

## Astronomical Workloads



Kees van Berkel

MPSoC 2015,  
July 2015, Ventura, CA



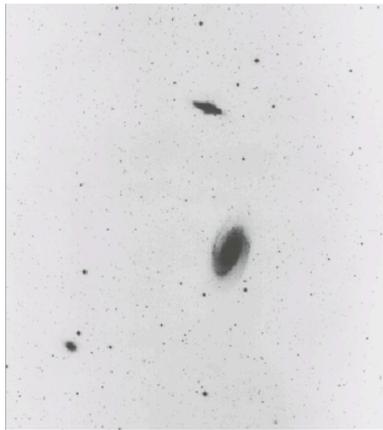
**TU/e** Technische Universiteit  
Eindhoven  
University of Technology

Where innovation starts

## Radio Astronomy

Tidal interactions in the M81 group

stellar light distribution



21cm HI distribution

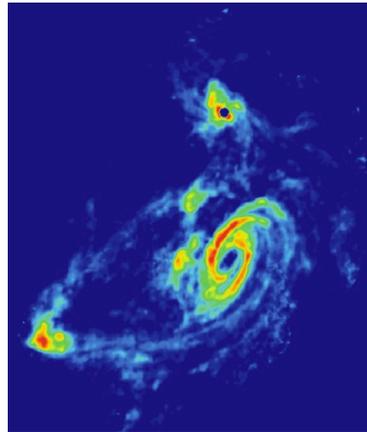
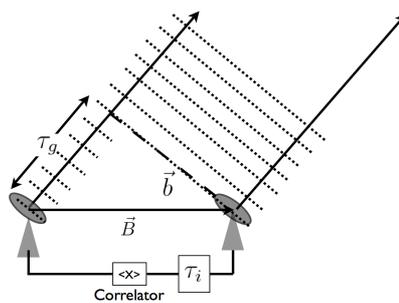


Image courtesy of NRAO/AUI

## Interferometry



Westerbork Synthesis Radio Telescope:  
14 dishes, D=25m, B=3km [NL,1956]



2-element interferometer.

Output of the correlator:

$$V_\nu(\mathbf{r}_1, \mathbf{r}_2) = \langle \mathbf{E}_\nu(\mathbf{r}_1) \mathbf{E}_\nu^*(\mathbf{r}_2) \rangle$$

with  $\nu$  the observation frequency  
and \* denoting complex conjugation

## Van Cittert–Zernike theorem [1934-38]

correlator output  $V_\nu(\mathbf{r}_1, \mathbf{r}_2) \approx \int I_\nu(\mathbf{s}) e^{-2\pi i \nu \mathbf{s} \cdot (\mathbf{r}_1 - \mathbf{r}_2) / c} d\Omega$

Annotations:  
 - sky intensity:  $I_\nu(\mathbf{s})$   
 - speed of light:  $c$   
 - solid angle:  $d\Omega$   
 - base line vector, separating the 2 antennae:  $\mathbf{r}_1 - \mathbf{r}_2$

Adding geometry (assuming "narrow field"):

$$V_\nu(u, v) = \iint I_\nu(l, m) e^{-2\pi i (ul + vm)} dl dm \quad \text{2D Fourier transform!}$$

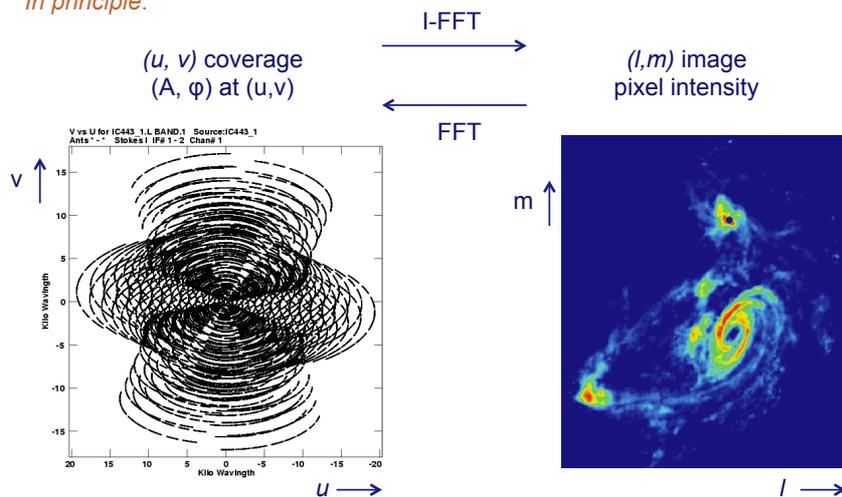
where  $(l, m)$  are sky-image coordinates  
 and  $(u, v)$  are coordinates of the base-line vector

