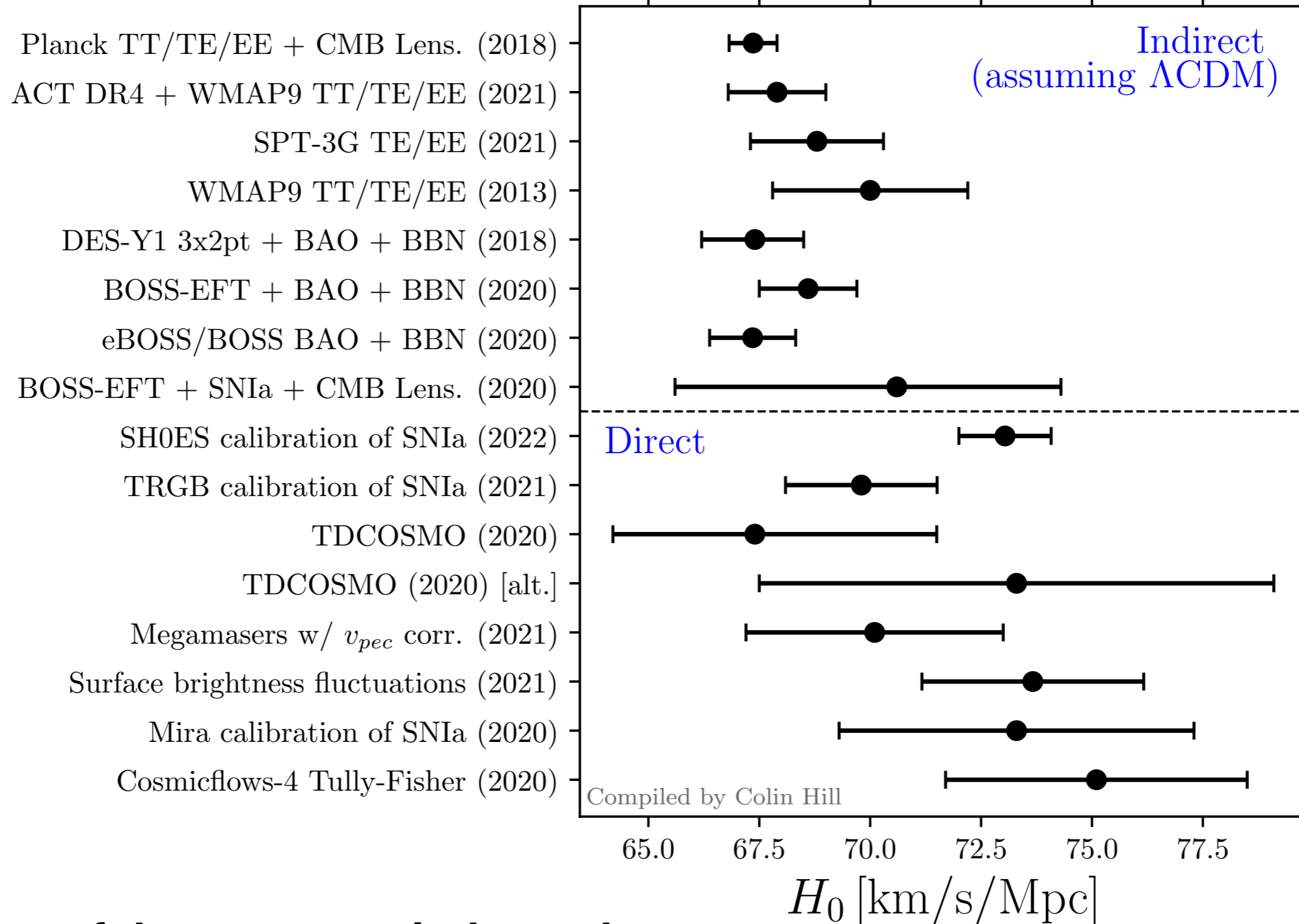
N.B. many of these are not independent

Original discussion: <https://twitter.com/jcolinhill/status/1319415667095949312>

The Hubble Situation

My personal view: observational situation remains unclear

(Incomplete) H_0 Compilation as of 22 February 2022



N.B. many of these are not independent

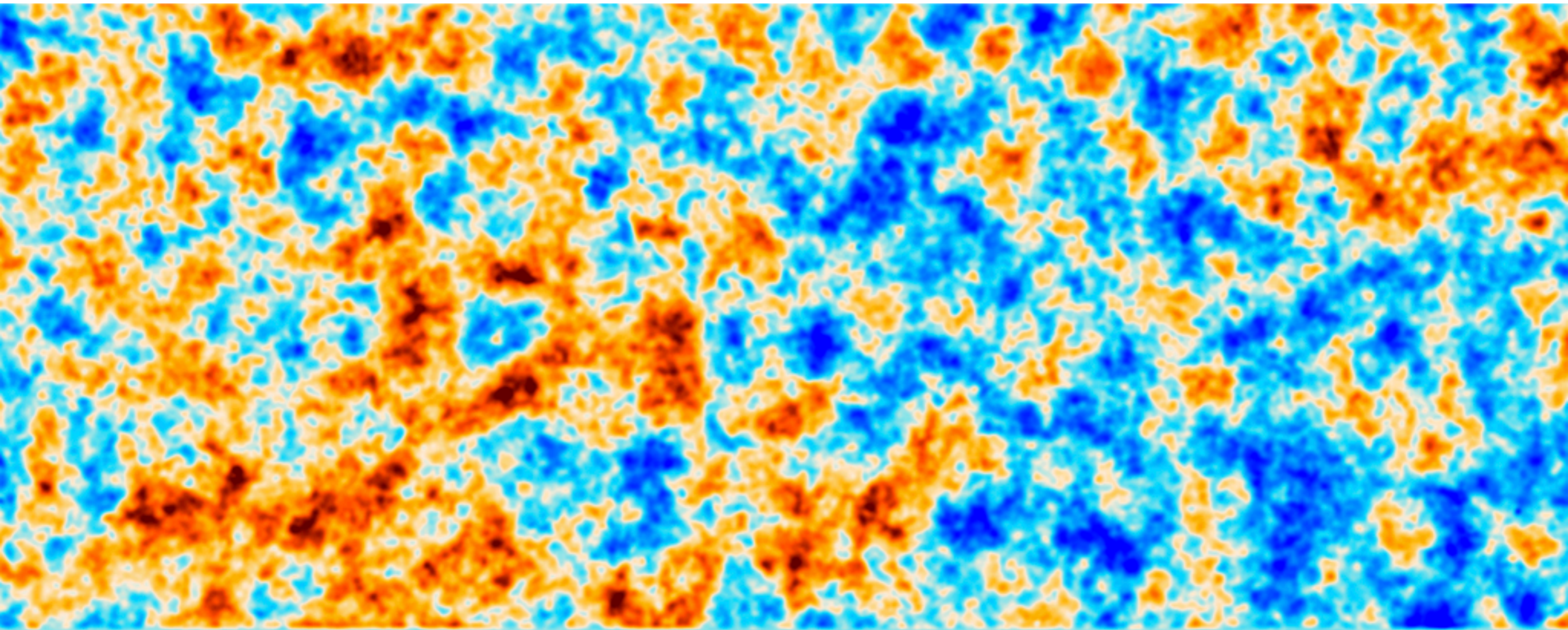
Original discussion: <https://twitter.com/jcolinhill/status/1319415667095949312>

How Do We Infer H_0 from the Cosmic Microwave Background?

The Sound Horizon



There is a “standard ruler” of known physical size imprinted in CMB maps. It is the distance that a sound wave could propagate in the plasma that filled the universe, starting at $t=0$ (Big Bang) until redshift $z = 1100$

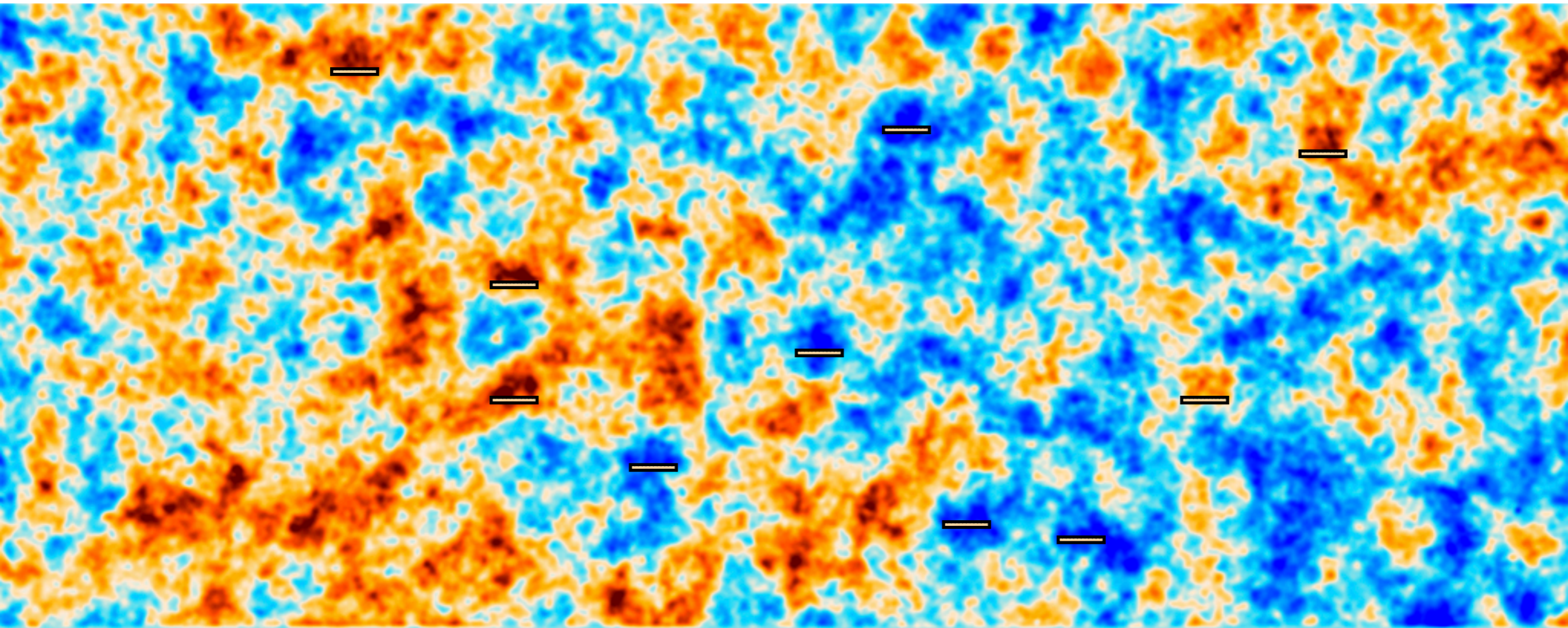


A small patch of a CMB temperature map made from combination of Planck and ACT DR4 data ($25 \times 10 \text{ deg}^2$)

The Sound Horizon



There is a “standard ruler” of known physical size imprinted in CMB maps. It is the distance that a sound wave could propagate in the plasma that filled the universe, starting at $t=0$ (Big Bang) until redshift $z = 1100$

