



# The Square Kilometre Array Massive Data Challenges at the Frontiers of Astronomy, Physics, & Astrobiology

Joseph Lazio

Project Scientist, SKA Program  
Development Office

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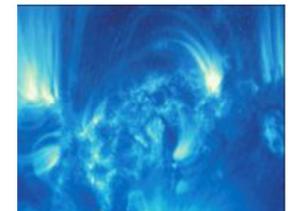
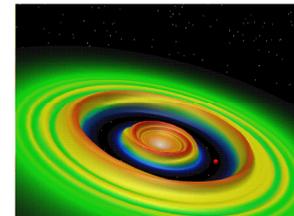
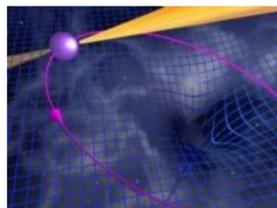
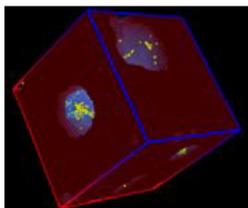
Jet Propulsion Laboratory, California  
Institute of Technology

# Square Kilometre Array



## The Global Radio Wavelength Observatory

- Originally: “Hydrogen telescope”  
Detect H I 21-cm emission from Milky Way-like galaxy at  $z \sim 1$
- SKA science much broader  
⇒ Multi-wavelength, multi-messenger
- On-going technical development  
➤ Cyber-infrastructure and “big data”
- International involvement



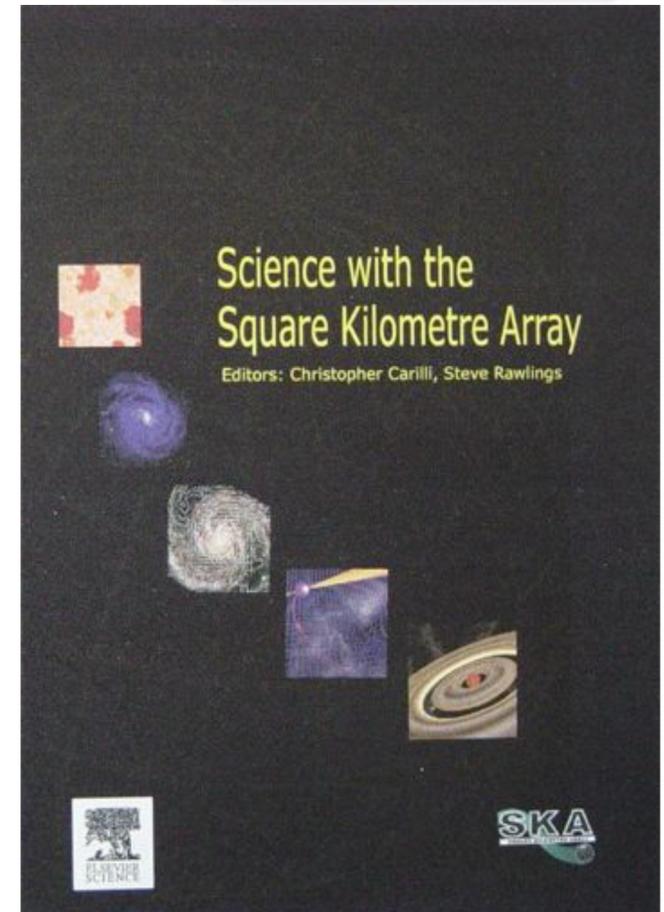
# SKA Key Science



International working group

- Strong-field Tests of Gravity with Pulsars and Black Holes
- Galaxy Evolution, Cosmology, & Dark Energy
- Emerging from the Dark Ages and the Epoch of Reionization
- The Cradle of Life & Astrobiology
- The Origin and Evolution of Cosmic Magnetism

With design philosophy of *Exploration of the Unknown*



*Science with the Square Kilometre Array* (2004, eds. Carilli & Rawlings, *New Astron. Rev.*, 48)

# SKA and the U.S.



*New Worlds, New Horizons in Astronomy & Astrophysics* Decadal Survey conducted by National Research Council

- *A Future Radio-Millimeter-Submillimeter System*

- ... A second principle is provision for the long term future through a staged program leading towards major participation in all three components of the international Square Kilometer Array, which has enormous scientific potential and enthusiastic support around the globe.

- Recommendations for New Ground-Based Activities—Large Projects

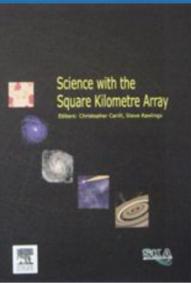
- Priority 2 (Large, Ground). Mid-Scale Innovations Program* [2 of 8 possible initiatives, alphabetical order]

- Hydrogen Epoch of Reionization Array (HERA)  
Could evolve into low frequency component of SKA
    - North American Nanohertz Observatory for Gravitational Waves (NANOGrav)  
Could evolve into intermediate frequency component of SKA

# NWNH Science Program and the SKA



|                                       |  |   |
|---------------------------------------|--|---|
| <b>Discovery</b>                      | Gravitational wave astronomy   | “Strong-field Probes of Gravity with Pulsars and Black Holes” |
|                                       | Epoch of Reionization  | “Emerging from the Dark Ages and the Epoch of Reionization”   |
| <b>Origins</b>                        | <i>What were the first objects to light up the Universe and when did they do it?</i>         | “Emerging from the Dark Ages and Epoch of Reionization”       |
|                                       | <i>How do circumstellar disks evolve and form planetary systems?</i>                         | “The Cradle of Life and Astrobiology”                         |
| <b>Understanding the Cosmic Order</b> | <i>How do baryons cycle in and out of galaxies and what do they do while they are there?</i> | “Galaxy Evolution, Cosmology, and Dark Energy”                |
| <b>Frontiers of Knowledge</b>         | <i>What controls the masses, spins and radii of compact stellar remnants?</i>                | “Strong-field Probes of Gravity with Pulsars and Black Holes” |



# 21<sup>st</sup> Century Astrophysics



**20<sup>th</sup> Century:** We discovered our place in the Universe.

**21<sup>st</sup> Century:** We understand the Universe we inhabit.

## Cosmology & Fundamental Physics

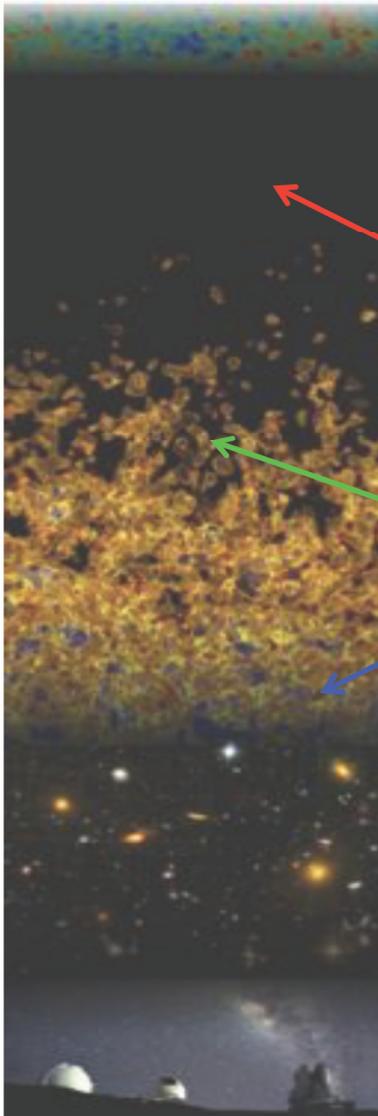
- Gravity
  - Can we observe strong gravity in action?
  - What is dark matter and dark energy? (dark energy and BAOs with H I galaxies)
- Magnetism
- Strong force
  - Nuclear equation of state