[1], [2], [3]



## Van Cittert–Zernike theorem [1934-38]

*In principle:*



## W-projection, W-snapshot [2008/12, Cornwell et al]

However, Van Cittert–Zernike theorem “wide-field”

$$V(u, v, w) = \int \frac{I(\ell, m)}{\sqrt{1 - \ell^2 - m^2}} e^{-2\pi i [u\ell + vm + w(\sqrt{1 - \ell^2 - m^2} - 1)]} d\ell dm$$

Visibilities are 3D  $(u, v, w)$ , due to earth' curvature (Fresnel diffraction).

Choose as convolution function  $G(\ell, m, w) = e^{-2\pi i [w(\sqrt{1 - \ell^2 - m^2} - 1)]}$   
and let  $\tilde{G}^-(u, v, w)$  be the Fourier transform of  $G(\ell, m, w)$ .

Then, using the Fourier convolution theorem (W-projection):

$$V(u, v, w) = \tilde{G}^-(u, v, w) * V(u, v, w = 0)$$

*W-snapshot*

= *W-projection* applied piecemeal to a series of snapshots.

[4], [5]



## Deconvolution (CLEAN, Högbom 1974)

$$I(\ell, m) \xrightarrow{\text{FFT}} V(u, v, w=0) \xrightarrow{**\tilde{G}^-(u, v, w)} V(u, v, w)$$

Can be computed straightforwardly, but cannot be inverted easily, because  $V(u, v, w)$  provides only a finite number of noisy samples (and a variety of other reasons, including antenna beam pattern).

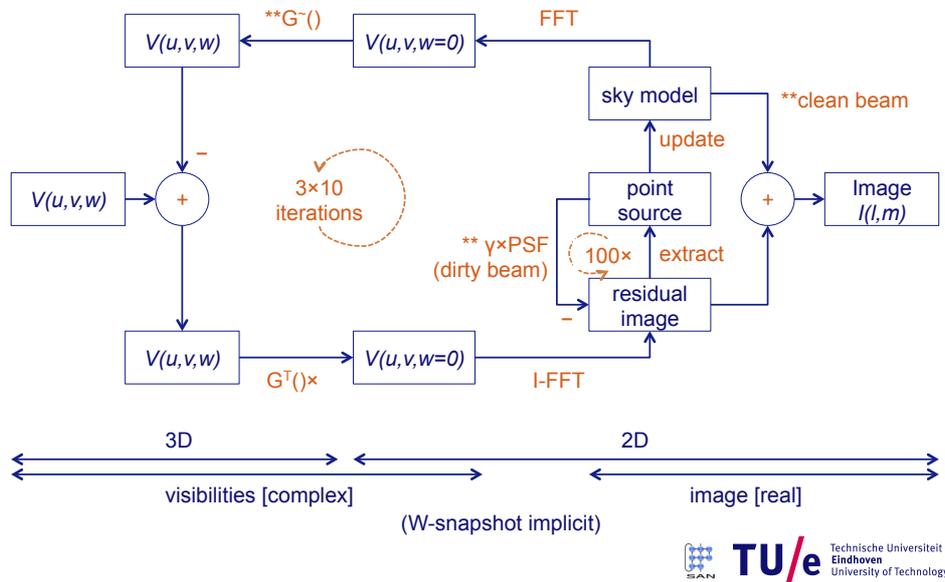
CLEAN (next slide) is an iterative *deconvolution* algorithm.  
( $\approx$  interpolation in uv plane)

(Under certain conditions CLEAN converges to a solution that is the least-squares fit of the FFT transform.)