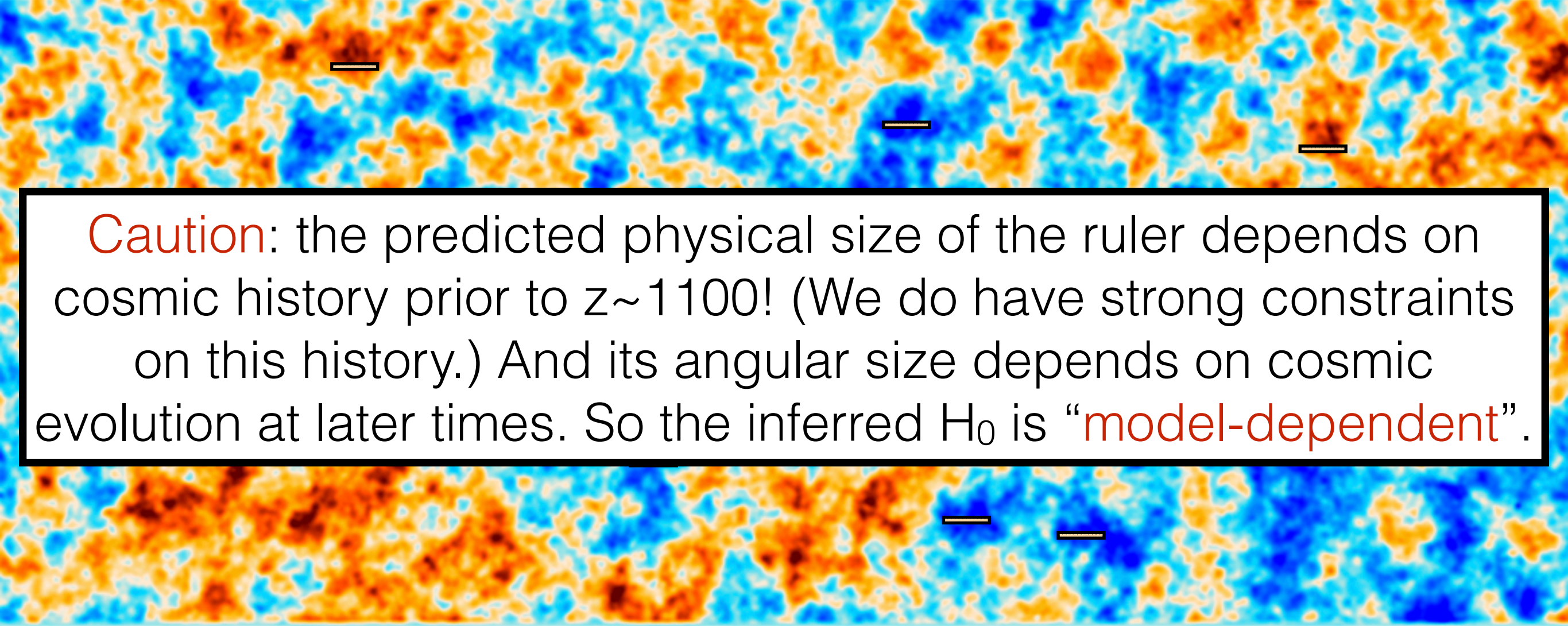


We measure the angular size of this ruler on the sky (θ_s^*), and thus infer the distance to the CMB — therefore we have a **distance** and a **redshift**.



The Sound Horizon

There is a “standard ruler” of known physical size imprinted in CMB maps. It is the distance that a sound wave could propagate in the plasma that filled the universe, starting at $t=0$ (Big Bang) until redshift $z = 1100$



Caution: the predicted physical size of the ruler depends on cosmic history prior to $z \sim 1100$! (We do have strong constraints on this history.) And its angular size depends on cosmic evolution at later times. So the inferred H_0 is “**model-dependent**”.

We measure the angular size of this ruler on the sky (θ_s^*), and thus infer the distance to the CMB — therefore we have a **distance** and a **redshift**.

The Hubble Situation

How can we increase H_0 inferred from the CMB and large-scale structure?

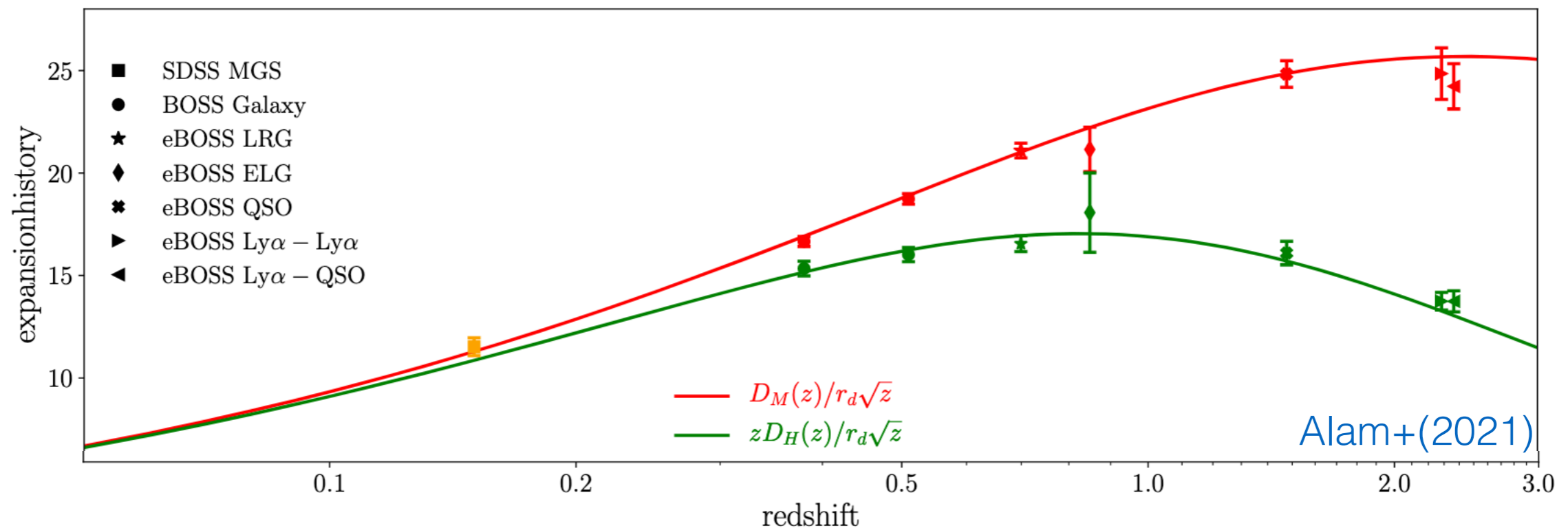
Can we preserve the angular size of the sound-horizon ruler on the sky while modifying cosmic evolution at late times to increase H_0 ?

The Hubble Situation

How can we increase H_0 inferred from the CMB and large-scale structure?

Can we preserve the angular size of the sound-horizon ruler on the sky while modifying cosmic evolution at late times to increase H_0 ? **No**

Late-time ($z < \text{few}$) theoretical modifications are highly constrained by (relative) expansion history data, e.g., BAO distances and SNIa distances



Such models often also conflict with integrated Sachs-Wolfe effect and CMB lensing data (e.g., [McCarthy & JCH \(2022\)](#): [2210.14339](#))

The Hubble Situation

My personal view: observational situation remains unclear

Regardless, the situation has motivated us to think about many types of new physics in the cosmos that we otherwise (likely) would not have



How can we increase H_0 inferred from the CMB and large-scale structure?

Late-time ($z < \text{few}$) theoretical modifications are highly constrained by (relative) expansion history data, e.g., BAO distances and SNIa distances

“We single out the set of solutions that increase the expansion rate in the decade of scale factor expansion just prior to recombination as the least unlikely [to be successful].” — Knox & Millea (2020)

The Hubble Situation

My personal view: observational situation remains unclear

Regardless, the situation has motivated us to think about many types of new physics in the cosmos that we otherwise (likely) would not have



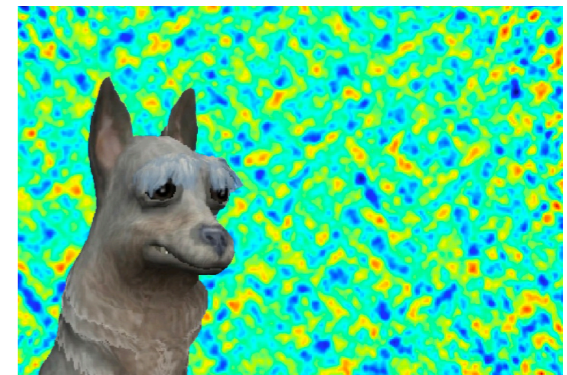
How can we increase H_0 inferred from the CMB and large-scale structure?

Late-time ($z < \text{few}$) theoretical modifications are highly constrained by (relative) expansion history data, e.g., BAO distances and SNIa distances

“We single out the set of solutions that increase the expansion rate in the decade of scale factor expansion just prior to recombination as the least unlikely [to be successful].” — Knox & Millea (2020)



Generic consequence: new signals
in the cosmic microwave background



The Hubble Situation

If the H_0 discrepancy is not due to systematic error(s), how can we explain it?

One possibility: some (exotic) new physics altered the physical size of the “ruler” in the CMB

e.g., extra “dark radiation” in the early universe or “early dark energy”

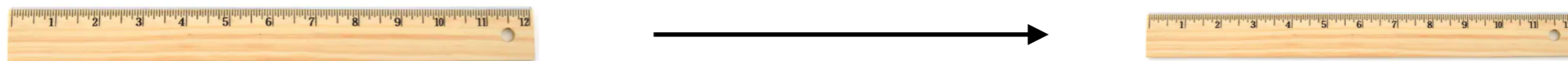
The Hubble Situation

If the H_0 discrepancy is not due to systematic error(s), how can we explain it?

One possibility: some (exotic) new physics altered the physical size of the “ruler” in the CMB

e.g., extra “dark radiation” in the early universe or “early dark energy”

Goal of many such proposals: the new physics acts to *decrease* the physical size of the standard ruler (the sound horizon), so that the distance to the CMB that we infer is also decreased, and our inferred H_0 is *increased*



The Hubble Situation

If the H_0 discrepancy is not due to systematic error(s), how can we explain it?

Goal of many such proposals: the new physics acts to *decrease* the physical size of the standard ruler (the sound horizon), so that the distance to the CMB that we infer is also decreased, and our inferred H_0 is *increased*



$$r_s^* = \int_0^{t_*} \frac{dt}{a(t)} c_s(t) = \int_{z_*}^{\infty} \frac{dz}{H(z)} c_s(z)$$

sound horizon scale factor sound speed idea: increase $H(z)$ just prior to $z^* \sim 1100$

The Hubble Situation

If the H_0 discrepancy is not due to systematic error(s), how can we explain it?

Goal of many such proposals: the new physics acts to *decrease* the physical size of the standard ruler (the sound horizon), so that the distance to the CMB that we infer is also decreased, and our inferred H_0 is *increased*



$$r_s^* = \int_0^{t_*} \frac{dt}{a(t)} c_s(t) = \int_{z_*}^{\infty} \frac{dz}{H(z)} c_s(z)$$

sound horizon \nearrow r_s^* \nwarrow scale factor \nearrow $a(t)$ \nwarrow sound speed \nearrow $c_s(t)$ \nwarrow \nearrow $c_s(z)$ \nwarrow $H(z)$ \nearrow idea: increase $H(z)$ just prior to $z^* \sim 1100$

Then to keep $\theta_s^* = r_s^*/D_A^*$ fixed, H_0 must increase ($D_A \sim 1/H_0$)

The Hubble Situation

If the H_0 discrepancy is not due to systematic error(s), how can we explain it?

Another possibility: some new physics altered the dynamics of the epoch of recombination

The Hubble Situation

If the H_0 discrepancy is not due to systematic error(s), how can we explain it?

