

# Performance Engineering for the SKA telescope

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# Acknowledgement

A large group of people (~500) are working on this project  
Most information is publicly available, but very technical  
This presentation re-uses much from other SKA efforts

Particularly I'm using a few slides from Peter Wortmann  
Background: [skatelescope.org](http://skatelescope.org)

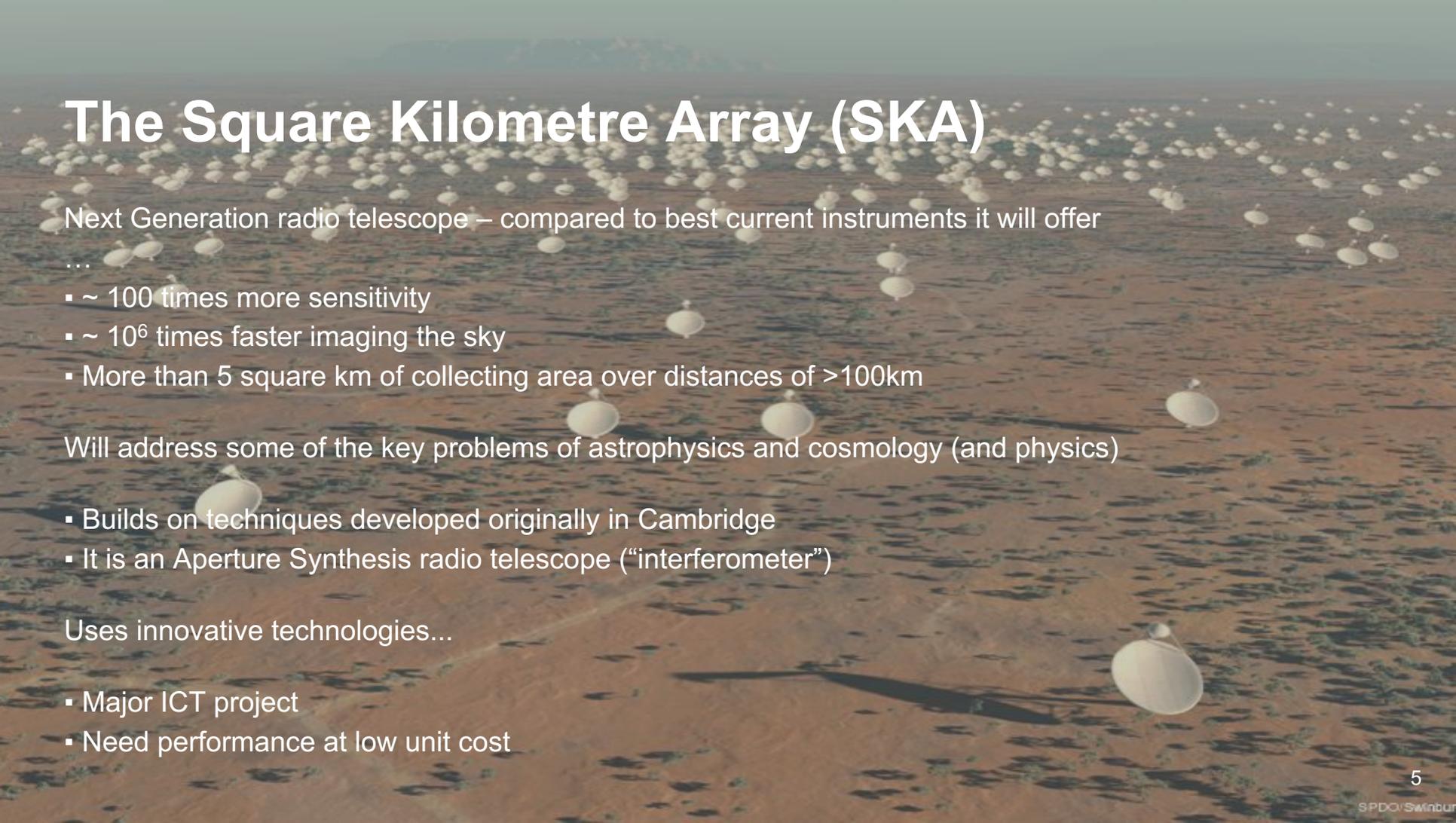
My role: consultant & visiting academic for Cambridge group since 2013

# Message from this talk

1. SKA telescope is a grand challenge scale project
2. Synergy between scientific computing and industry for performance
  - Hardware – particularly memory, energy
  - Software – agility, parallelism, energy
3. General purpose tools appear insufficient, there may be fairly deep open issues

# What is the SKA?

# The Square Kilometre Array (SKA)

An aerial photograph of the Square Kilometre Array (SKA) radio telescope array. The image shows a vast, flat, arid landscape covered with hundreds of small, white, parabolic radio telescope dishes. The dishes are arranged in a regular grid pattern, extending far into the distance. The ground is a mix of reddish-brown soil and sparse, low-lying green vegetation. The sky is clear and blue.

