# 21-cm cosmology



University of KwaZulu-Natal

- General forecasts for BINGO, FAST and SKA:
- Xiaodong Xu, Yin-Zhe Ma, Amanda Weltman, 2018, Physical Review D (Impact factor: 4.506), 97, 083504, Constraining the interaction between dark sectors with future HI intensity mapping observations
- M.-A. Bigot-Sazy, Y.-Z. Ma, R. A. Battye, I. W. A. Browne, T. Chen, C. Dickinson, S. Harper, B. Maffei, L. C. Olivari, P. N. Wilkinson, 2016, Astronomical Society of the Pacific Conference Series, 502, 41–48 (8 pages), HI Intensity Mapping with FAST
- L. C. Olivari, C. Dickinson, R. A. Battye, Y.-Z. Ma, A. A. Costa, M. Remazeilles and S. Harper, 2018, Monthly Notices of the Royal Astronomical Society (Impact factor: 4.952), 473, 4242– 4256, Cosmological parameter forecasts for H I intensity mapping experiments using the angular power spectrum
- Yi-Chao Li, Yin-Zhe Ma, 2017, Physical Review D (Impact factor: 4.506) 96, 063525 Constraints on Primordial non-Gaussianity from Future HI Intensity Mapping Experiments
- Specific forecasts for SKA:
- Stuart Harper, Clive Dickinson, Richard Battye, Sambit Roychowdhury, Ian Browne, Yin-Zhe Ma, Lucas Olivari, Tianyue Chen, 2018, MNRAS, 478, 2416, "Impact of Simulated 1/f Noise for HI Intensity Mapping Experiments"
- Santos et al., 1709.06099
- Specific forecasts for BINGO:
- Marie-anne Bigot-Sazy, Clive Dickinson, Richard A. Battye, Ian Browne, Yin-Zhe Ma, Bruno Maffei, Fabio Noviello, Mathieu Remazeilles, Peter Wilkinson, 2015, Monthly Notice of Royal Astronomical Society (Impact factor: 4.952), 454, 3240 (14 pages) Simulations for single-dish intensity mapping experiments
- Battye et al., 1610.06826







# The spin temperature is an interpolation between CMB temperature and gas temperature





Fraction of neutral hydrogen, gas density, los velocity gradient, spin temperature

Very rich physics, the trick is to effectively modeling the whole process (21cmFast)



- Dark energy equation of the state
- Epoch of reionization
- Cosmological parameters
- Cross-correlation with other optical surveys
- Structure formation
- Missing baryon problems
- HI bias

- 21-cm cosmology
- Challenges
- Machine learning aspects
- Cross-correlation with cosmic fields

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99 per cent of the Cosmology is to measure: (information ascending)(1)Abundance of the light elements(2)Cosmic Expansion(3)Growth of perturbations







$$\begin{aligned} \Delta_{T_{\mathrm{b}},\ell}(\mathbf{k},z) &= \Delta_{T_{\mathrm{b}},\ell}^{(1)}(\mathbf{k},z) + \Delta_{T_{\mathrm{b}},\ell}^{(2)}(\mathbf{k},z) + \Delta_{T_{\mathrm{b}},\ell}^{(3)}(\mathbf{k},z) + \Delta_{T_{\mathrm{b}},\ell}^{(4)}(\mathbf{k},z) + \Delta_{T_{\mathrm{b}},\ell}^{(5)}(\mathbf{k},z) \\ &= \left(\tilde{\delta}_{n} + \frac{1}{\mathcal{H}}\dot{\tilde{\phi}} + \tilde{\psi}\right) j_{\ell}(k\chi) + \frac{1}{\mathcal{H}}\tilde{v}(\mathbf{k})kj_{\ell}''(k\chi) \\ &- \left(\frac{1}{\mathcal{H}}\frac{\mathrm{d}\ln(a^{3}\bar{n}_{\mathrm{HI}})}{\mathrm{d}\eta} - \frac{\dot{\mathcal{H}}}{\mathcal{H}^{2}} - 2\right) \times \left[\tilde{\psi}j_{\ell}(k\chi) + \tilde{v}(\mathbf{k})j_{\ell}'(k\chi) + \int_{0}^{\chi}(\dot{\tilde{\phi}} + \dot{\tilde{\psi}})j_{\ell}(k\chi')\mathrm{d}\chi'\right] \end{aligned}$$