Another possibility: some new physics altered the dynamics of the epoch of recombination

e.g., primordial magnetic fields or varying fundamental constants

Goal of many such proposals: the new physics acts to *accelerate* the process of recombination, so that recombination happens earlier (i.e., at higher redshift)

In some such models (but not all), r_s^* is decreased due to higher z^*

“H₀ Olympics”

Very useful systematically organized global study
(N.B. no S₈ data considered, apart from Planck CMB lensing)

Model	ΔN_{param}	M_B	Gaussian Tension	Q_{DMAP} Tension		$\Delta\chi^2$	ΔAIC		Finalist
ΛCDM	0	-19.416 ± 0.012	4.4σ	4.5σ	X	0.00	0.00	X	X
ΔN_{ur}	1	-19.395 ± 0.019	3.6σ	3.8σ	X	-6.10	-4.10	X	X
SIDR	1	-19.385 ± 0.024	3.2σ	3.3σ	X	-9.57	-7.57	✓	✓ 🥉
mixed DR	2	-19.413 ± 0.036	3.3σ	3.4σ	X	-8.83	-4.83	X	X
DR-DM	2	-19.388 ± 0.026	3.2σ	3.1σ	X	-8.92	-4.92	X	X
SI ν +DR	3	$-19.440^{+0.037}_{-0.039}$	3.8σ	3.9σ	X	-4.98	1.02	X	X
Majoron	3	$-19.380^{+0.027}_{-0.021}$	3.0σ	2.9σ	✓	-15.49	-9.49	✓	✓ 🥈
primordial B	1	$-19.390^{+0.018}_{-0.024}$	3.5σ	3.5σ	X	-11.42	-9.42	✓	✓ 🥉
varying m_e	1	-19.391 ± 0.034	2.9σ	2.9σ	✓	-12.27	-10.27	✓	✓ 🥈
varying $m_e + \Omega_k$	2	-19.368 ± 0.048	2.0σ	1.9σ	✓	-17.26	-13.26	✓	✓ 🥈
EDE	3	$-19.390^{+0.016}_{-0.035}$	3.6σ	1.6σ	✓	-21.98	-15.98	✓	✓ 🥈
NEDE	3	$-19.380^{+0.023}_{-0.040}$	3.1σ	1.9σ	✓	-18.93	-12.93	✓	✓ 🥈
EMG	3	$-19.397^{+0.017}_{-0.023}$	3.7σ	2.3σ	✓	-18.56	-12.56	✓	✓ 🥈
CPL	2	-19.400 ± 0.020	3.7σ	4.1σ	X	-4.94	-0.94	X	X
PEDE	0	-19.349 ± 0.013	2.7σ	2.8σ	✓	2.24	2.24	X	X
GPEDE	1	-19.400 ± 0.022	3.6σ	4.6σ	X	-0.45	1.55	X	X
DM \rightarrow DR+WDM	2	-19.420 ± 0.012	4.5σ	4.5σ	X	-0.19	3.81	X	X
DM \rightarrow DR	2	-19.410 ± 0.011	4.3σ	4.5σ	X	-0.53	3.47	X	X

early universe

late universe

Dark Screening: Extraction

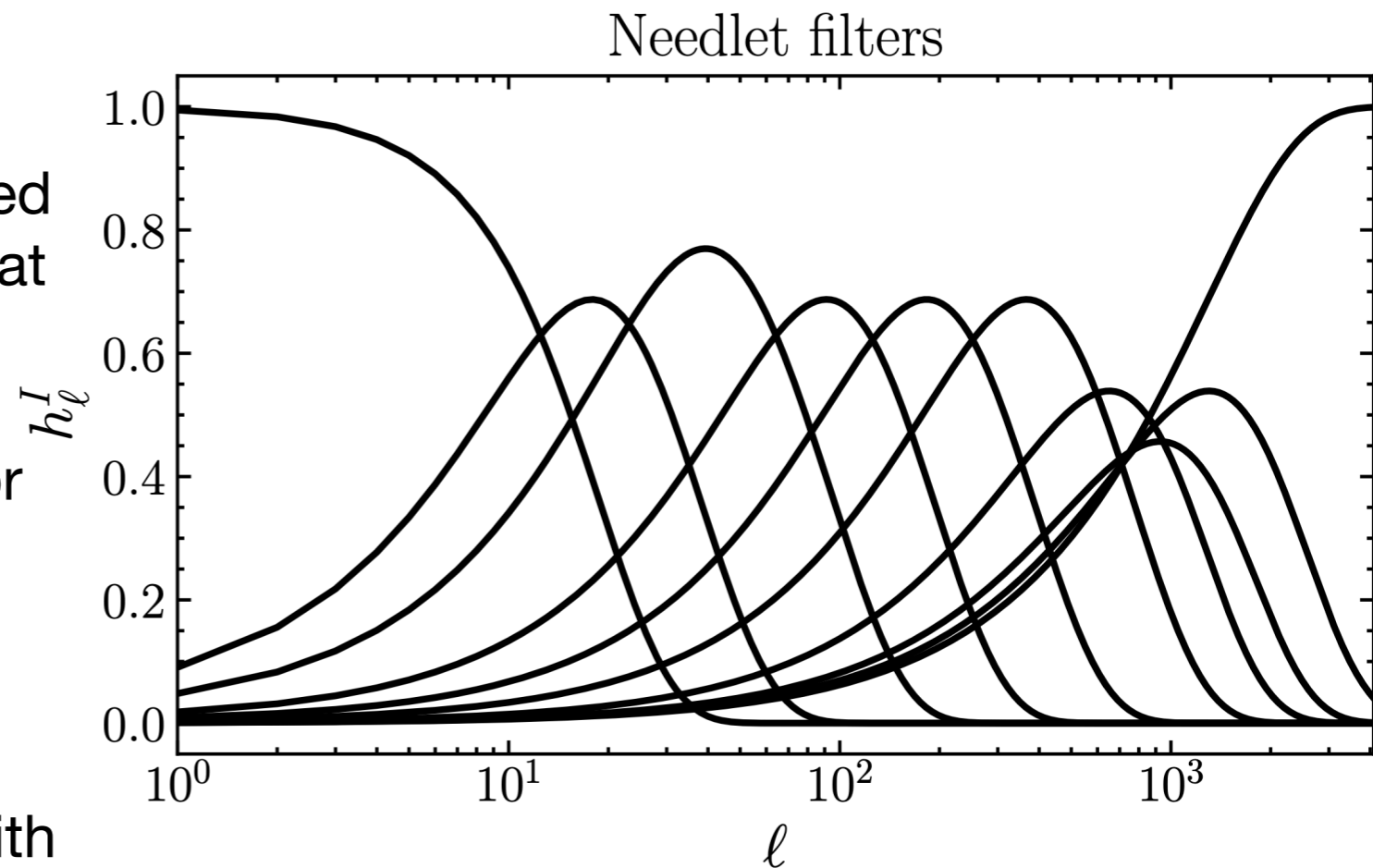
Colin Hill
Columbia

Needlet Internal Linear Combination

Needlets allow localization of ILC weights in both harmonic and pixel space

Steps:

- 1) Filter each frequency map with each harmonic-space needlet filter
- 2) Compute the freq.-freq. covariance matrix in real-space domain of specified size centered on each pixel (for maps at each needlet scale)
- 3) Compute ILC weights at each pixel (for maps at each needlet scale)
- 4) Obtain per-scale ILC maps
- 5) Filter each per-scale ILC map again with the needlet filters
- 6) Co-add ILC maps from all needlet scales to obtain final NILC map



Dark Screening: Extraction

Colin Hill
Columbia

pyilc flexible, extensible NILC code in Python

Needlet ILC in Python

Features:

- Trivial installation, requires only healpy
- Many component SEDs available (CMB, tSZ, CIB, synchrotron, ..) + easy to add more
- Easy to define any type of needlet filters
- Delta-function or realistic passbands can be used
- Gaussian beams or arbitrary ell-dependent beams can be used
- Automatically determines which frequency maps to use at a given needlet scale, given their beams
- Covariances are computed only once and then cached for future use, allowing many constrained ILCs (“deprojections”) to be run at ~zero additional computational expense
- Automatically determines the size of the real-space domains to be used in computing the freq.-freq. covariance matrix at each needlet scale, by requiring the number of modes to be large enough to keep the “ILC bias” below a fixed tolerance:

$$\frac{b_{\text{ILC}}}{\langle s^2 \rangle} = \frac{|1 + N_{\text{deproj}} - N_{\text{freq}}|}{N_{\text{modes}}}$$

Thermal SZ Extraction

Colin Hill
Columbia

CIB cleaning: moment deprojection

Idea: suppose the fundamental SED describing dust emission is indeed a modified blackbody (MBB). Variations in the MBB parameters (β, T) across the sky and along the line of sight will generically produce new spectral shapes that are described by higher-order moments in a Taylor expansion of the fundamental SED.

Thermal SZ Extraction

Colin Hill
Columbia

CIB cleaning: moment deprojection

Idea: suppose the fundamental SED describing dust emission is indeed a modified blackbody (MBB). Variations in the MBB parameters (β, T) across the sky and along the line of sight will generically produce new spectral shapes that are described by higher-order moments in a Taylor expansion of the fundamental SED.

MBB:

$$I_{\nu}^{\text{CIB}}(\hat{n}) = \left(\frac{\nu}{\nu_0} \right)^{\beta+3} \frac{1}{e^{x_{\text{CIB}}} - 1} A^{\text{CIB}}(\hat{n})$$

First-order moments:

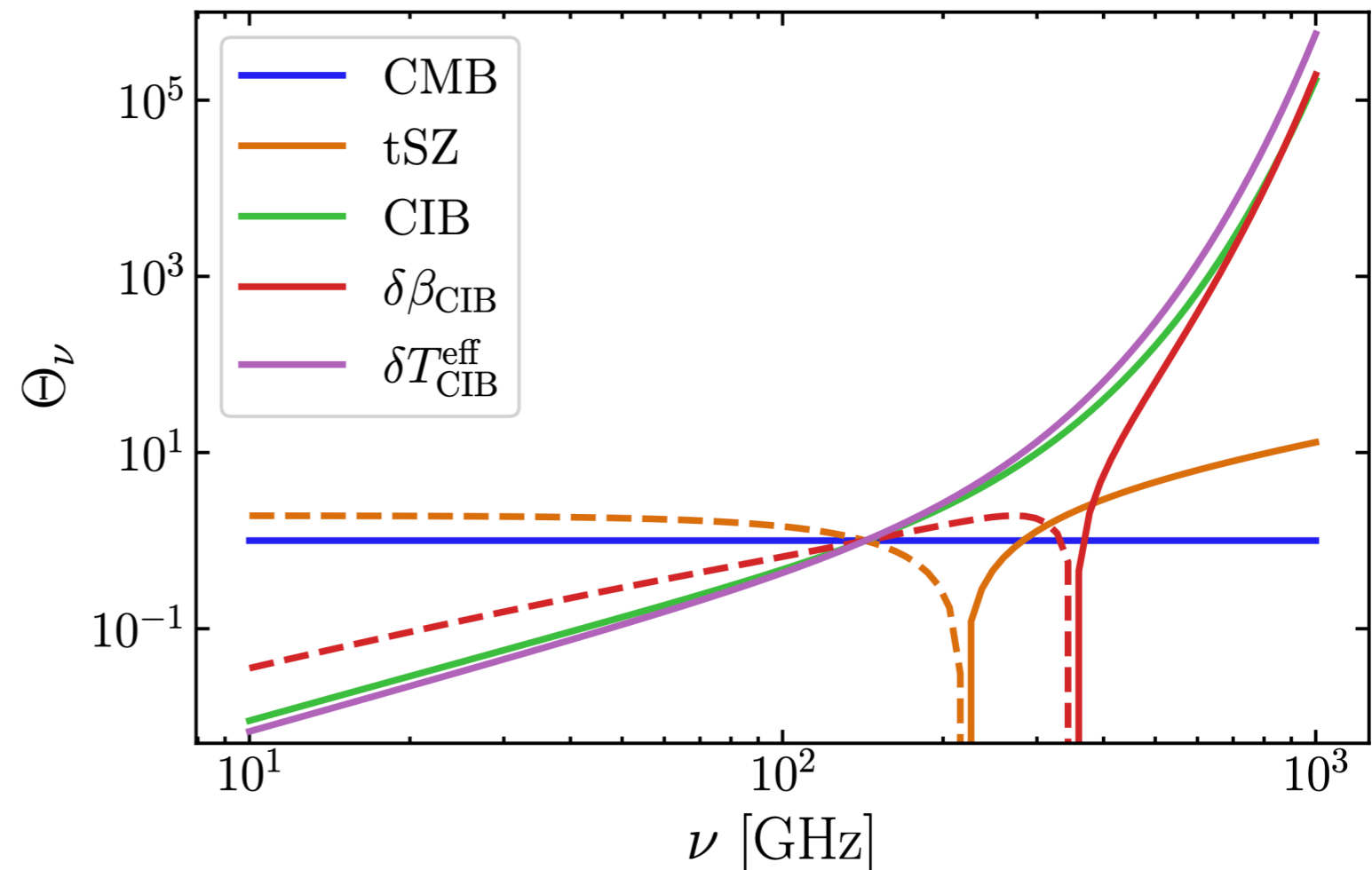
$$\frac{\partial I_{\nu}^{\text{CIB}}(\hat{n})}{\partial \beta} = \ln \left(\frac{\nu}{\nu_0} \right) I_{\nu}^{\text{CIB}}(\hat{n});$$

$$\frac{\partial I_{\nu}^{\text{CIB}}(\hat{n})}{\partial T_{\text{CIB}}^{\text{eff}}} = I_{\nu}^{\text{CIB}}(\hat{n}) \frac{x_{\text{CIB}}}{T_{\text{CIB}}^{\text{eff}}} \frac{e^{x_{\text{CIB}}}}{e^{x_{\text{CIB}}} - 1}$$

$$x_{\text{CIB}} \equiv \frac{h\nu}{k_B T_{\text{CIB}}^{\text{eff}}}$$

$$\nu_0 = 353 \text{ GHz}$$

Component SEDs [normalized]