## Galaxies Across Cosmic Time, The Galactic Neighborhood, Stellar and Planetary Formation

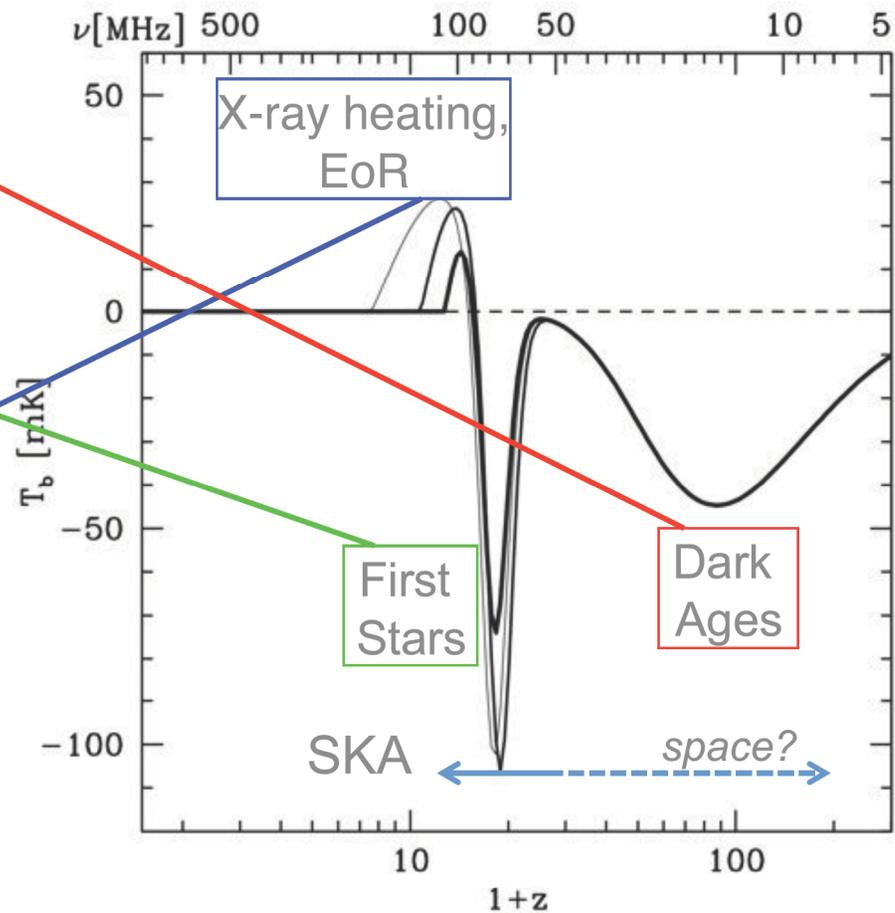
- Galaxies and the Universe
  - How did the Universe emerge from its Dark Ages?
  - How did the structure of the cosmic web evolve?
  - Where are most of the metals throughout cosmic time?
  - How were galaxies assembled?
- Stars, Planets, and Life
  - How do planetary systems form and evolve?
  - What is the life-cycle of the interstellar medium and stars? (biomolecules)
  - Is there evidence for life on exoplanets? (SETI)

Exploring the Universe with the world's largest radio telescope

# Evolution of the Universe



H I brightness temperature signal  
(w.r.t. CMB)



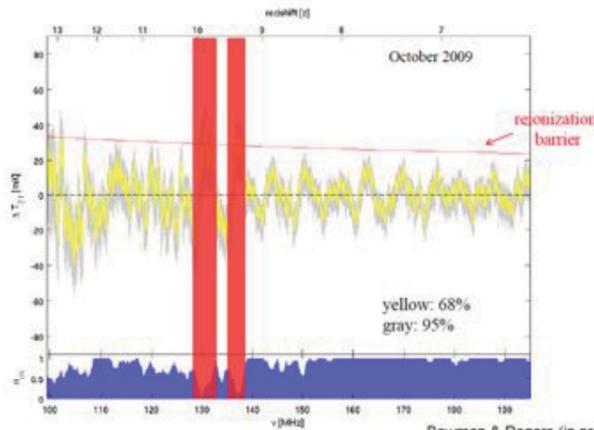
(Pritchard & Loeb 2008)

# Evolution of the Universe

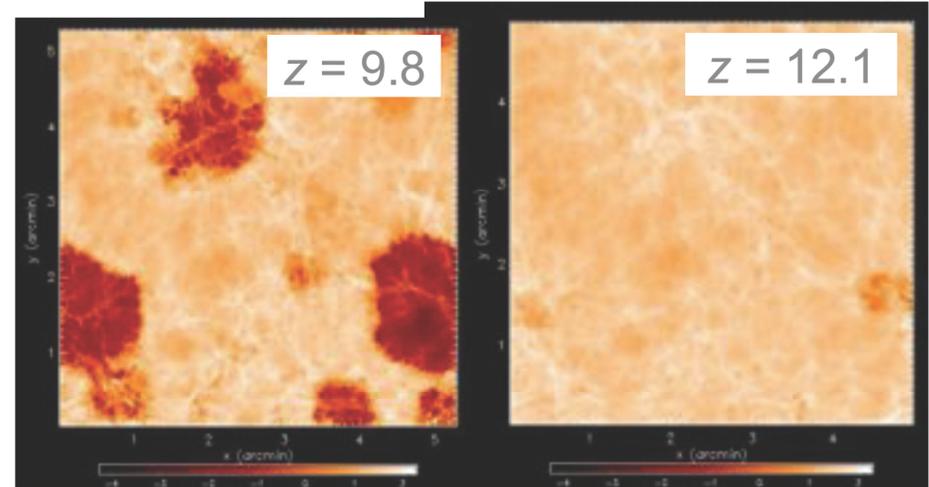
## Epoch of Reionization



Confidence intervals on  $\Delta T_{21}$  with fixed  $\alpha = \infty$

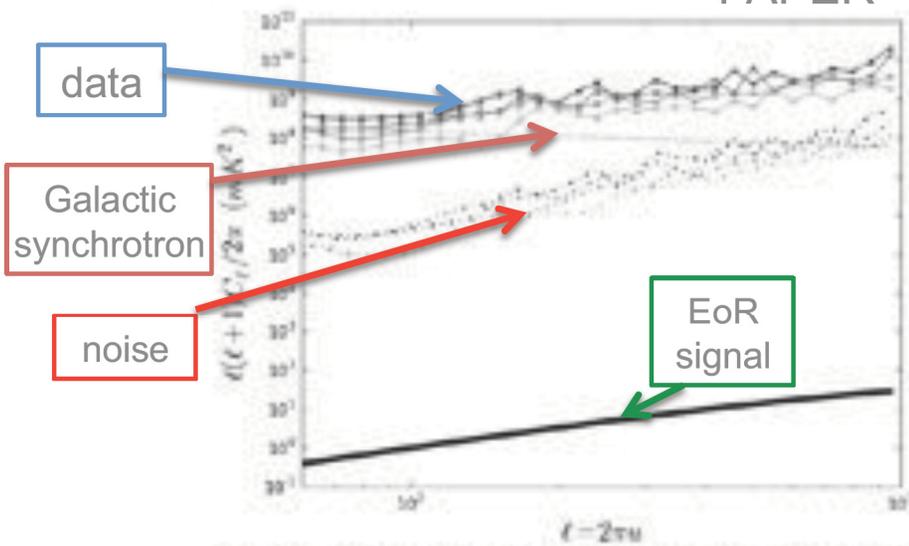


EDGES  
(Bowman et al. 2008)