$$\Delta_{T_b,l}^W(\mathbf{k}) = \int_0^\infty \mathrm{d}z W(z) \Delta_{T_b,l}(\mathbf{k},z)$$

$$\dot{\Delta}_{T_b,l}^{\dot{W}}(k) \equiv \Delta_{T_b,l}^{W}(\mathbf{k}) / \mathcal{R}(\mathbf{k})$$

$$C_l^{WW'} = 4\pi \int \mathrm{d}\ln k \,\mathcal{P}_{\mathcal{R}}(k) \Delta_{T_b,l}^W(k) \Delta_{T_b,l}^{W'}(k)$$



- 21-cm cosmology
- Challenges
- (1) featureless power spectrum
- (2) very high foreground
- (3) Various systematics
- Machine learning aspects
- Cross-correlation with cosmic fields





## Hydrogen intensity signal

Amplitude 1 mK, lots of spectral structure



Simulated 21 cm signal, tracer of  $\rho HI(\theta, z)$ :  $\Delta T \sim 1$  mK

*left* - over full sky at 400 MHz, *right* - over 50 MHz at 1 declination Main goal is to measure BAO structure in *PHI(k)*, less concerned about amplitude of *PHI(k)*.

### The "other" signal: synchrotron (primarily)

Amplitude 700 K, spectrally smooth



### Modeled Galaxy signal, ΔT ~ 700 K! *left* - over full sky at 400 MHz, *right* - over 50 MHz at 1 declination - spectrally smooth

# Noise:

- 1. uncorrelated noise white noise
- correlated noise in time and frequency 1/f noise
- 3. Atmospheric noise

## Systematic effect:

- 1. sidelobes: near, intermediate, far (mode mixing)
- 2. band-pass calibration
- 3. Ground spilled over
- 4. Cross polarization
- 5. beam ellipticity ....

Without those details, radio cosmology is an unrealistic dream.



### **Component separation: PCA**

$$C_{ij} = \frac{1}{N_p} SS^{T} = \frac{1}{N_p} \sum_{p=1}^{N_p} T(\mathbf{v}_i, \hat{n}_p) T(\mathbf{v}_j, \hat{n}_p) \qquad \qquad R_{jk} = \frac{C_{jk}}{C_{jj}^{1/2} C_{kk}^{1/2}}$$

 $P^{T}RP = \Lambda \equiv \operatorname{diag} \{\lambda_{1}, ..., \lambda_{N_{f}}\} \qquad \phi = P_{c}^{T}S \qquad S_{c} = P_{c}\phi \qquad S_{\mathrm{HI}} = S - S_{c}$ 







**1/f noise:** Correlated fluctuation in time Fluctuations across spectrum, i.e. spectroscopic noise 
$$PSD(f, \omega) = \frac{T_{sys}^2}{\delta \nu} \left[ 1 + C(\beta, N_v) \left(\frac{f_k}{f}\right)^{\alpha} \left(\frac{1}{\omega \Delta \nu}\right)^{\frac{1-\beta}{\beta}} \right]$$

 $\boldsymbol{\omega}$  is the inverse spectroscopic frequency wavenumber

S. Harper,

	Description	Parameter	Value
	Dish Diameter	D <sub>dish</sub>	$15 \mathrm{m}^a$
	No. Dishes	N <sub>dish</sub>	200
	Receiver + CMB	$T_{\rm CMB} + T_{\rm rx}$	$20 \mathrm{K}^b$
	No. Polarimeters	N <sub>pol</sub>	2
SKA forecast.	No. Channels	$\hat{N}_{v}$	23
SKA TUPECASL.	Bandwidth	Δν	$950 < \nu < 1410\text{MHz}$
	Channel width	δν	20 MHz
	Sample Rate	$f_{\rm sr}$	4 Hz
	Integration Time	T <sub>obs</sub>	30 days
Y7M 2018 MNRAS	Elevation	E	55 deg
, 1201, 2010, 101000	Slew Speed	v <sub>t</sub>	$0.5 < v_t < 2.0  deg  s^{-1}$