Thermal SZ Extraction

Colin Hill
Columbia

CIB cleaning: moment deprojection

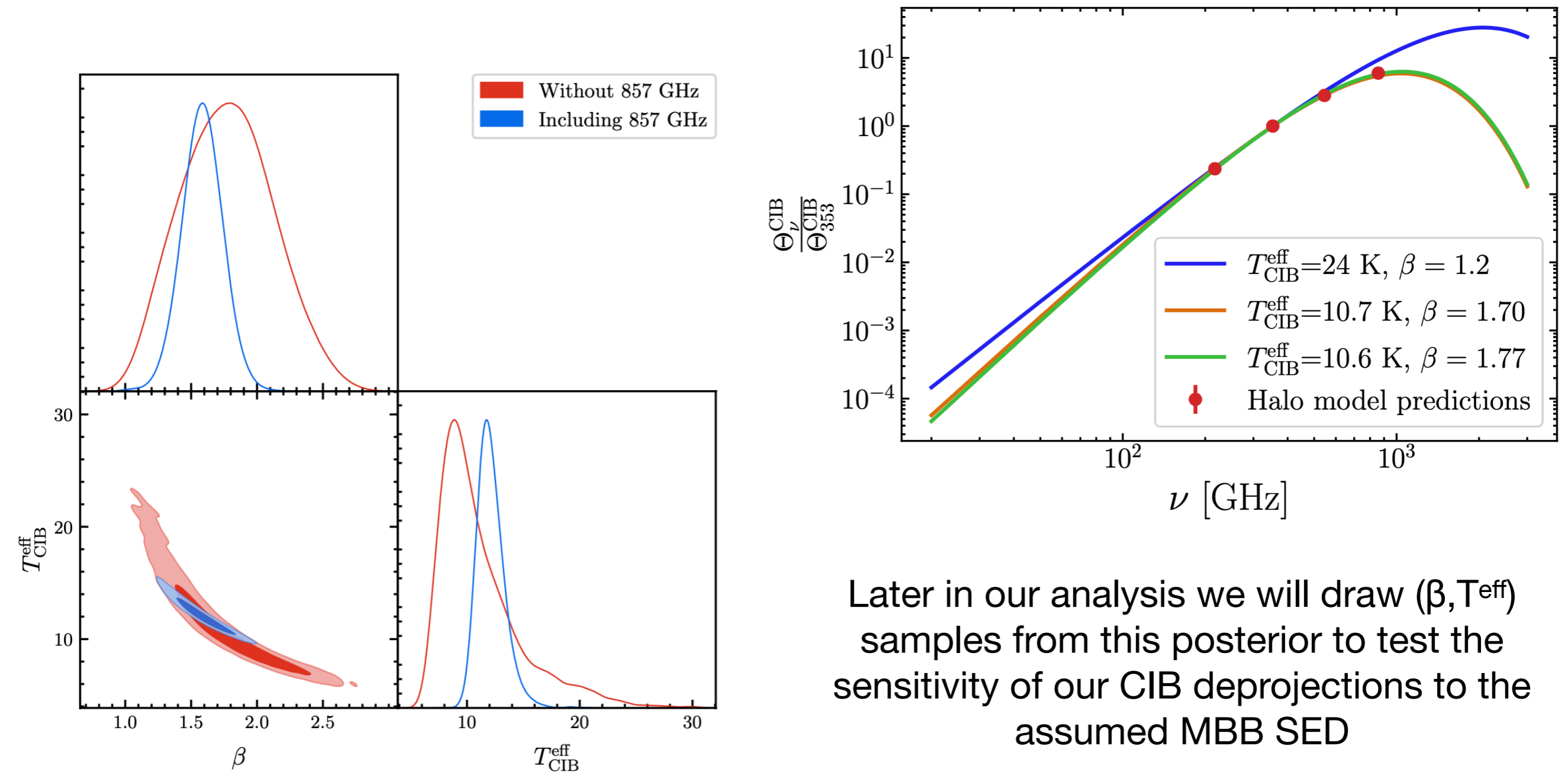
MBB fit to CIB monopole SED predicted by best-fit halo model to CIB power spectra

Thermal SZ Extraction

Colin Hill
Columbia

CIB cleaning: moment deprojection

MBB fit to CIB monopole SED predicted by best-fit halo model to CIB power spectra



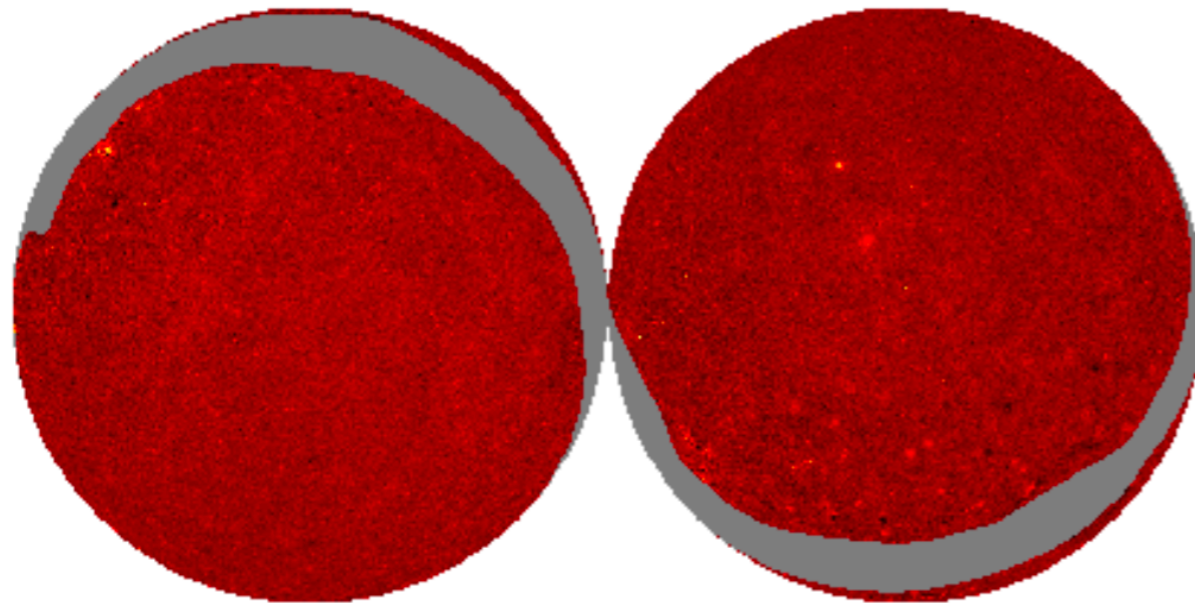
Later in our analysis we will draw (β, T^{eff}) samples from this posterior to test the sensitivity of our CIB deprojections to the assumed MBB SED