[1], [3]



## Imaging (W-projection/snapshot + CLEAN)



## SKA1-mid [South Africa]: science in 2020

Towards a Square Kilometer Array



SKA Organisation /Swinburne Astronomy Productions [6]

## Imaging: compute load for SKA1-mid

quantity	unit	<sup>10</sup> log	note
# base lines		5.5	$2^2 \times (\#\text{dishes} + \#\text{stations})^2 = (2 \times 254)^2$
dump rate	s <sup>-1</sup>	1	(integration time = 0.08s) <sup>-1</sup>
observation time	s	3	
# channels		5	"image cube" for spectral analysis
# visibilities / observation		14.5	= input to imaging ( $\approx 10^{16}$ Byte)
# ops /visibility /iteration		4.5	convolution, matrix multiply, (I)FFT
# major iterations		1.5	(3×calibration) × (10×major)
# ops /observation		20.5	
# ops /sec	Hz	17.5	$\approx 1$ exa-(fl)ops / sec

- #operations/visibility/iteration depends on #snapshots
- calibration loop (3×) around imaging loop
- data type: double|single precision, floating|fixed point?

[7], [8], [9]

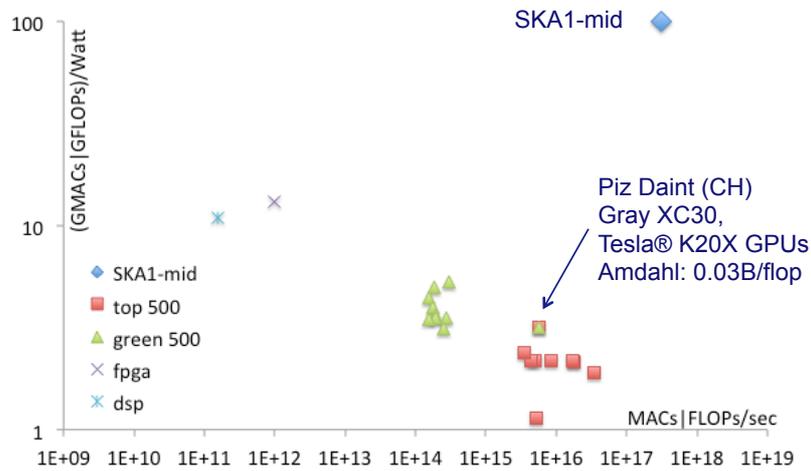
## Imaging: where is the parallelism?

quantity	unit	<sup>10</sup> log	note
# ops / sec	Hz	17.5	= imaging compute load
margin (for inefficiencies)		0.5	very aggressive / optimistic
machine	flop	18	= 1 exaflops/sec
# clock frequency	Hz	9	
# channels in parallel		5	☺, all independent data streams!
simd? simt? pipelining?		4	☹, challenging!

### Concerns on efficiency:

- data sets are large ( $\approx 10^{16}$  Bytes for visibilities),
- and some algorithms are low on compute intensity (high i/o) and or irregular, (e.g. FFT typically 20% efficiency on a CPU | GPU),
- Hence manual optimization of code likely essential.

## EXAflops/sec in 2015?

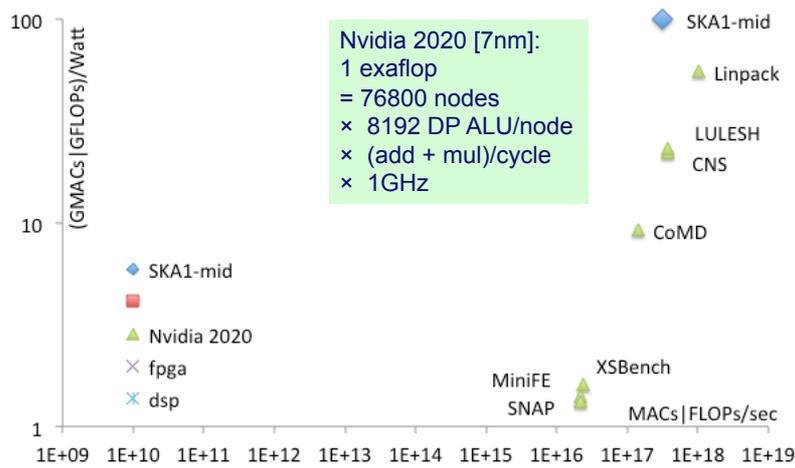


- *net* SKA1-mid computation load “2020” versus
- *gross* (peak) compute performance “2015”

[10]



## EXAflops/sec in 2020?



A huge spread per application in achievable FLOPs/sec and GFLOPs/Watt! [11]



## Astronomical workloads

### Exaflops/sec algorithms?

- Can we expect algorithm innovation beyond w-snapshot+CLEAN?
- Trade lower hot FLOPs (w-snapshot) vs higher cool FLOPs (w-projection)?
- Where can we afford single precision? (Fixpoint?)