(c)  $\beta = 0.75$ ,  $\alpha = 1$ ,  $f_k = 1$  Hz

(d)  $\beta = 1.0, \alpha = 1, f_k = 1 \text{ Hz}$ 









### Hydrogen Epoch of Reionzation Array (HERA)



- Radio Telescope dedicated to observing large scale structures prior and during the epoch of reionization.
- Full HERA-350 will be comprised of 14 meter parabolic dish of 320 forming a Hexagonal core and 30 outriggers, observing at
  50MHz-250MHz, located SKA site, Karoor, South Africa.
- Currently, HERA consist of 47 antennas observing at 100MHz-200MHz.
- On the left is HERA-19. [https:// reionization.org/]

### Quasi-Redundant Calibration of HERA-47 : Internal Data Release 1 (IDR1; JD 2458042)

Measurement Equation  $C = a^* a a + b^* a$ 

 $C_{ij} = g_i^* g_j s_{ij} + n_{ij}$ 

We calibrate HERA-47 using **redundant** baseline scheme, which assume that identical baseline see same sky signal .

Unfortunately, in real life, variations due antenna primary beams and antenna location misplacement, the perfect redundant configuration breaks. This can be resolved by computation of the **expected sky covariance** between baselines with a redundant set. This allows the inclusion of the **instrument model** and **bright sources** with known positions. This calibration scheme is called **correlation calibration** 



# Machine learning aspects

- Characterize the 21-cm tomography field (theory)
- Calibrate the interferometer (technology)



**zeta** - the ionizing efficiency of high-z galaxies

**R**<sub>mfp</sub> - the max horizon for ionizing photons, set by recombining systems

T<sub>vir</sub> - the minimum halo virial temperature hosting star-forming galaxies

L<sub>X</sub> / SFR - the <2keV X-ray luminosity (per unit star formation) of high-z galaxies

**N<sub>HI</sub>** (or *E*<sub>0</sub>) - the HI column density (or corresponding photon energy) of host galaxies, responsible for absorbing X-rays

**alpha\_x** - the X-ray spectral energy index of high-z galaxies



# People in UKZN groups

- Cheng Cheng (Joint postdoc at Tsinghua U/Beijing): Machine learning in 21-cm tomography
- Devin Crichton (postdoc): HIRAX, instrumentation
- We-Ming Dai (postdoc): single-dish intensity mapping, interferometry, reconstruction of reionisation history
- Matt Hilton (faculty): galaxy clusters, LSST
- Yi-Chao Li (former postdoc, now UWC): experimental characterization of MeerKAT
- Yin-Zhe Ma (faculty): 21-cm cosmology, theory and observations
- Kavilan Moodley (faculty): 21-cm cosmology, weak lensing
- Mthokozisi Mdlalose: Quasi-redundant baseline calibration
- Denis Tramonte (postdoc): HI stacking from Parkes and GBT
- Anthony Walters (postdoc): Fast radio Burst
- Elimboto Yohana (PhD Stu.): single-dish intensity mapping pipeline, FAST

### 2016 BRICS Pilot call:

		Brazil	Russia		India China		South Africa		
	Thematic areas	CNPq	FASIE	MON	RFBR	DST	MOST	NSFC	NRF
а	Prevention and monitoring of natural disasters	V	V	V	V	V	V		V
b	Water resources and pollution treatment	V	V	V	V	V		V	V
с	Geospatial technology and its applications	V	V	V	V	V	V		V
d	New and renewable energy, and energy efficiency	V	V	V	V	V	V		V
е	Astronomy		v	V	V	V		V	V
f	Biotechnology and biomedicine including human health and neuroscience	V	V	V	V	V		V	V

### BRICS submitted proposal: (3—5 years project) 21-cm cosmology and large-scale structure of the Universe

### Combination: 4,5,6,15 of the proposed project

Organization, Division Name Title Degree Speciality Astronomy and Cosmology Cosmology, Yin-Zhe Ma Research Unit, University of Dr. PhD Computational KwaZulu-Natal Astrophysics Galaxy Department of Astronomy, Romeel Dave PhD Prof. formation. University of Western Cape Cosmology Radio Department of Astronomy, Mario Santos Prof. PhD astronomy. University of Western Cape cosmology Theoretical Astronomy and Cosmology Kavilan and Research Unit, University of PhD Prof. Moodley observatoinal KwaZulu-Natal cosmology Jonathan Astronomy and Cosmology Radio Sievers Research Unit, University of Prof. PhD astronomy, KwaZulu-Natal cosmology Aroonkumar University of Zululand Prof. PhD Theoretical Beesham Cosmology