Thermal SZ Extraction

Colin Hill
Columbia

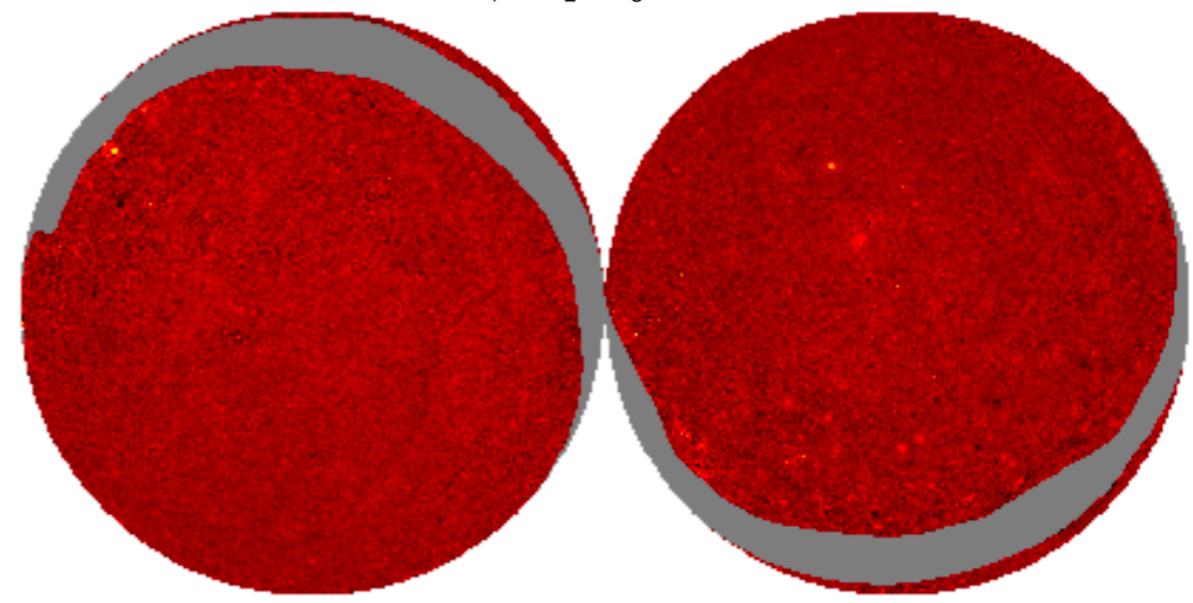
Application to Planck PR4 (NPIPE) maps

NILC tSZ; no deprojection



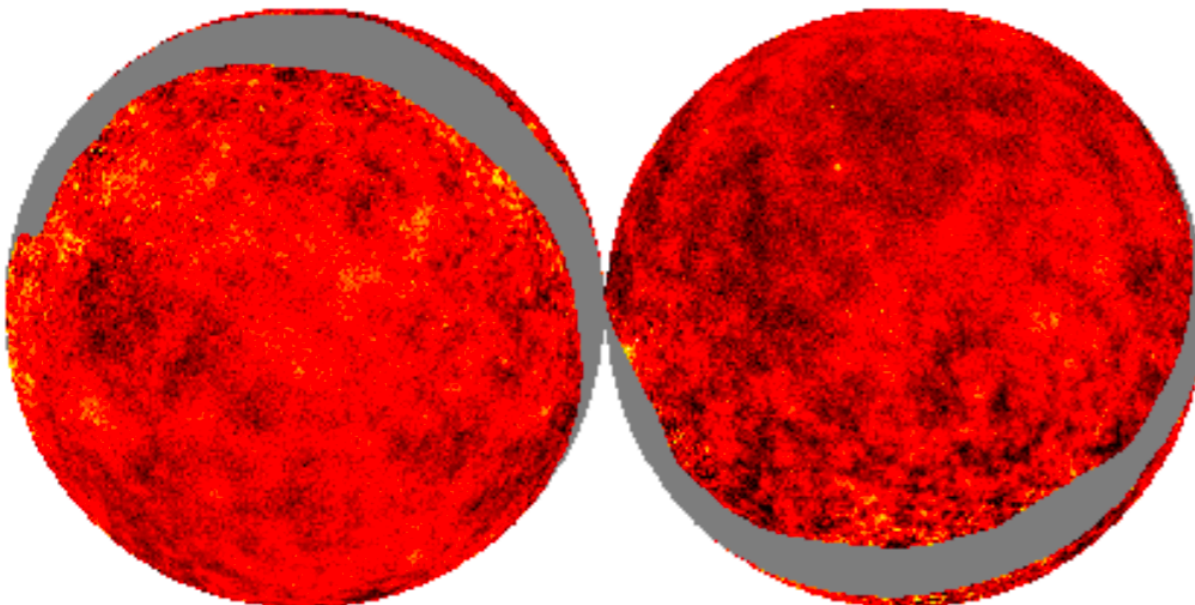
-1e-05 Compton y 4e-05

NILC tSZ; deprojection of CIB



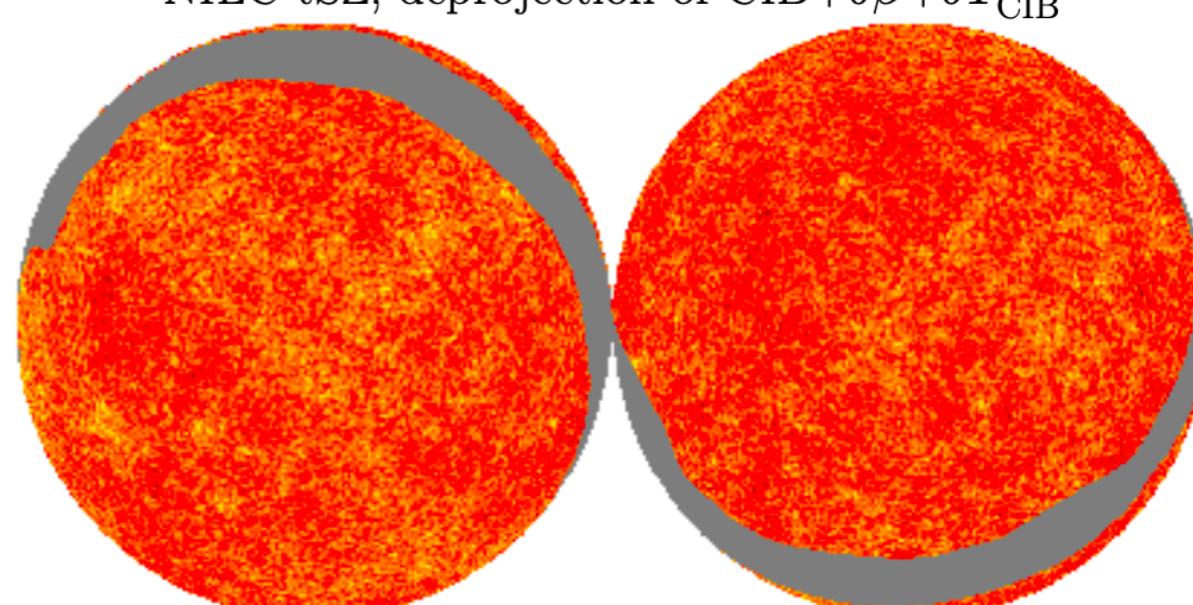
-1e-05 Compton y 4e-05

NILC tSZ; deprojection of CIB+ $\delta\beta$



-2e-05 Compton y 4e-05

NILC tSZ; deprojection of CIB+ $\delta\beta$ + $\delta T_{\text{CIB}}^{\text{eff}}$

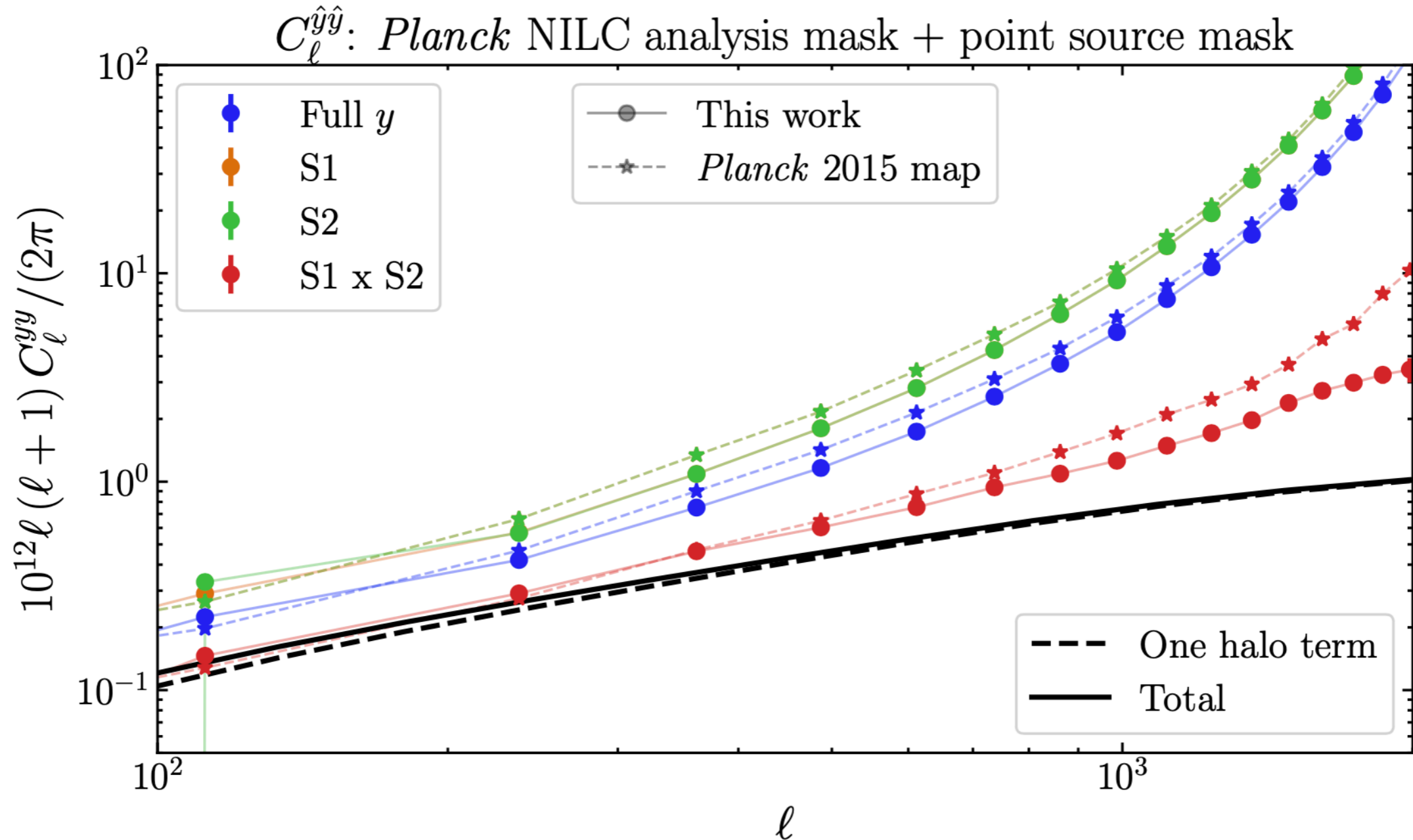


-9e-05 Compton y 9e-05

Thermal SZ Extraction

Colin Hill
Columbia

Application to Planck PR4 (NPIPE) maps

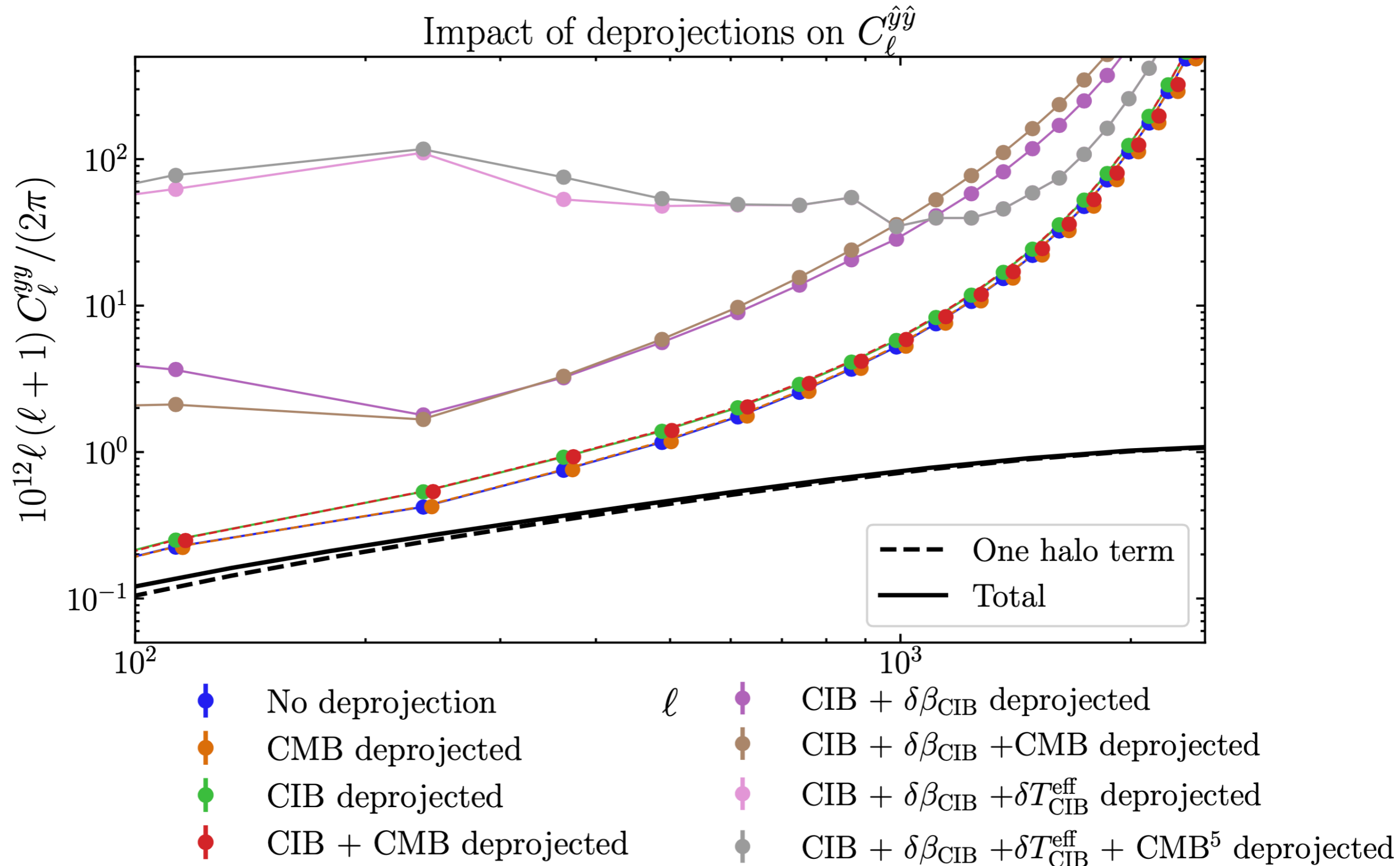


~10-20% lower noise visible on small scales in auto-spectrum, and improved foreground cleaning visible in S1xS2 cross-spectrum (free of noise bias)