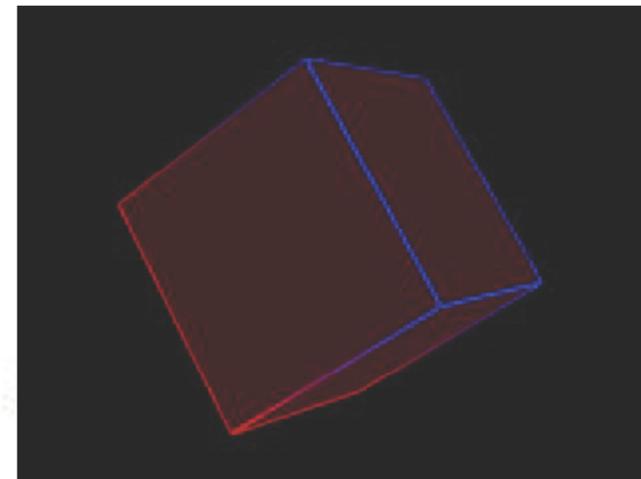


SKA objective: Image the IGM transition  
in the H I (21-cm) line

PAPER



Parsons et al. 2009; arXiv:0904.2334



Furlanetto et al.; Gnedin

# Galaxy Assembly

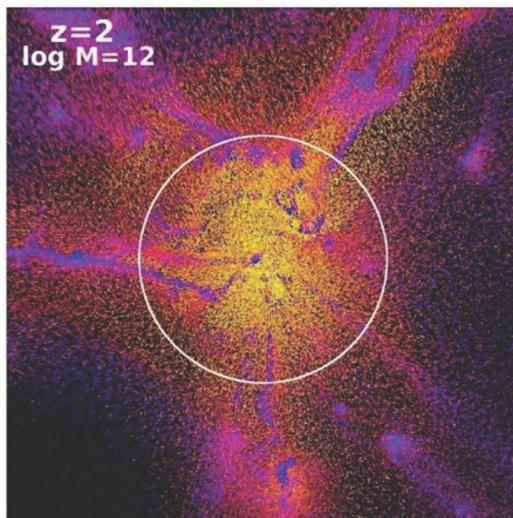
## Stars *and* Gas



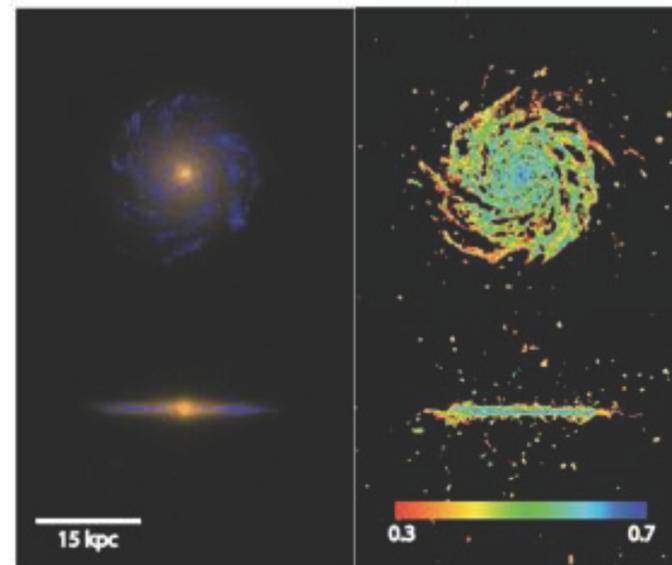
- Gas content and dynamics becoming critical part of simulations.
  - N-body simulations themselves can lead to data challenges!
- Astronomy is an *observational* science.
- Need **observations** of gas content —**over cosmic time**— to understand galaxy formation!



observation vs. simulation



Keres et al.

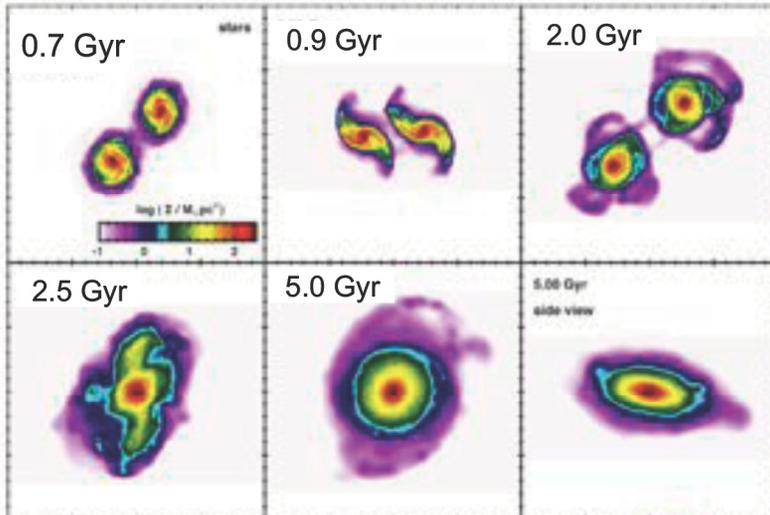


Eris simulation  
(Guedes et al.)  
NGC 6946 (T.  
Oosterloo)

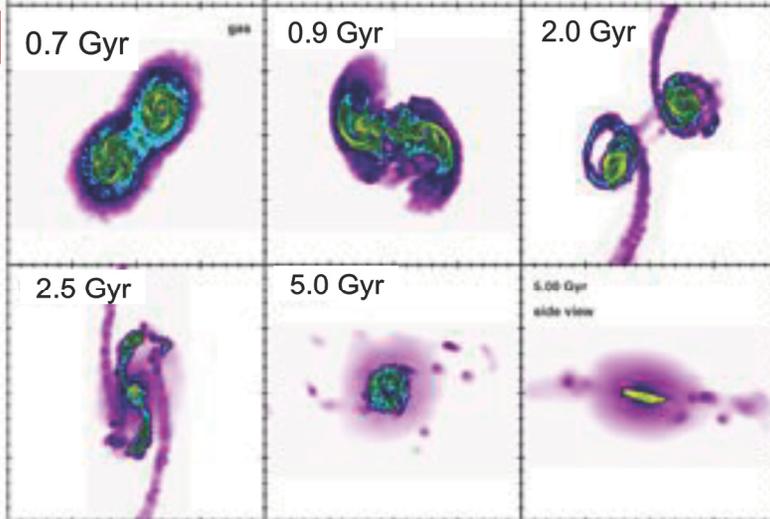
# Galaxy Assembly The Role of Mergers



stars



gas



(Moster et al. arXiv:1104.0246)



- Mergers are recognized as important aspect of galaxy evolution and formation
- Gas can be sensitive tracer of interactions, long after original event took place

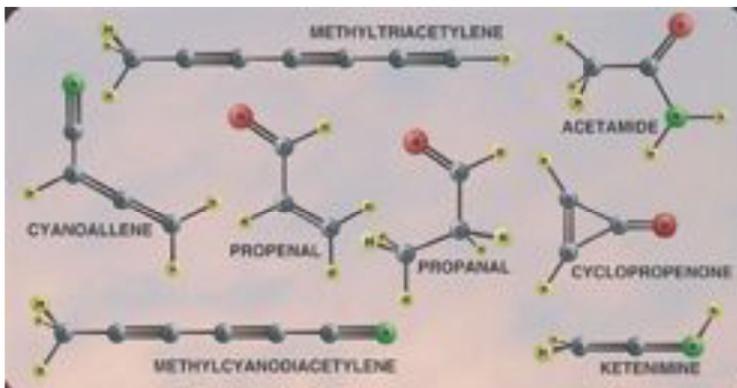
E.g., Holwerda et al. with THINGS

# Astrobiology at Long Wavelengths

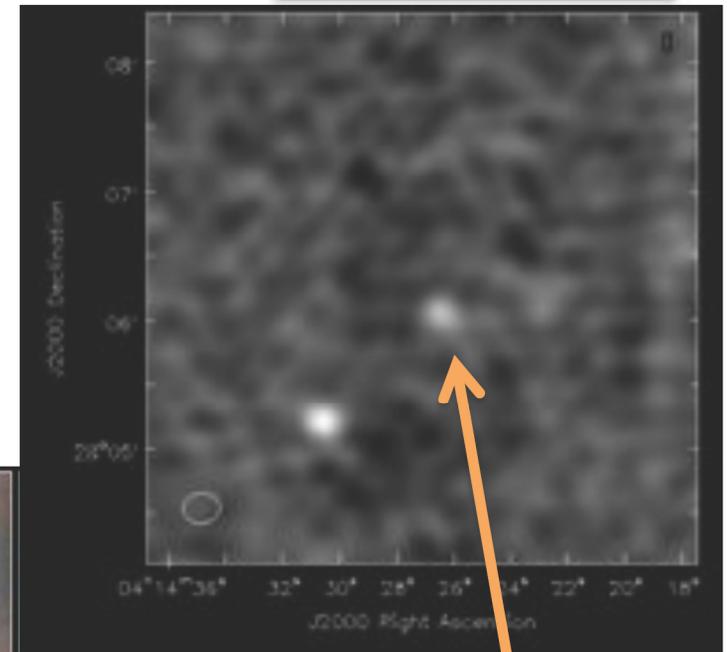


$\lambda > 1 \text{ cm}$

- Not affected by dust
- Complex molecules have transitions at longer wavelengths
- “Waterhole” (1.4–1.7 GHz)
- Magnetically-generated emissions from extrasolar planets



Complex organic molecules detected at radio wavelengths



EVLA 6 cm observations of protoplanetary disks; PEBBLES on e-MERLIN coming soon

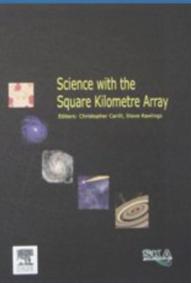


Protoplanetary Disks  
Orion Nebula



HST · WFPC2

PRC95-45b · ST ScI OPO · November 20, 1995  
M. J. McCaughrean (MPIA), C. R. O'Dell (Rice University), NASA