#### South Africa:

China:	Name	Organization, Division	Title	Degree	Speciality
	Xuelei Chen	National Astronomical Observatory, Chinese Academy of Sciences	Prof.	PhD	Radio astronomoy, cosmology
	Yan Gong	National Astronomical Observatory, Chinese Academy of Sciences	Prof.	PhD	Cosmology, optical astronomy
	Yi Mao	Department of Physics, Tsinghua University	Assoc. Prof.	PhD	Epoch of reionization, cosmology, computational astrophysics
	Yi-dong Xu	National Astronomical Observatory, Chinese Academy of Sciences	Assoc. Prof.	PhD	Epoch of reionization, cosmology, computational astrophysics

India:

Name	Organization, Division	Title	Degree	Speciality
Tirthankar Roy Choudhury	National Centre for Radio Astrophysics, Tata Institute for Fundamental Research	Prof.	PhD	Theoretical cosmology, Intergalactic medium, Epoch of reionization
Neeraj Gupta	Inter-University Centre for Astronomy and Astrophysics (IUCAA), Pune University Campus	Prof.	PhD	Observational cosmology, Low- frequency observations, Neutral hydrogen, High-z absorption systems
Kanan K. Datta	Presidency University	Prof.	PhD	Epoch of reionization, HI intensity mapping
Tapomoy Guha Sarkar	Birla Institute of Technology and Science Pilani	Prof.	PhD	Theoretical cosmology, HI intensity mapping

#### Russia:

Name	Organization, Division	Title	Degree	Speciality
Alexandre Ivanchik	Department of Theoretical Astrophysics, loffe Physical- Technical Institute	Prof.	PhD	Cosmology
Sergei Balashev	Department of Theoretical Astrophysics, loffe Physical- Technical Institute	Dr.	PhD	Cosmology
Dmitry Varshalovich	Department of Theoretical Astrophysics, loffe Physical- Technical Institute	Prof., Academician of RAS	PhD	Cosmology
Viacheslav Klimenko	Department of Theoretical Astrophysics, loffe Physical- Technical Institute	Dr.	PhD	Cosmology

Name	Organization, Division	Title	Degree	Speciality
Elicio Abdalla	University of Sao Paulo, Institute of Physics	Prof.	PhD	Cosmology
Carlos Alexander Wuensche	INPE, Sao Jose de campus	Dr.	PhD	Radio Astronomy
Michael Peel	INPE, Sao Jose de campus	Dr.	PhD	Radio Astronomy

# Plan of work:

- Building new models of Epoch of Reionization, and investigating evolution of HI over cosmic time
- Cross-correlation of 21-cm with other cosmic fields
- Subtraction of foreground for 21-cm signal.
- Calibration of telescope systematics



## Results: 2016 pilot call

Thank you for the time and effort you took to participate in the BRICS Multilateral Joint Science and Technology Research call.

Funding applications for this instrument were extremely competitive with many high quality proposals. The adjudication process was intense and only proposals that achieved a high ranking according to the designated assessment scorecard were supported. Due to the high number of applications, competitiveness of the programme, alignment with BRICS objectives and budgetary constraints, not all deserving applications were selected for funding.

Review panel comments:

- This is an excellent and innovative project with significant potential for exploitation or commercialisation.
- There is a clear plan for student exchange and their names have been provided. However, there is no other source of funding.

Based on the above remarks, the local panel recommended that this proposal be funded. However, the proposal was not recommended for funding by the Joint Technical Committee (JTC). A very limited number of applications were recommended. The JTC makes a final decision on proposals to be funded.

#### Please note:

- Cooperation projects with the potential to be sustained beyond the funding period will be favourably considered.
- Only joint proposals that involve at **least three or more** partners from the BRICS countries will be considered for funding.

But each country evaluates its own proposal. The problem can arise from here.

	Country A	Country B	Country C	Country D
Project 1	1	1	4	N/A
Project 2	3	3	2	N/A
Project 3	4	4	1	N/A
Project 4	2	2	2	Evaluated

Please could you tell me which project should be funded?

Since the project is a joint project, it should be required to submit one joint proposal with all partner countries' contribution, and being evaluation at one unique, joint committee.