Thermal SZ Extraction

Colin Hill
Columbia

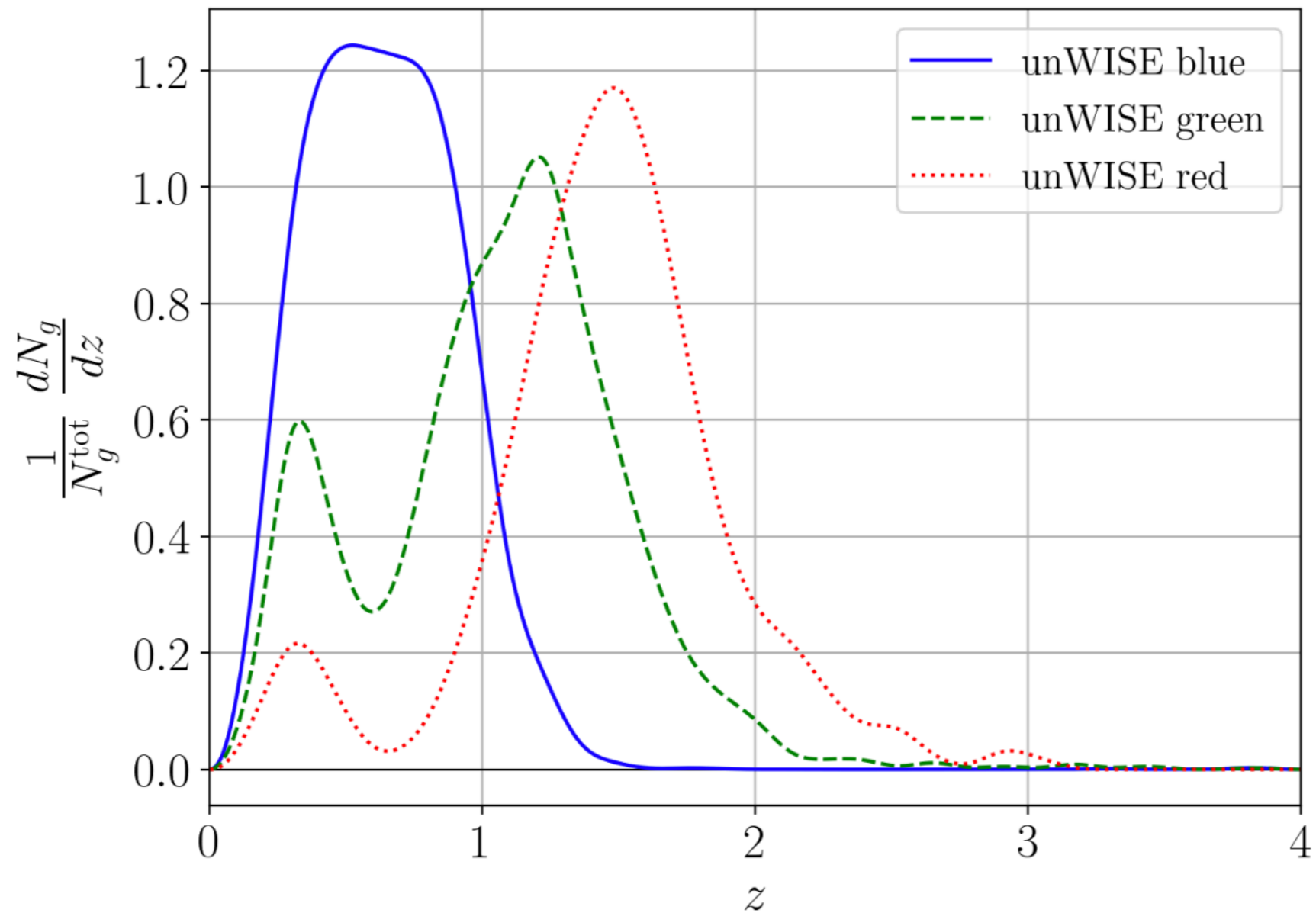
Application to Planck PR4 (NPIPE) maps



unWISE Properties

Colin Hill
Columbia

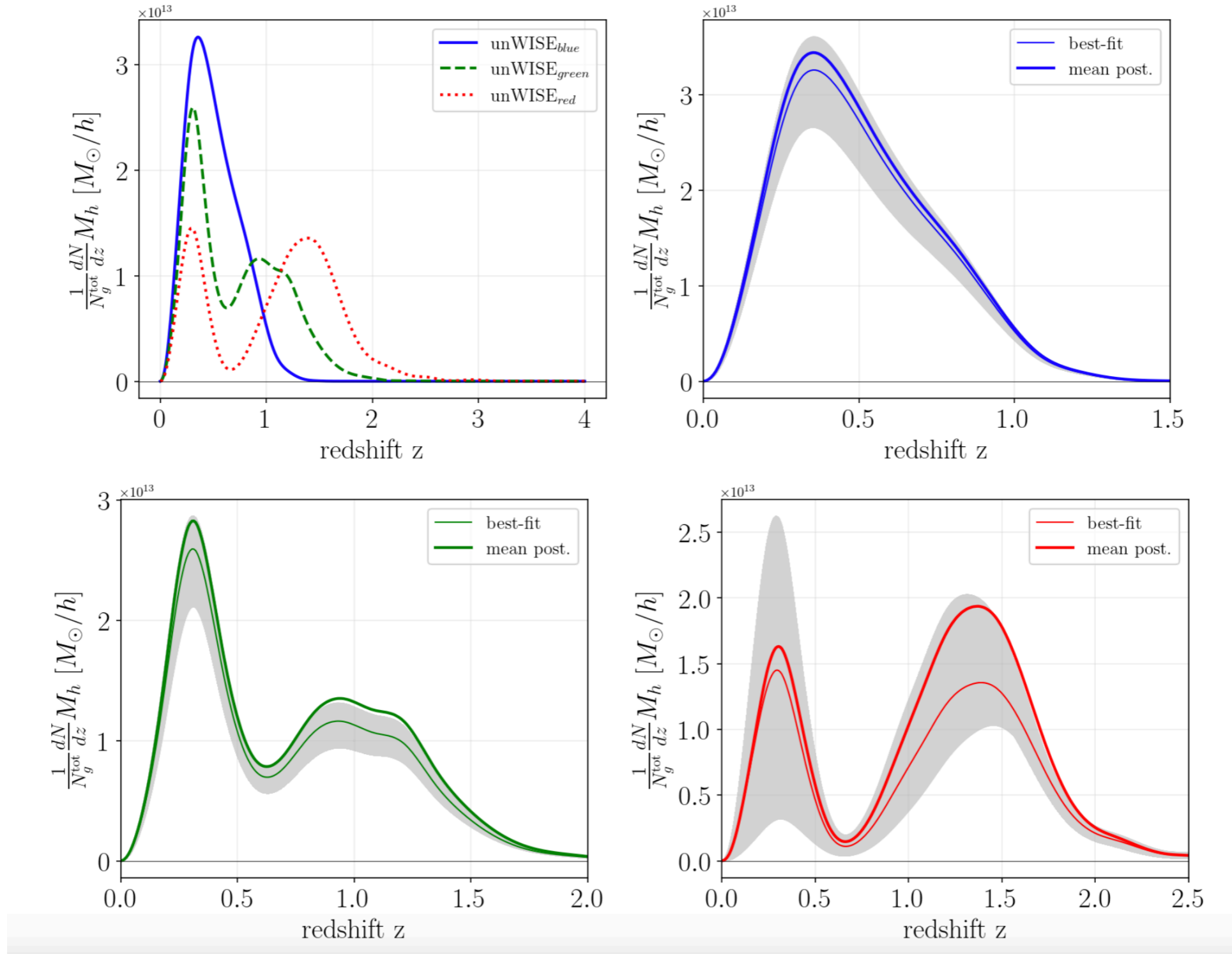
Redshift distributions



unWISE Properties

Colin Hill
Columbia

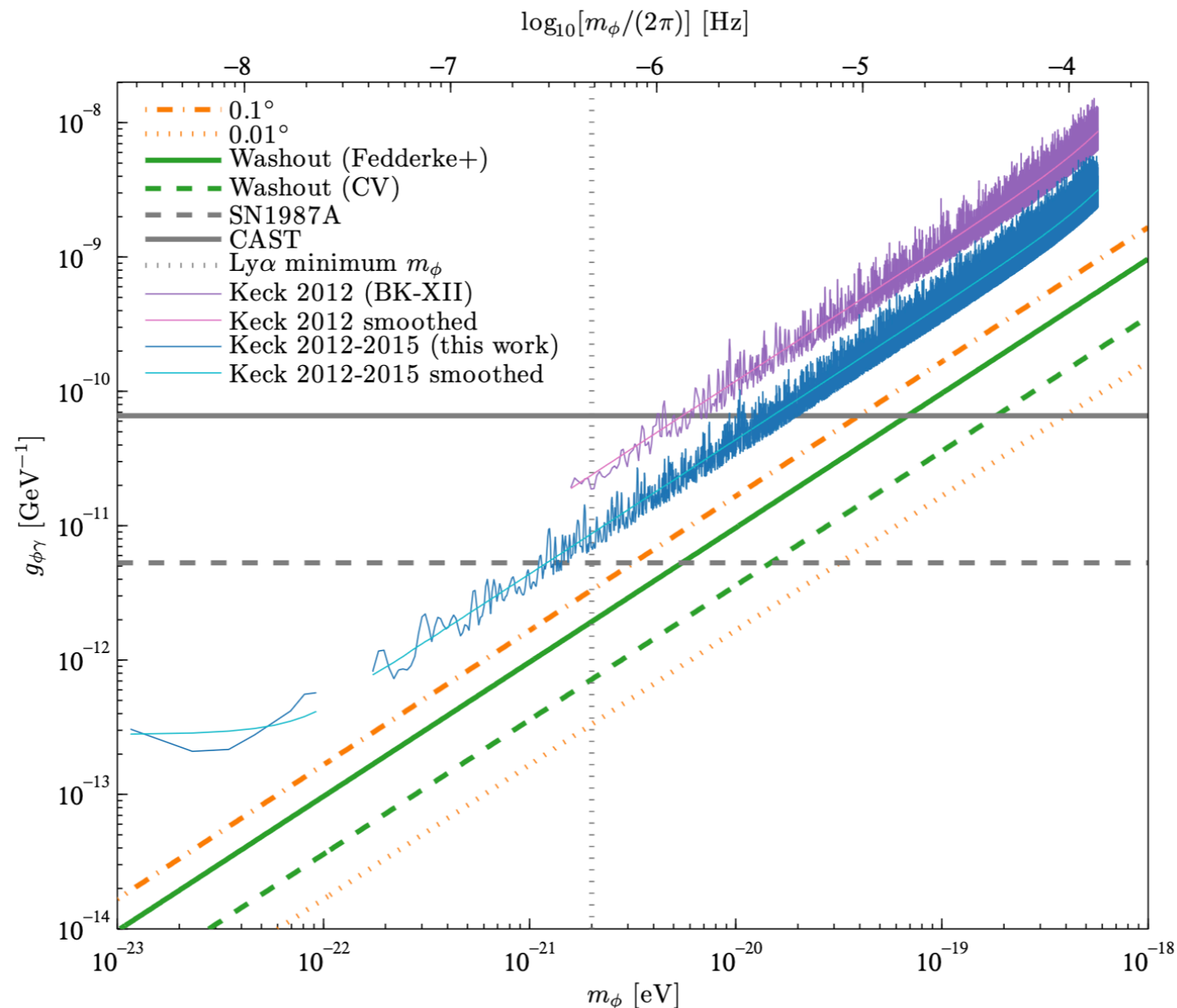
Mean halo mass



Other Axion CMB Limits

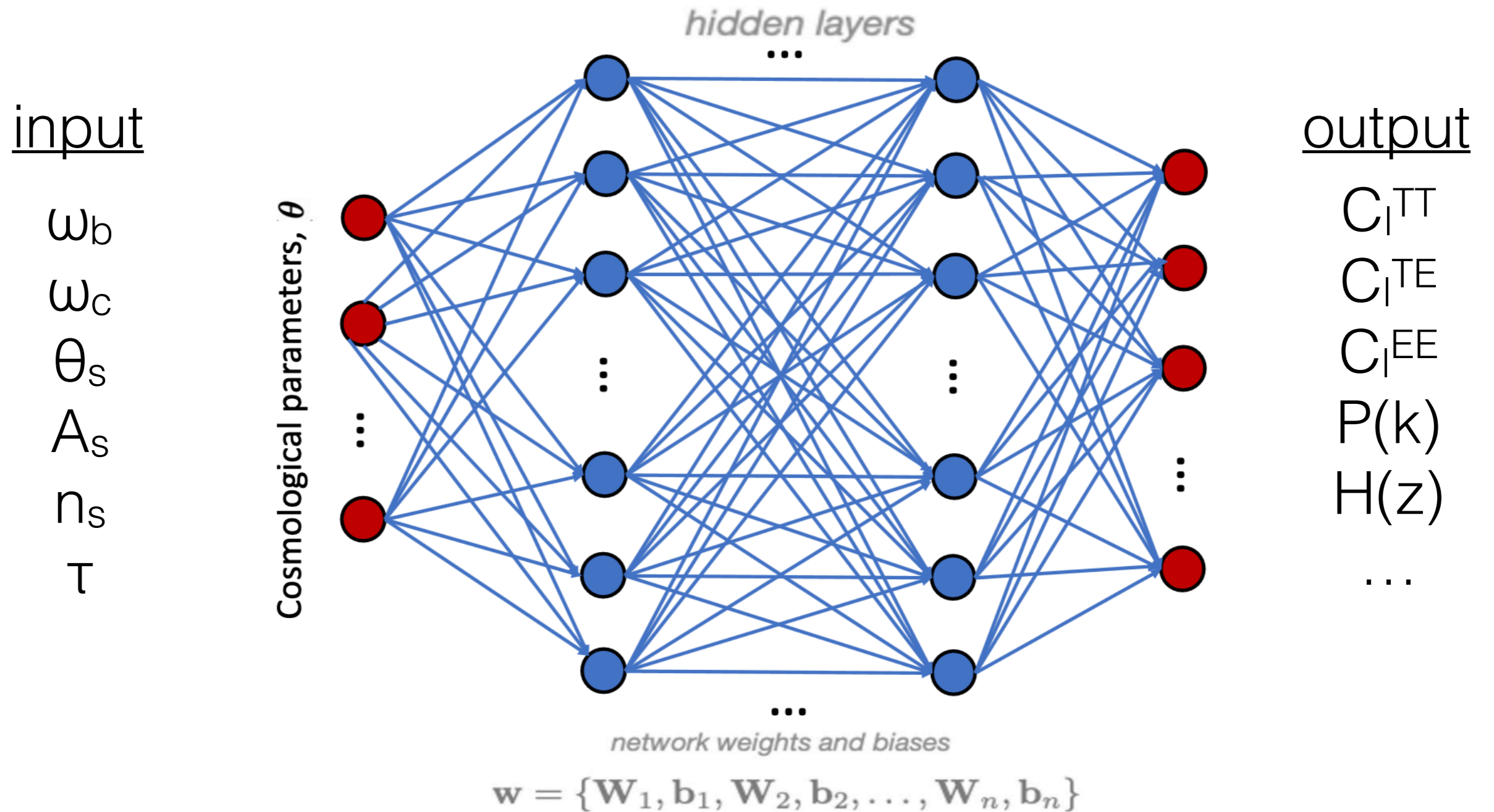
Colin Hill
Columbia

- Other effects in CMB polarization due to axion-photon coupling:
- all-sky oscillation of CMB polarization (in real time)