### Exaflops/sec machines?

- Will GPUs be the obvious accelerator? or will FPGAs or DSPs surprise us?
- Amdahl memory ratio (Byte/flop)?

### Exaflops/sec mapping?

- Which forms of parallelism for highest efficiency? (Next to channel ||)
- What levels of efficiency are achievable?

### Exaflops/sec requirements?

- When will exaflops/sec SKA1 power consumption be affordable?
- Will SKA2 (>100x) ... ?

## References

- 1) G.B. Taylor, C.L. Carilli, and R.A. Perly (eds.), Synthesis Imaging in Radio Astronomy II, ASP Conf Series, Vol. 180, 1999.
- 2) B.G. Clark, Coherence in Radio Astronomy, pp. 1-10 in [1].
- 3) Thompson, A., Moran, J., & Swenson, G. 2001, Interferometry and synthesis in radio astronomy (Wiley, New York)
- 4) T. J. Cornwell, K. Golap, and S. Bhatnagar, "The Non- coplanar Baselines Effect in Radio Interferometry: The W-Projection Algorithm," *IEEE Journal of Selected Topics in Signal Processing*, vol. 2, no. 5, pp. 647–657, Oct. 2008.
- 5) T. J. Cornwell, M. A. Voronkova and B. Humphreys, Wide field imaging for the Square Kilometre Array, arXiv:1207.5861v1, 25 Jul 2012
- 6) P.E. Dewdney et al., SKA1 System Baseline Design, tech. report SKA-TEL-SKO-DD-001, SKA, Mar. 2013; [www.skatelescope.org/?attachment\\_id=5400](http://www.skatelescope.org/?attachment_id=5400).
- 7) R. Jongerius, S. Wijnholds, R. Nijboer, and H. Corporaal, "End-to-end compute model of the Square Kilometre Array," *IEEE Computer*, Sept. 2014, pp. 48-54.
- 8) Erik Vermij et al, "Challenges in exascale radio astronomy: Can the SKA ride the technology wave? Intl. Journal of High Performance Computing Applications 2015, Vol. 29(1) 37–50.
- 9) S. J. Wijnholds, A.-J. van der Veen, F. De Stefani, E. La Rosa, A. Farina, Signal Processing Challenges for Radio Astronomical Arrays, 2014 IEEE ICASSP, pp. 5382-86.
- 10) The Green500 List - November 2014, <http://www.green500.org>.
- 11) Oreste Villa et al, Scaling the Power Wall: A Path to Exascale, SC14: Intl Conf. for High Performance Computing, Networking, Storage and Analysis, p830-841.

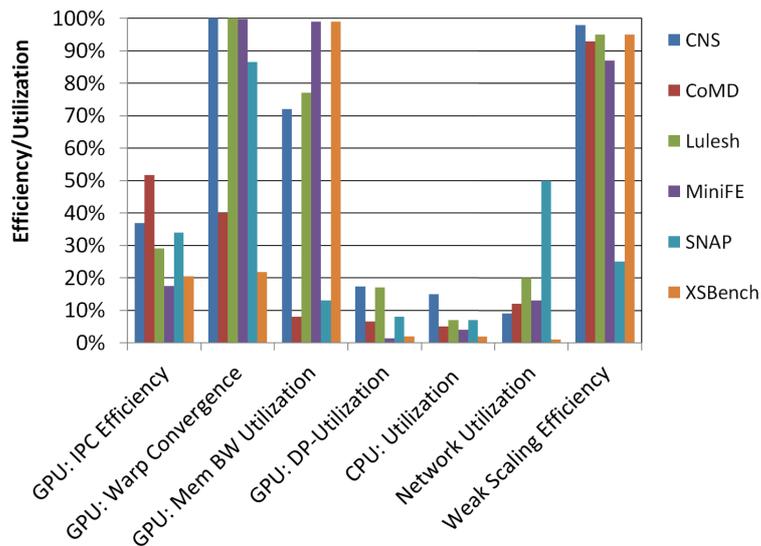
## DoE proxy-applications for scientific computing

	Proxy applications for scientific computing		
LINPACK	Linear algebra		
CNS	Compressible Navier Stokes equations		
LULESH	Solve hydrodynamics on a 3D mesh		
CoMD	Molecular dynamics: compute forces; update positions		
SNAP	Solve the neutral, linear Boltzmann transport eqn		
XSbench	Monte Carlo neutronics		
MiniFE	3D finite elements		

[11]



## Key characteristics of DoE proxy-apps



[11]