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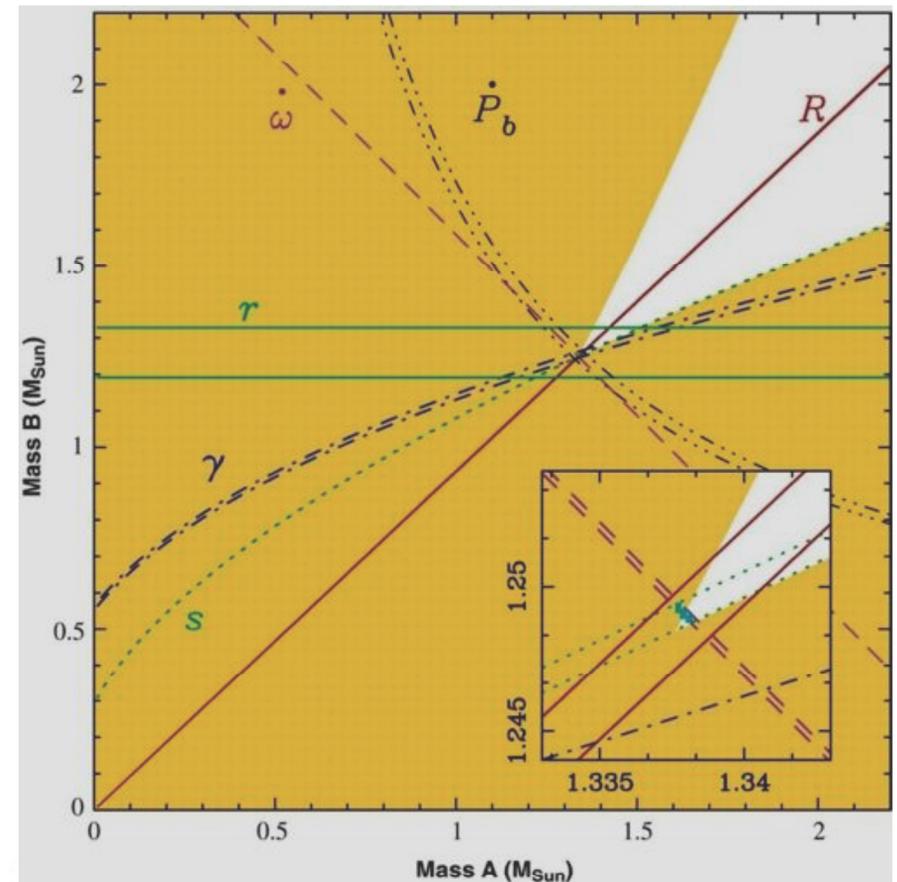
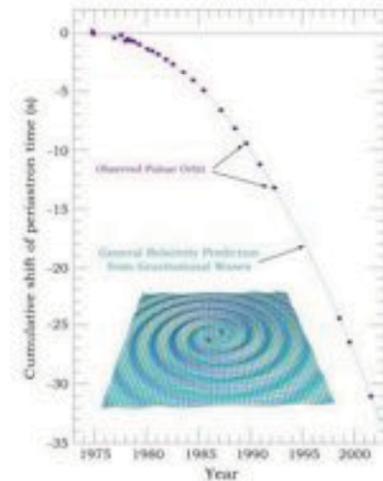
Exploring the Universe with the world's largest radio telescope

# Did Einstein Have the Last Word on Gravity?



$$G_{\mu\nu} + \Lambda g_{\mu\nu} = 8\pi G T_{\mu\nu} / c^4$$

PSR J0737-3039



Relativistic binaries probe

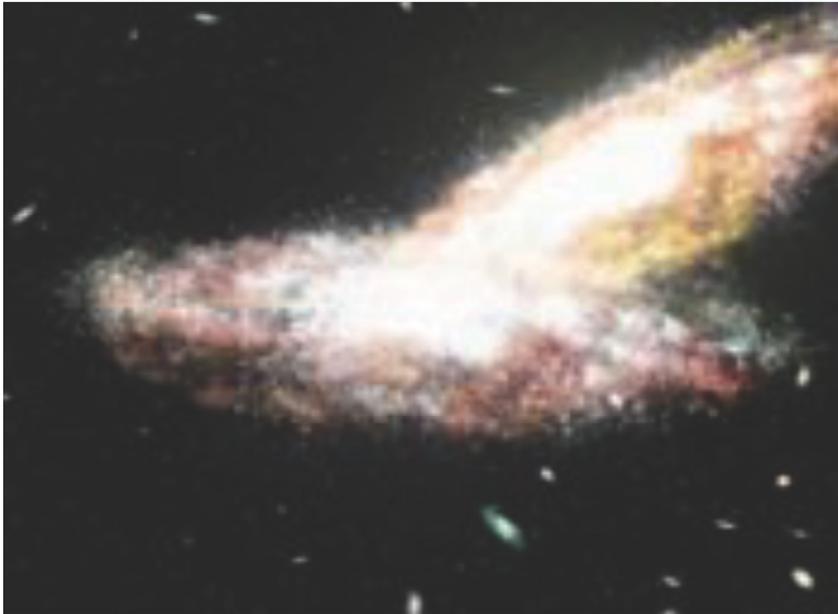
1. Equivalence principle
2. Strong-field tests of gravity

- Neutron star-neutron star and neutron star-white dwarf binaries known

? Black hole-neutron star binaries?

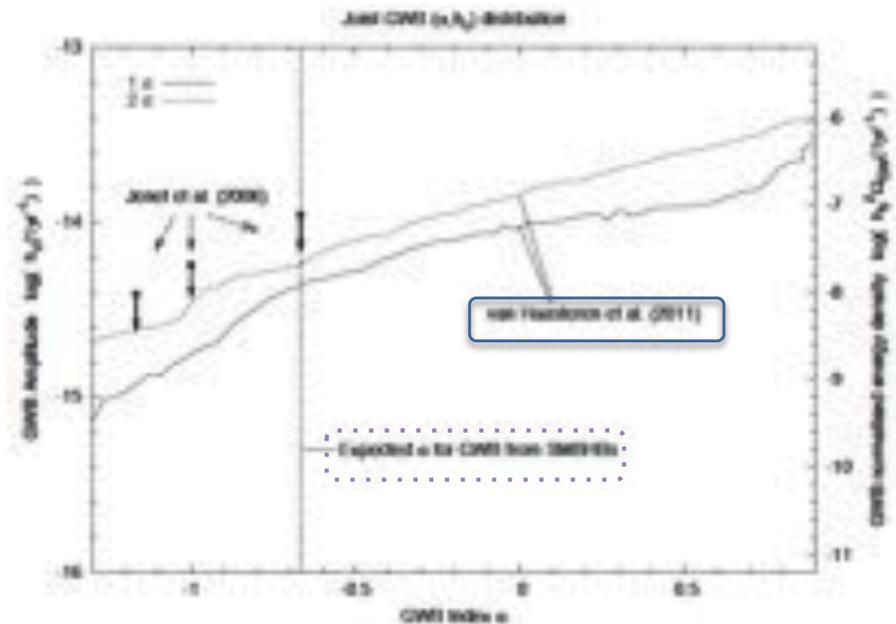
Kramer et al.