 - “washout” of polarization at last-scattering surface



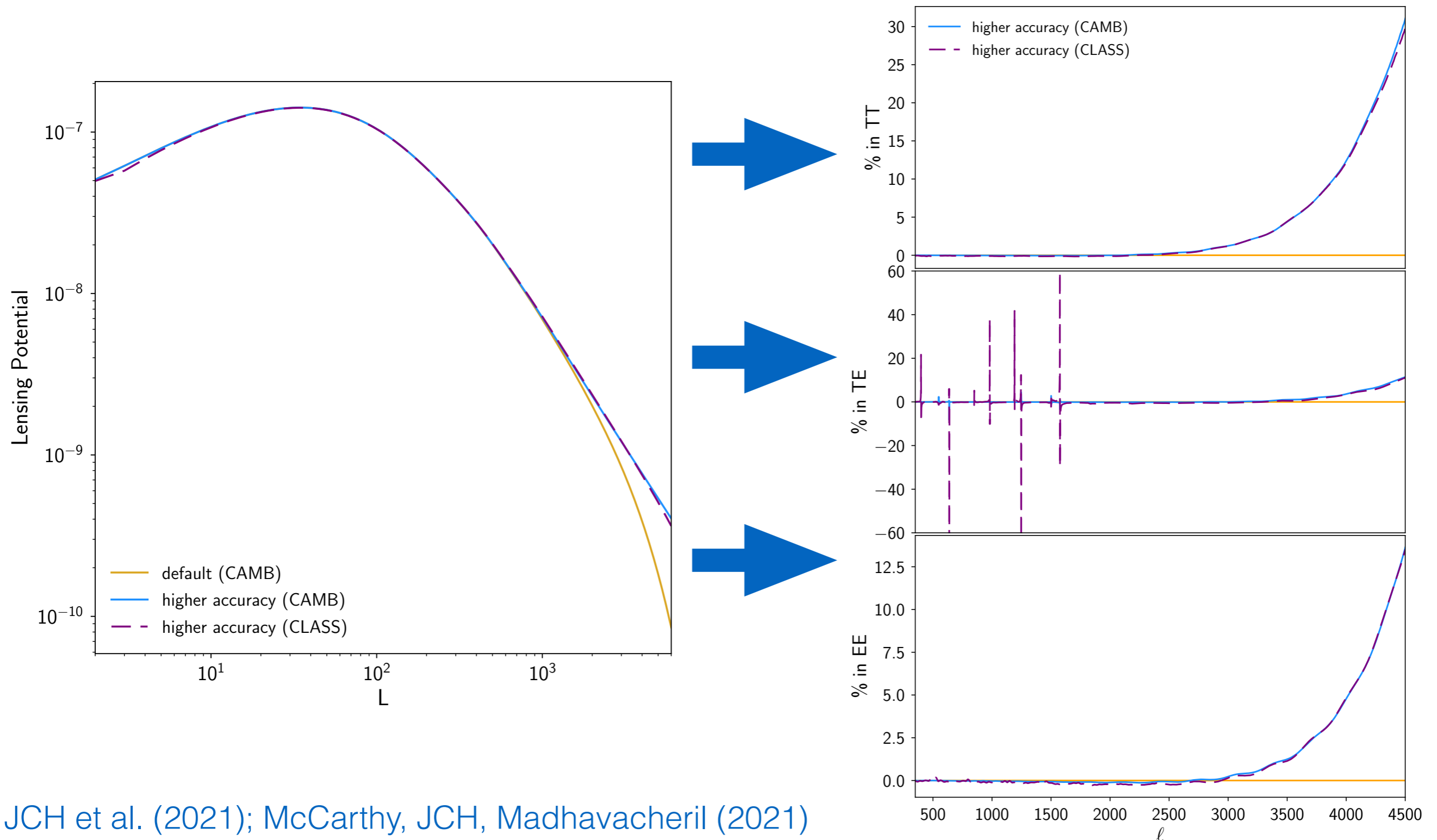
CosmoPower

Cosmological observables are smooth functions of the input parameters: easy to emulate at high accuracy with modern neural networks, thereby massively accelerating standard calculations



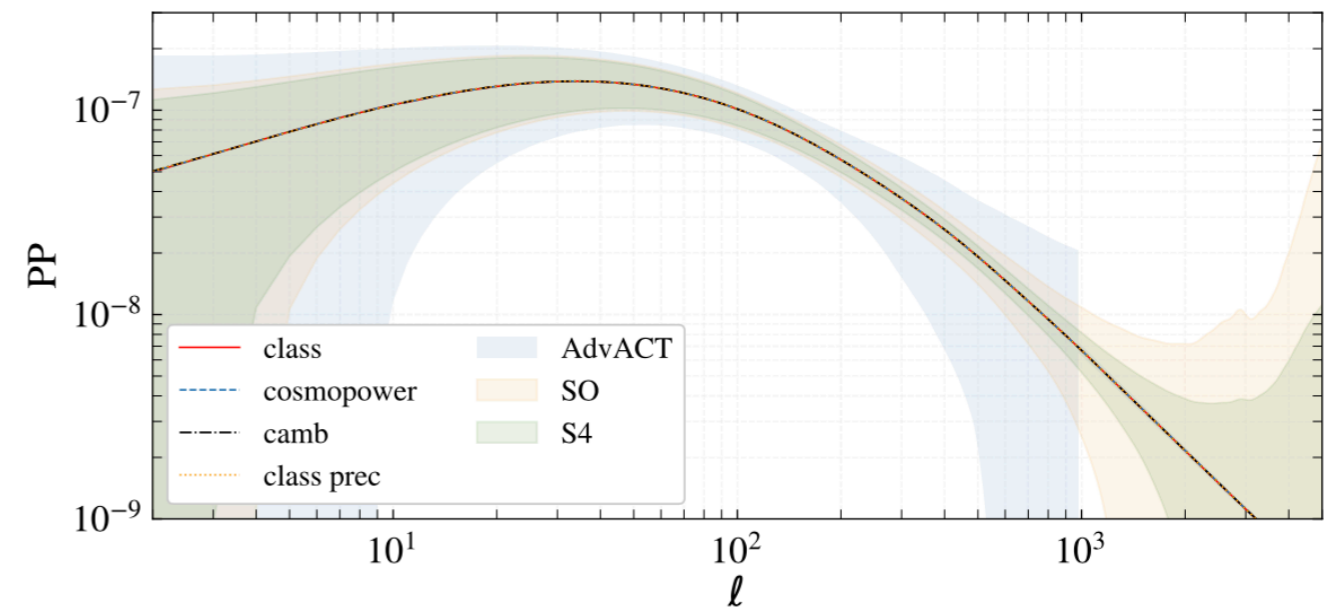
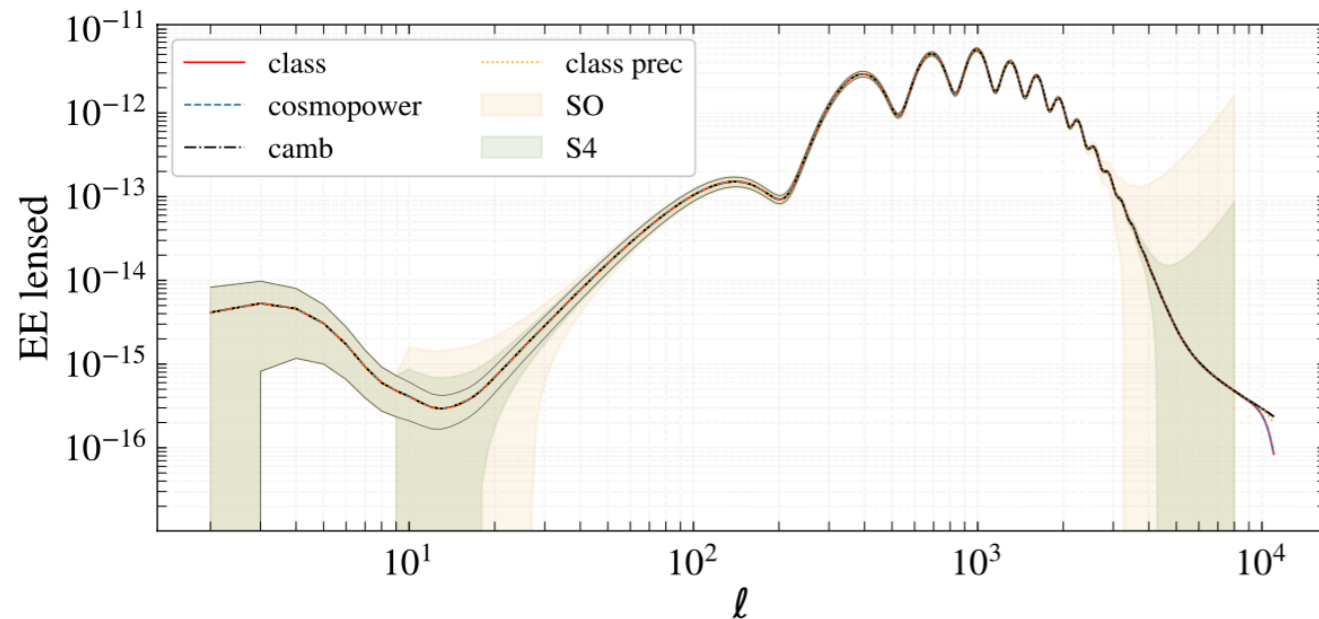
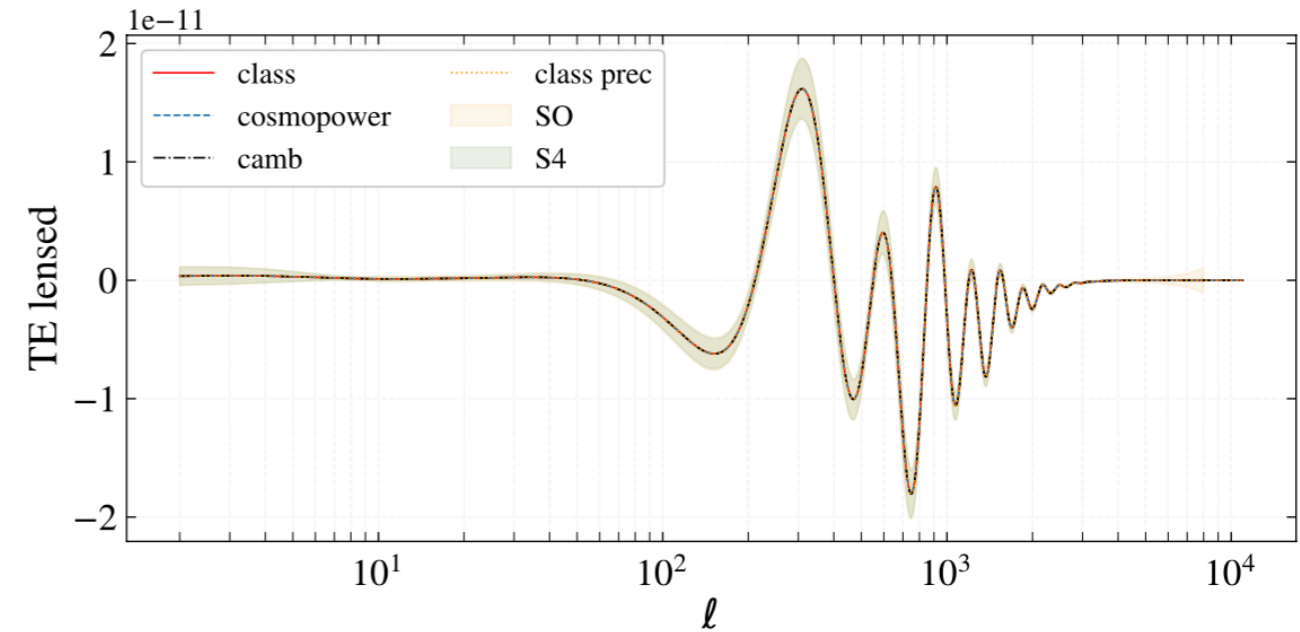
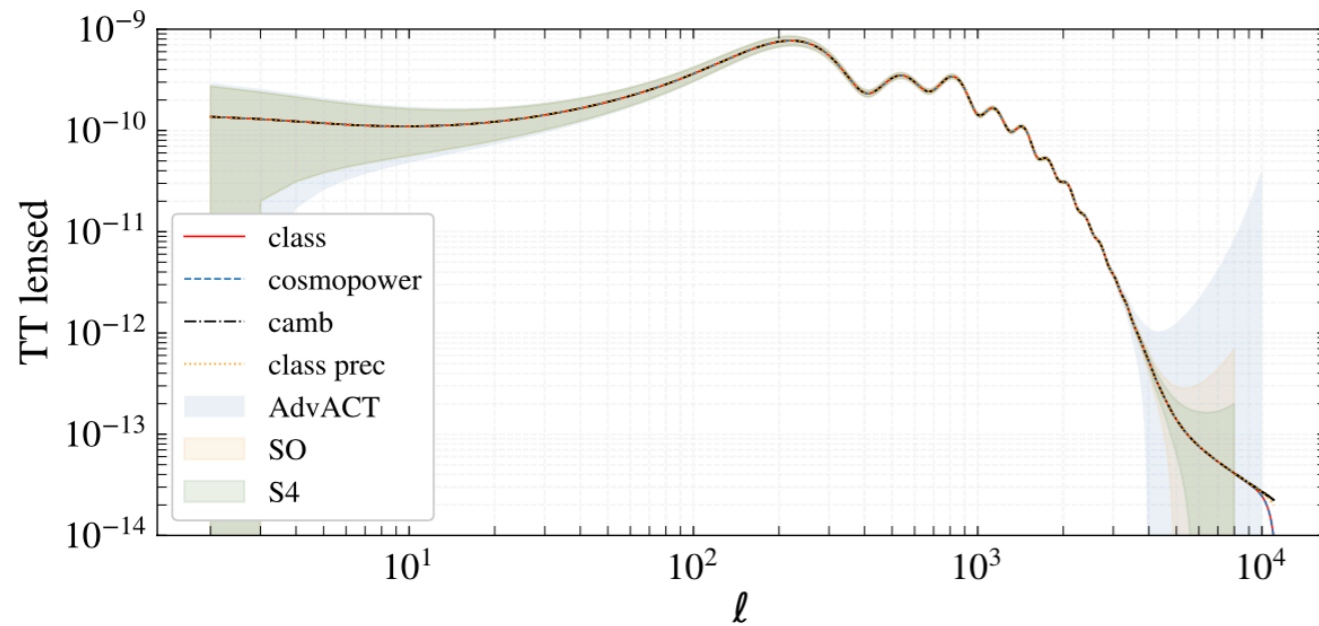
Theoretical Accuracy