Next Generation radio telescope – compared to best current instruments it will offer

- ...
- ~ 100 times more sensitivity
- ~  $10^6$  times faster imaging the sky
- More than 5 square km of collecting area over distances of >100km

Will address some of the key problems of astrophysics and cosmology (and physics)

- Builds on techniques developed originally in Cambridge
- It is an Aperture Synthesis radio telescope (“interferometer”)

Uses innovative technologies...

- Major ICT project
- Need performance at low unit cost

# SKA International Design Consortia



## Project Management and System Engineering Team based at JBO (UK)

~500 scientists & engineers in institutes & industry in 11 Member countries

WIDE BAND SINGLE PIXEL FEEDS

TELESCOPE MANAGER

CENTRAL SIGNAL PROCESSOR

SIGNAL AND DATA TRANSPORT

SCIENCE DATA PROCESSOR

DISH

MID-FREQUENCY APERTURE ARRAY

LOW-FREQUENCY APERTURE ARRAY

ASSEMBLY, INTEGRATION & VERIFICATION

INFRASTRUCTURE AUSTRALIA

INFRASTRUCTURE SOUTH AFRICA

# SKA – a partner to ALMA, EELT, JWST

## ALMA:

- 66 high precision sub-mm antennas
- Completed in 2013
- ~\$1.5 bn

Credit: A. Marinkovic/XCam/ALMA(ESO/NAOJ/NRAO)

## JWST:

- 6.5m space near-infrared telescope
- Launch 2018
- ~\$8 bn

Credit: Northrop Grumman (artists impression)

## European ELT

- ~40m optical telescope
- Completion ~2025
- ~\$1.3 bn

Credit: ESO/L. Calçada (artists impression)

## Square Kilometre Array

- phase 1
- Two next generation antenna arrays
- Completion ~2025
- \$0.80 bn

Credit: SKA Organisation (artists impression)

# In summary ...

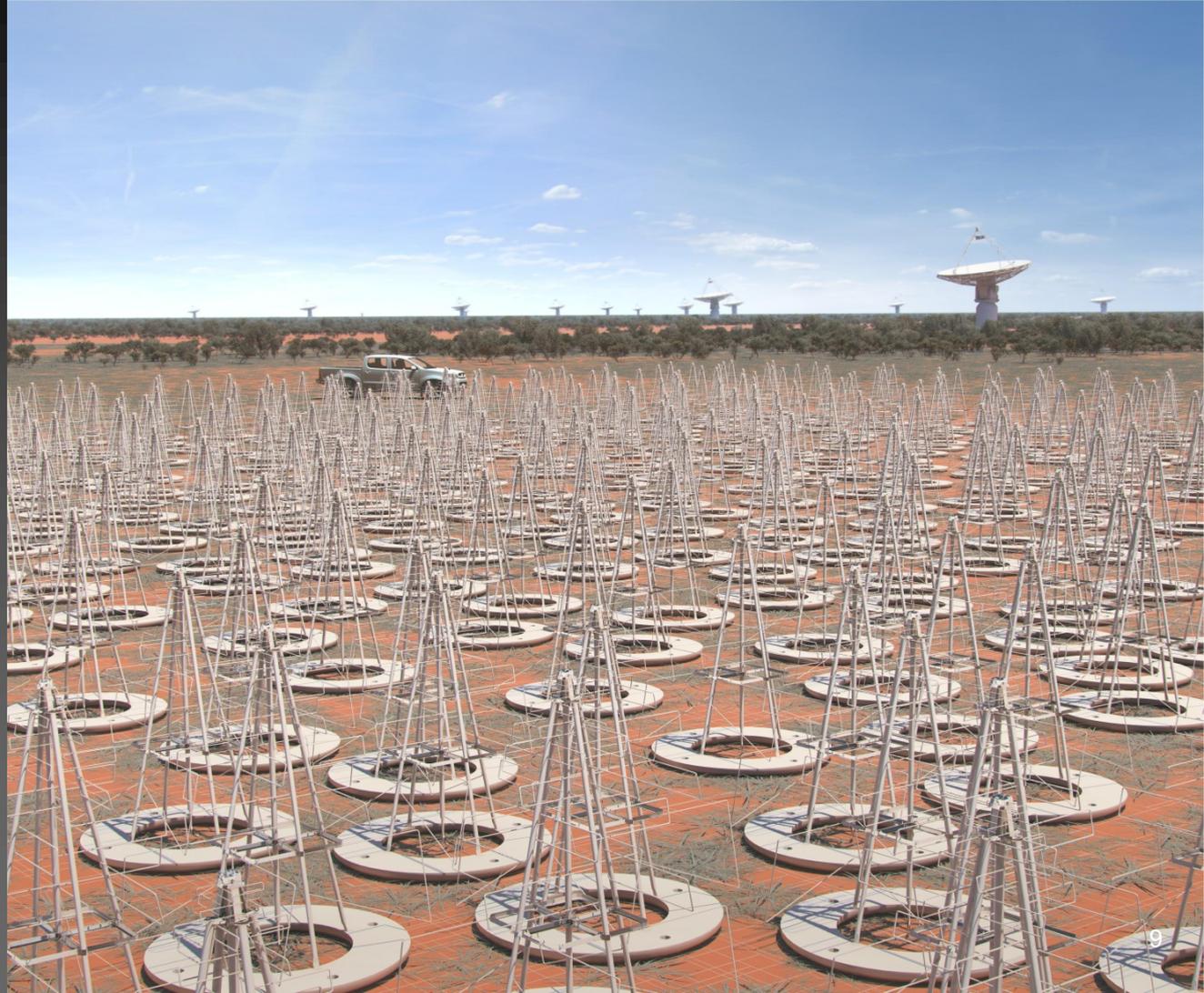
- SKA aims to be a world class “instrument” like CERN
- SKA Phase 1 – in production 2025
- SKA Phase 2 – likely 10x more antennas – 2030’s?
- This presentation focuses on SKA1
- Caveat
  - Ongoing changes
  - Some inconsistencies in the numbers