# SKA: Gravitational Wave Detector



Test masses on lever arm

- Pulsar Timing Array = freely-falling **millisecond** pulsars
- LIGO = suspended mirrors
- LISA = freely-falling masses in spacecraft



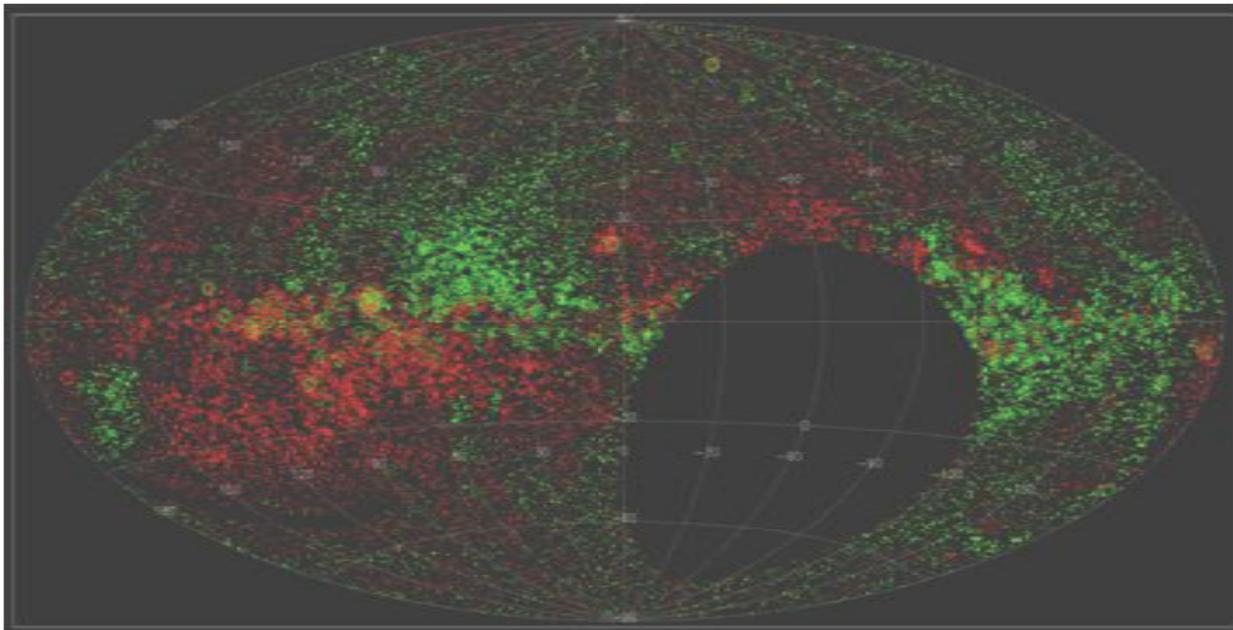
Pulsar timing arrays starting to provide results from ensemble of pulsars

- EPTA (van Haastern et al., *above*)
- PPTA (Yardley et al.)
- *NANOGrav (Demorest et al.)*

# Origin & Evolution of Cosmic Magnetic



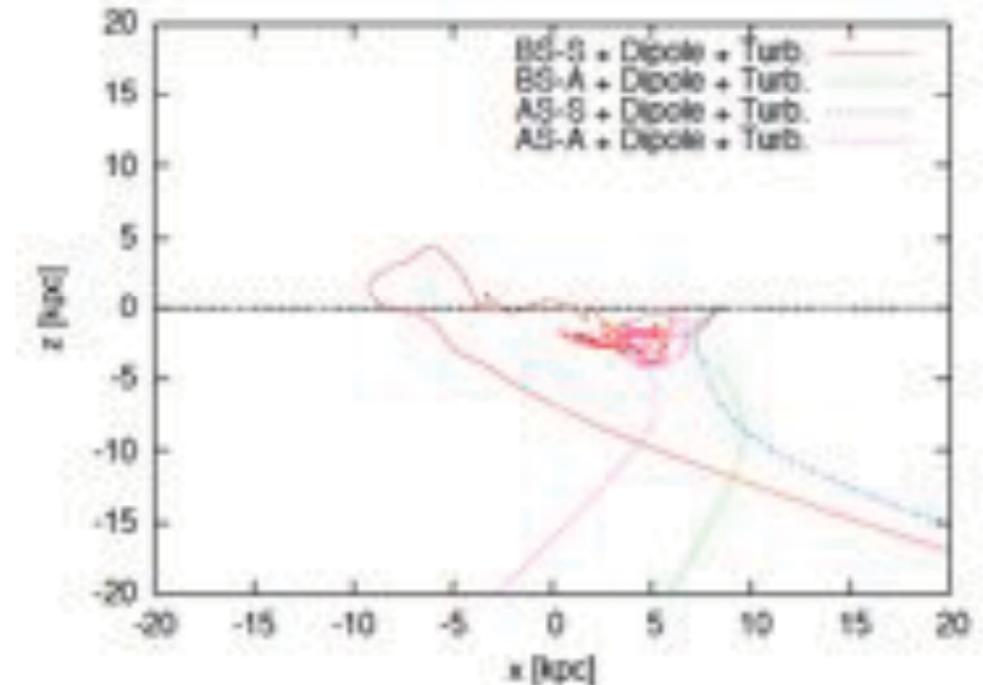
- Magnetic fields are fundamental, but poorly constrained
  - Affects galaxy, cluster evolution?
  - Affects propagation of cosmic rays in ISM and IGM
- All-sky rotation measure surveys provide **B** fields along lines of sight
- Continuum in I, Q, and U!



# Magnetic Fields and Cosmic Rays



- Are ultra-high energy cosmic rays (UHECRs) produced in nearby AGN?
- Galactic magnetic field influences cosmic ray propagation
- Different models of Galactic field imply different arrival directions
  - Axi-symmetric vs. bi-symmetric?
  - Field directions above and below the Galactic plane
  - Effect of turbulence?
  - ...?