Are the default accuracy settings in CAMB/CLASS OK for ACT/SO?
Almost, but not quite — higher accuracy needed in lensing calc.



CosmoPower++

Goal of new work: build emulators using very high-accuracy CLASS calculations — these require ~1 minute per evaluation (~10-20x slower than default settings)

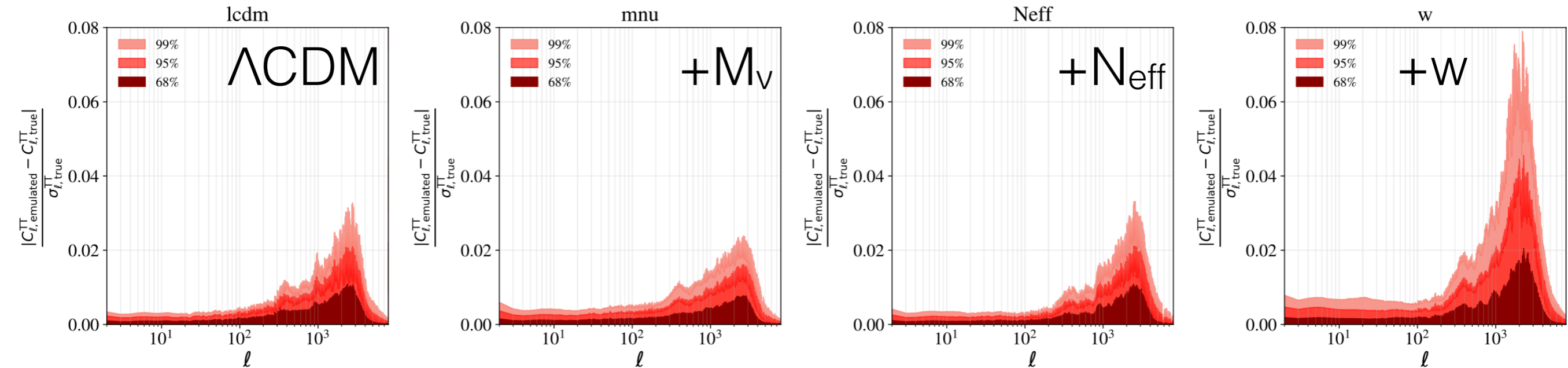


It works: emulator reproduces correct results in < 10 ms per evaluation

Emulator Validation on Test Set

Assess accuracy in terms of forecast CMB-S4 error bars: $< 0.07\sigma$ at all $\ell < 10^4$

CMB TT power spectrum



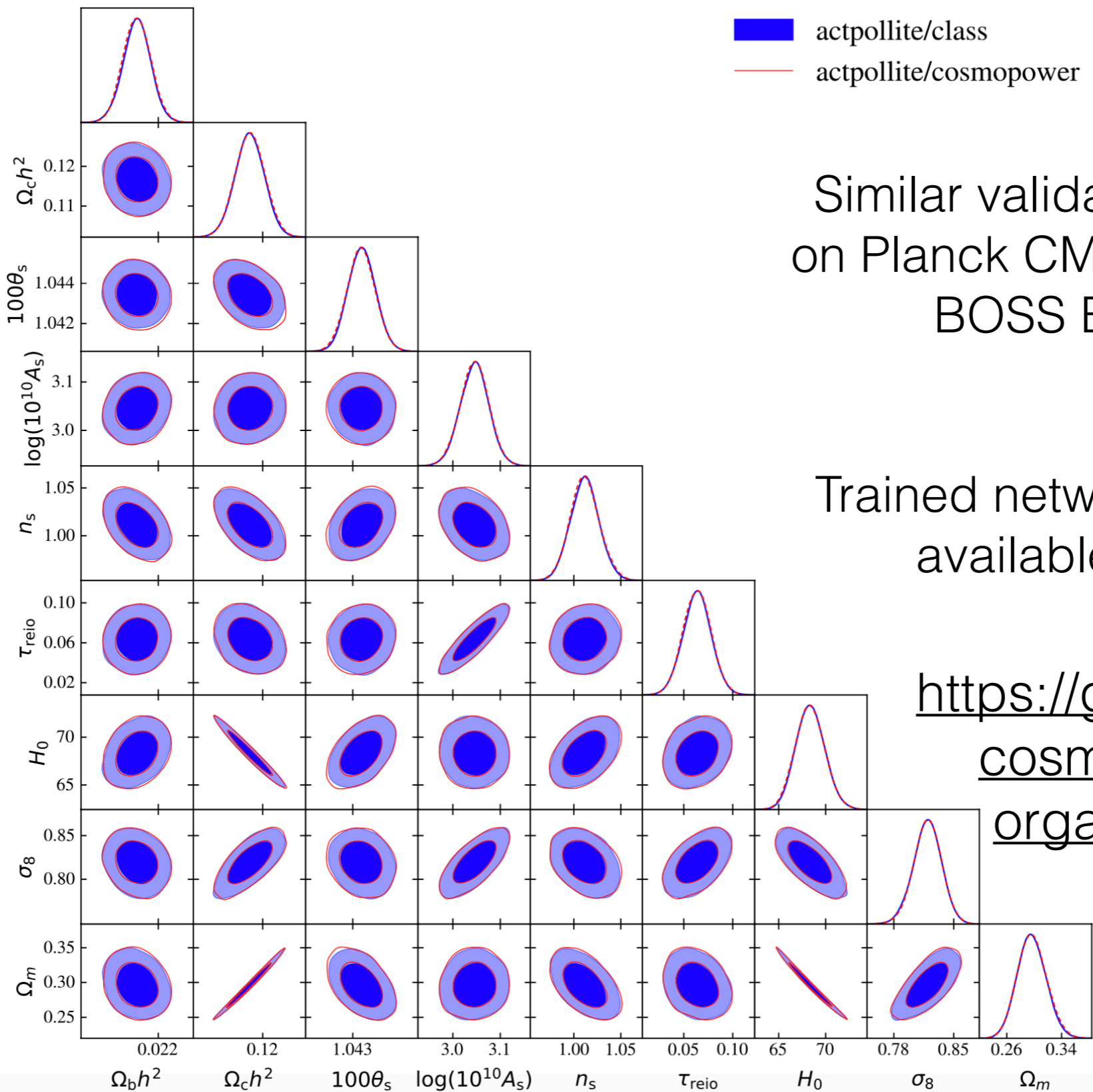
- Factor of 100-1000 speedup per Boltzmann call in MCMC runs
- NNs are fully differentiable: can be used in gradient-based inference
- Can be run on GPUs for further acceleration

Models run thus far (128,000 parameter sets each):

Λ CDM, $+N_{\text{eff}}$, $+M_{\nu}$, $+w$

ACT DR4 Λ CDM Reproduction

~few minutes on laptop vs. ~few days on CCA cluster (!)



■ actpollite/class
— actpollite/cosmopower

Similar validation performed on Planck CMB, CMB lensing, BOSS BAO+RSD

Trained networks are publicly available via GitHub

<https://github.com/cosmopower-organization>

Follow-up paper in prep:
interface with Cobaya, Cosmology, Monte Python, etc.