Takami, arXiv:1104.0278

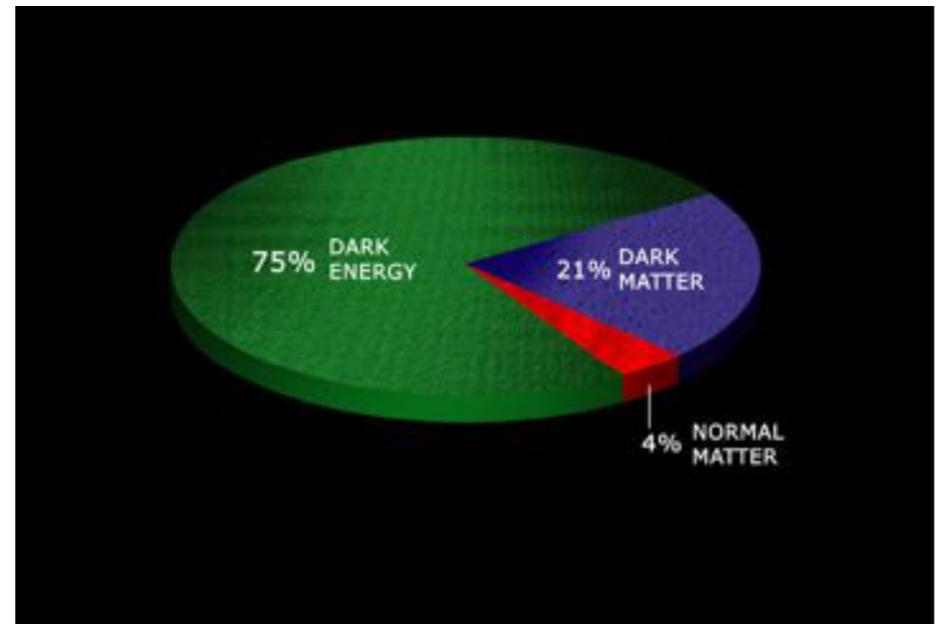
# Cosmology and Gravity



$$G_{\mu\nu} + \Lambda g_{\mu\nu} = 8\pi G T_{\mu\nu} / c^4$$

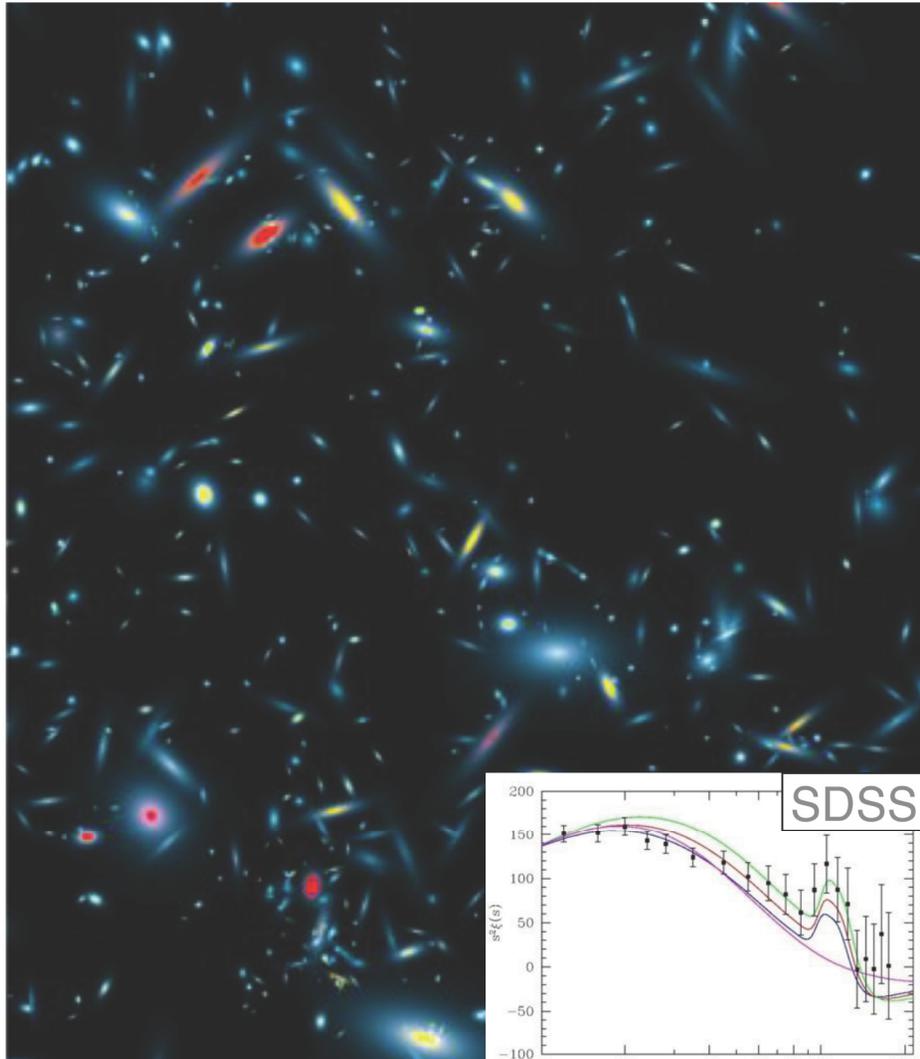
## Origin and Fate of the Universe

- Era of “precision cosmology”  
... or precision ignorance
- Need to sample a substantial volume of the Universe
- Volume  $\sim D^2 \Delta D \Omega$ 
  - D – distance;  $\Omega$  – solid angle
  - Surveying to larger D is difficult  
→ need larger telescopes  
“square kilometre” of SKA
  - Surveying larger sky areas  $\Omega$   
“just” requires more observing time



Composition of the Universe

# Cosmology and Sky Surveys



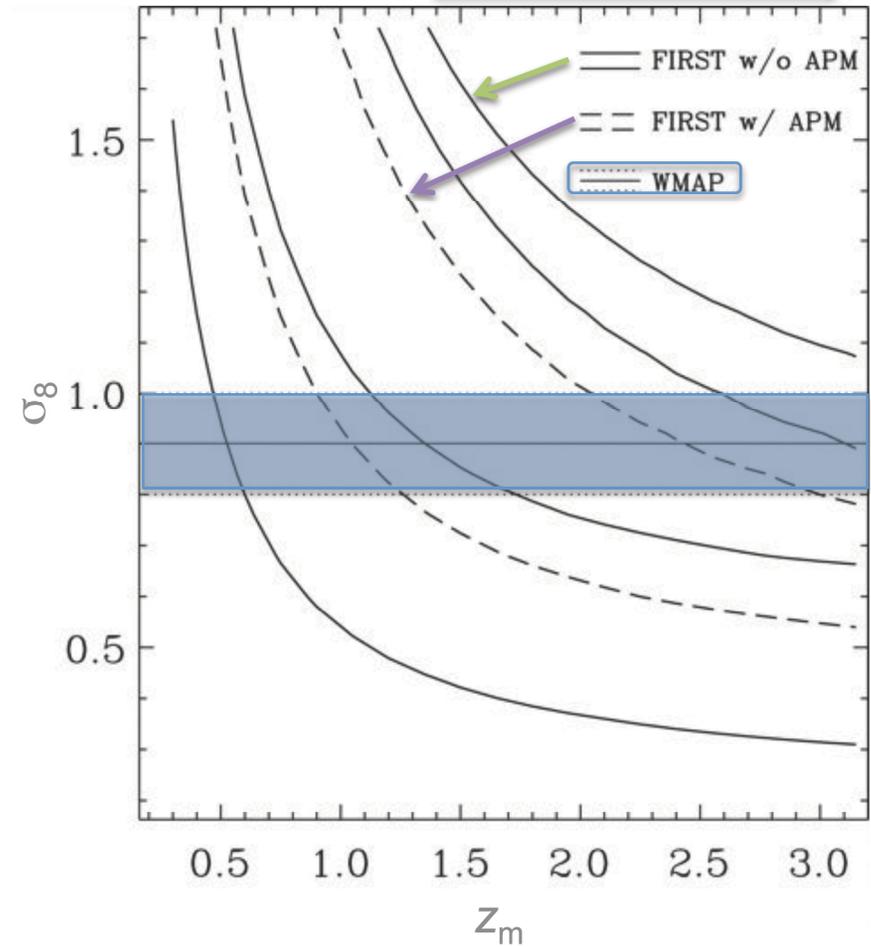
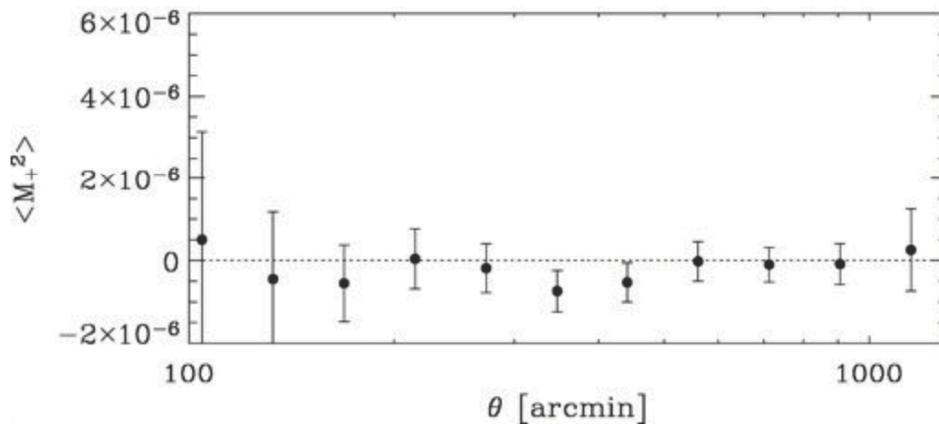
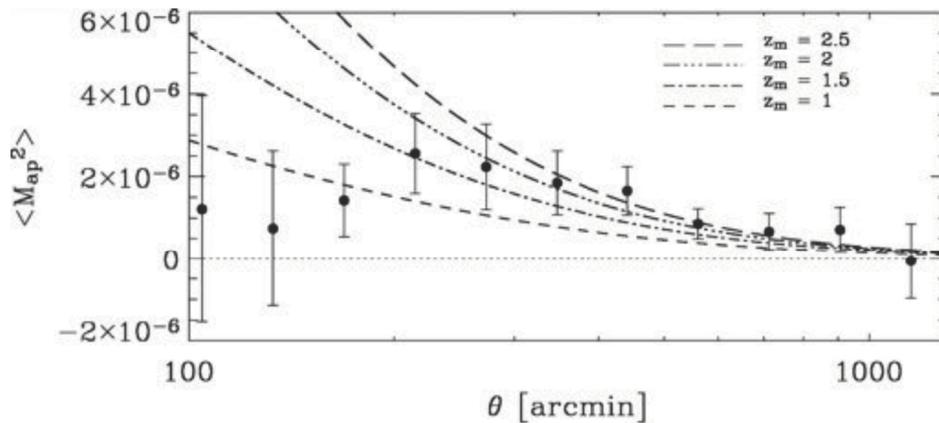
- Image the sky, locating galaxies  
Analysis of locations compared with cosmological models to constrain parameters
- Two broad classes of surveys
  - Continuum: e.g., NVSS, FIRST, ASKAP/EMU, WSRT/APERTIF/WODAN
  - Spectroscopic: SDSS, Arecibo ALFALFA, ASKAP/WALLABY, SKA *H I* survey  
Spectroscopic surveys locate in **3-D space!** very powerful
- Ultimate goal: spectroscopic survey of 1 billion galaxies

SKADS Simulated Sky

# Cosmology and Gravity



Detection of weak lensing (E modes) from FIRST (Chang et al.)



Radio observations should have fewer (different) systematics

# 21<sup>st</sup> Century Astrophysics



## Fundamental Forces and Particles

- Gravity
- Magnetism
- Strong force

## Origins

- Galaxies and the Universe
- Stars, Planets, and Life

“The Universe is patiently waiting for our wits to grow sharper.”

Photon frequency /  
wavelength / energy

Time

Polarization

Sensitivity

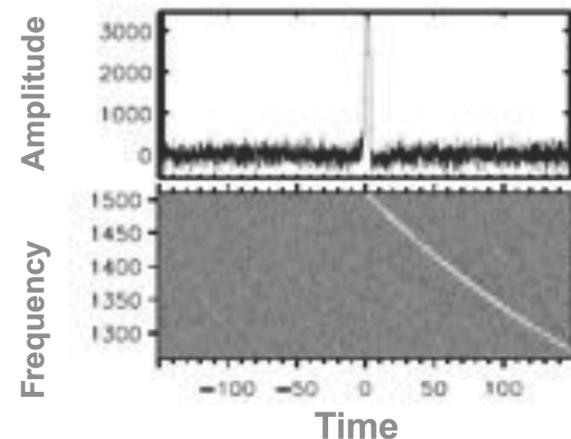
Field of View

Angular Resolution

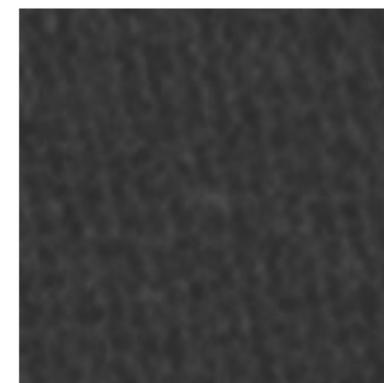
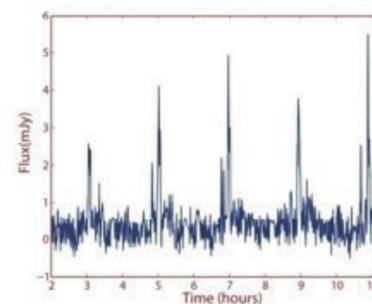
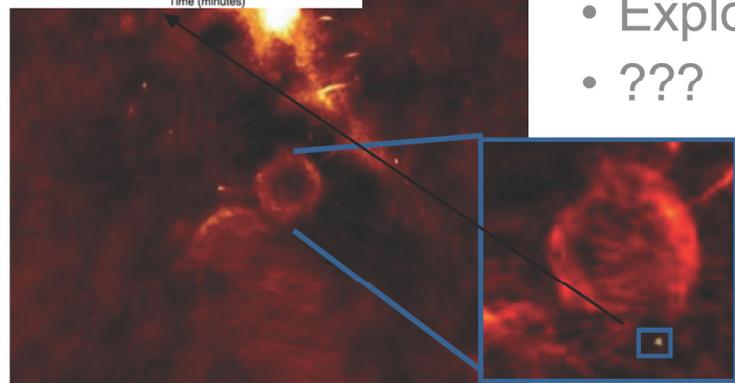
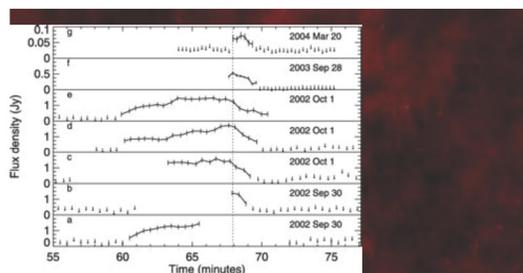
# The Dynamic Radio Sky



- Neutron stars
  - Magnetars
  - Giant pulses
  - Short GRBs?
- Microquasars
- Tidal Disruption Events
- GRBs ( $\gamma$ -ray loud;  $\gamma$ -ray quiet?)
  - Afterglows
  - Prompt emission?
- Sub-stellar objects
  - Brown dwarfs
  - Extrasolar planets?
- Scintillation
- GW counterparts
- UHECRs
- ETI
- Exploding black holes
- ???



Rotating Radio Transients (RRATS)



Pulsating Brown Dwarfs



# Imaging with Arrays



Fourier transform ( $u-v$ ) plane

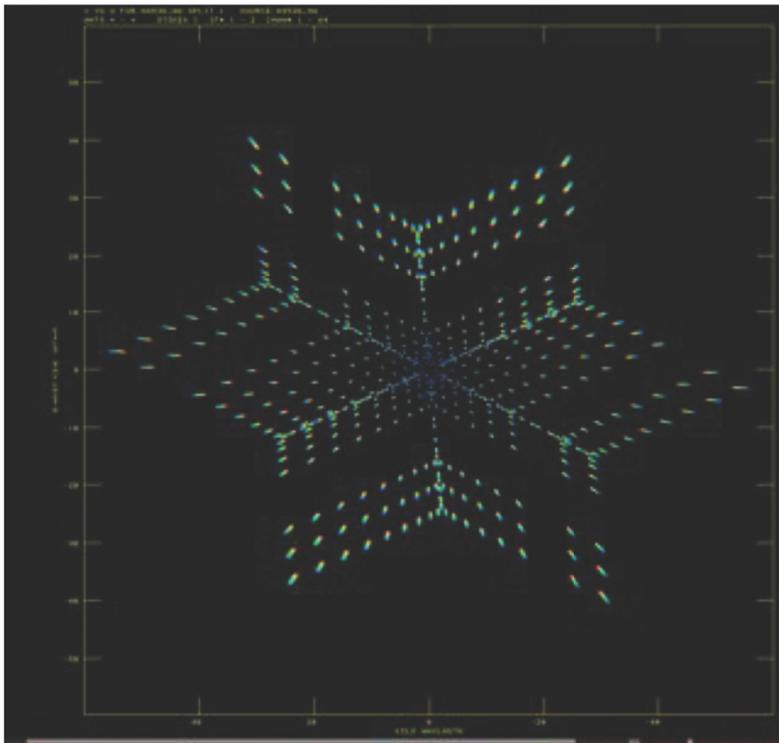
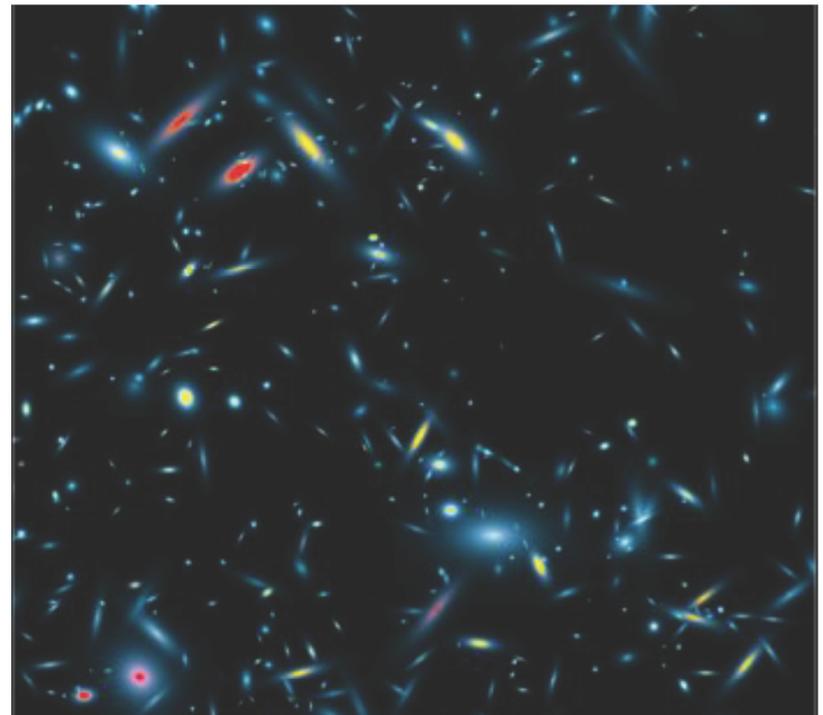


Image plane



Fourier  
Transform  
↔

$$N_{\text{data}} \sim N_{\text{antenna}}^2 N_{\text{frequency}} N_{\text{time}}$$

# Imaging Surveys



## Requirements

- Many antennas in order to provide sensitivity and image quality  
large  $N_{\text{antenna}}$
- Spectral resolution because of wide-field effects, line emission from galaxies, or both  
large  $N_{\text{frequency}}$
- Long integrations in order to obtain adequate signal-to-noise ratio  
large  $N_{\text{time}}$ , e.g., 1 hr at 1 s sampling?

$$N_{\text{data}} \sim N_{\text{antenna}}^2 N_{\text{frequency}} N_{\text{beams}} N_{\text{time}}$$

| ASKAP                                  | SKA Phase 1                             | SKA Phase 2                             |
|--|---|---|
| $N_{\text{antenna}} = 30$              | $N_{\text{antenna}} \sim 250$           | $N_{\text{antenna}} \sim 1000$          |
| $N_{\text{beams}} = 30$                | $N_{\text{beams}} = 1$                  | $N_{\text{beams}} = 1?$                 |
| $N_{\text{frequency}} \sim 16\text{k}$ | $N_{\text{frequency}} \sim 16\text{k}?$ | $N_{\text{frequency}} \sim 16\text{k}?$ |

# Imaging Surveys II



| ASKAP   | SKA Phase 1   | SKA Phase 2  |
|---|---|--|
| $N_{\text{antenna}} = 30$                                 | $N_{\text{antenna}} \sim 250$                             | $N_{\text{antenna}} \sim 1000$                             |
| $N_{\text{beams}} = 30$                                   | $N_{\text{beams}} = 1$                                    | $N_{\text{beams}} = 1?$                                    |
| $N_{\text{frequency}} \sim 16\text{k}$                    | $N_{\text{frequency}} \sim 16\text{k}?$                   | $N_{\text{frequency}} \sim 16\text{k}?$                    |
| $N_{\text{time}} \sim 4\text{k}$                          |   |  |
| $N_{\text{data}} \sim 1.8 \times 10^{12}$                 | $N_{\text{data}} \sim 4 \times 10^{12}$                   | $N_{\text{data}} \sim 65 \times 10^{12}$                   |
| <b><math>N_{\text{OPS}} \sim 18 \times 10^{15}</math></b> | <b><math>N_{\text{OPS}} \sim 40 \times 10^{15}</math></b> | <b><math>N_{\text{OPS}} \sim 650 \times 10^{15}</math></b> |

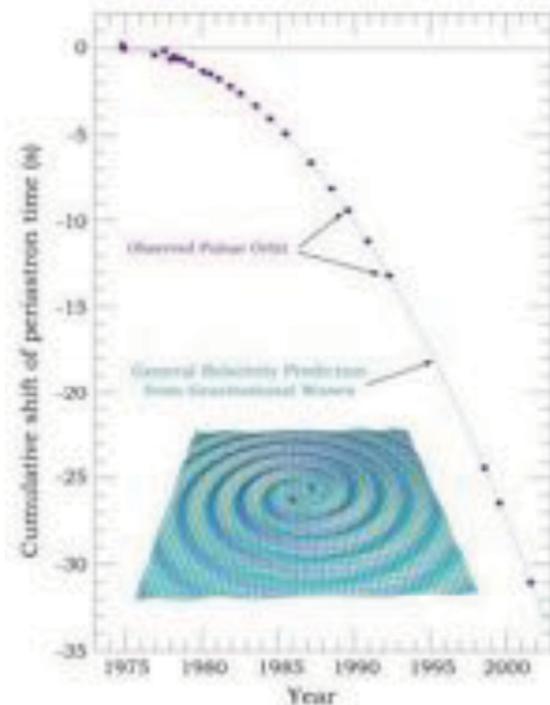
- Imaging is more than “just” an FFT.
  - Gridding, deconvolution, wide-field corrections, self-calibration, ...
- Community estimates are  $10^4$  to  $10^5$  ops per visibility datum(!).
- Leads to significant power challenges
  - Related to moving data on/off chips
  - Careful design can yield significant savings, e.g., D’Addario (SKA Memo 130)

# Fundamental Physics with Radio Pulsars

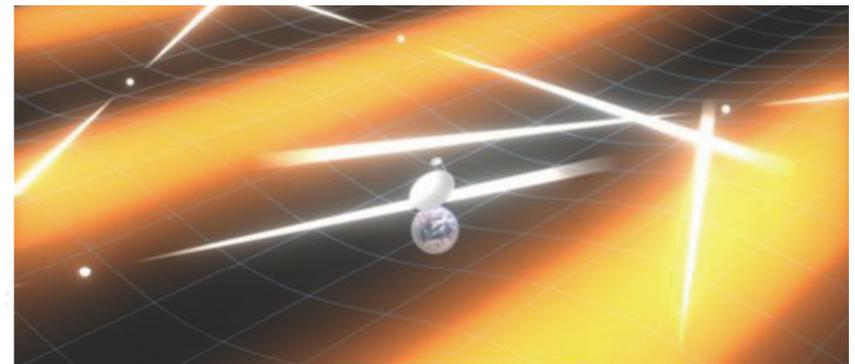


Arrival times of pulses from radio pulsars can be measured with phenomenal accuracy

- Better than 100 ns precision in best cases
- Enables high precision tests of fundamental physics
  - Theories of gravity, gravitational waves, nuclear equation of state
  - 1993 Nobel Prize in Physics
- **Problem:** Not all pulsars are equal!
- Good “timers” < 10% of total population
- Need to find **many more!**
- All-sky survey



← Ultra-relativistic binaries & gravitational wave studies

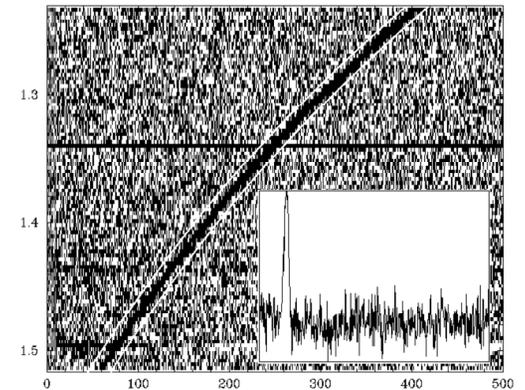


# Pulsar Surveys I



## Requirements

- Large bandwidths because pulsars are faint
- Long integration times because pulsars are faint
- Rapid time sampling in order to resolve pulse profile
- Narrow frequency channelization in order to mitigate interstellar scattering
- For a “pixel” on the sky, accumulate data for a time  $\Delta t$  over a bandwidth  $\Delta \nu$ 
  - Suppose  $\Delta t = 20$  min.,  $\Delta \nu = 800$  MHz
- Time sampling  $\delta t$  with frequency channelization  $\delta \nu$ 
  - For GBT GUPPI,  $\delta t = 81.92 \mu\text{s}$ ,  $\delta \nu = 24$  kHz
- 60 GB data sets per pixel ...



# Pulsar Surveys II



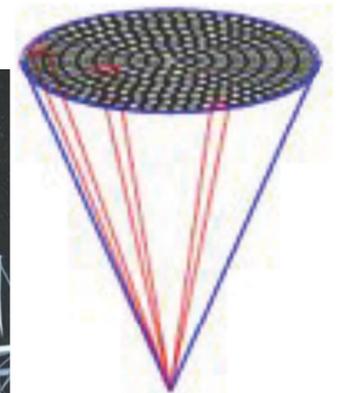
## For GBT

- At 800 MHz, “pixel”  $\sim 16' = 0.3^\circ$
- About 350 kpixels in the sky
- 20 PB data set



## For SKA

- At 800 MHz, “pixel” = 1.2'
- About 76 Mpixels in the sky
- 4.6 EB data set



# Data Intensive Astronomy

(“There is nothing new under the Sun.”)



## Data Volumes



Ἰππάρχος (Hipparcus)

- ca. 135 BCE
- Stellar catalog with 850 entries
- **SKA pulsar survey**

## Computational Limitations



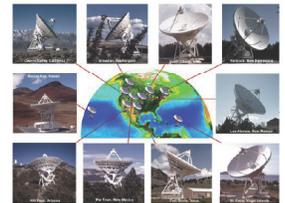
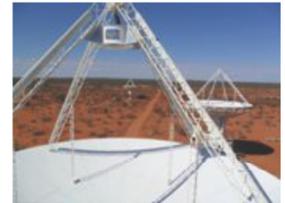
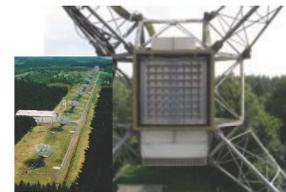
Harvard computers

- Production of stellar plates and spectra (“data rate”) was increasing enormously
- Examined and classified telescope output
- **SKA all-sky survey**

# SKA Pathfinder



- SKA is ultimate goal, though long-term program
- Precursors and many pathfinders in existence or under construction
  - Data challenges before SKA comes on-line
  - Scalability could be an issue



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