**Low Frequency  
Aperture Array**  
0.05 – 0.5 GHz

Australia

~1000 stations  
256 antennas each  
phased array with  
Beamformers

Murchison Desert  
0.05 humans/km<sup>2</sup>  
Compute in Perth





## Mid Frequency Telescope

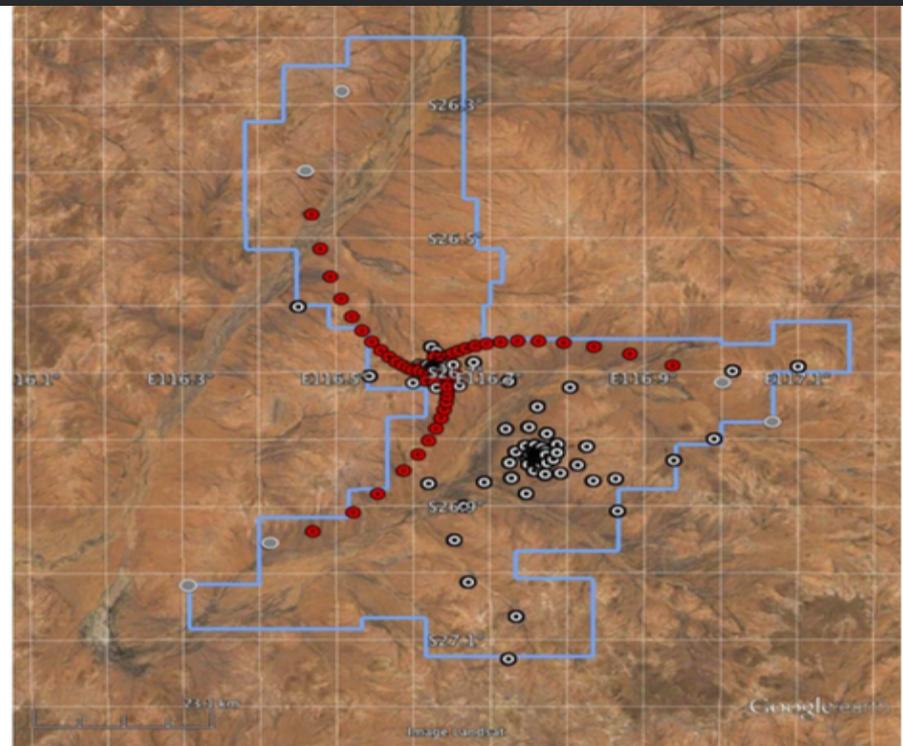
South Africa

250 dishes with single receiver

Karoo Desert, SA - 3 humans / km<sup>2</sup>

Compute in Cape Town (400 km)

# Antenna array layout



SKA1-MID, -LOW: Max Baseline = 156km, 65 km

# Science

# Science Headlines

## Fundamental Forces & Particles

### Gravity

- Radio Pulsar Tests of General Relativity
- Gravitational Waves
- Dark Energy / Dark Matter

### Magnetism

- Cosmic Magnetism

## Origins

### Galaxy & Universe

- Cosmic dawn
- First Galaxies
- Galaxy Assembly & Evolution

### Stars Planets & Life

- Protoplanetary disks
- Biomolecules
- SETI

# Epoch of Re-Ionisation

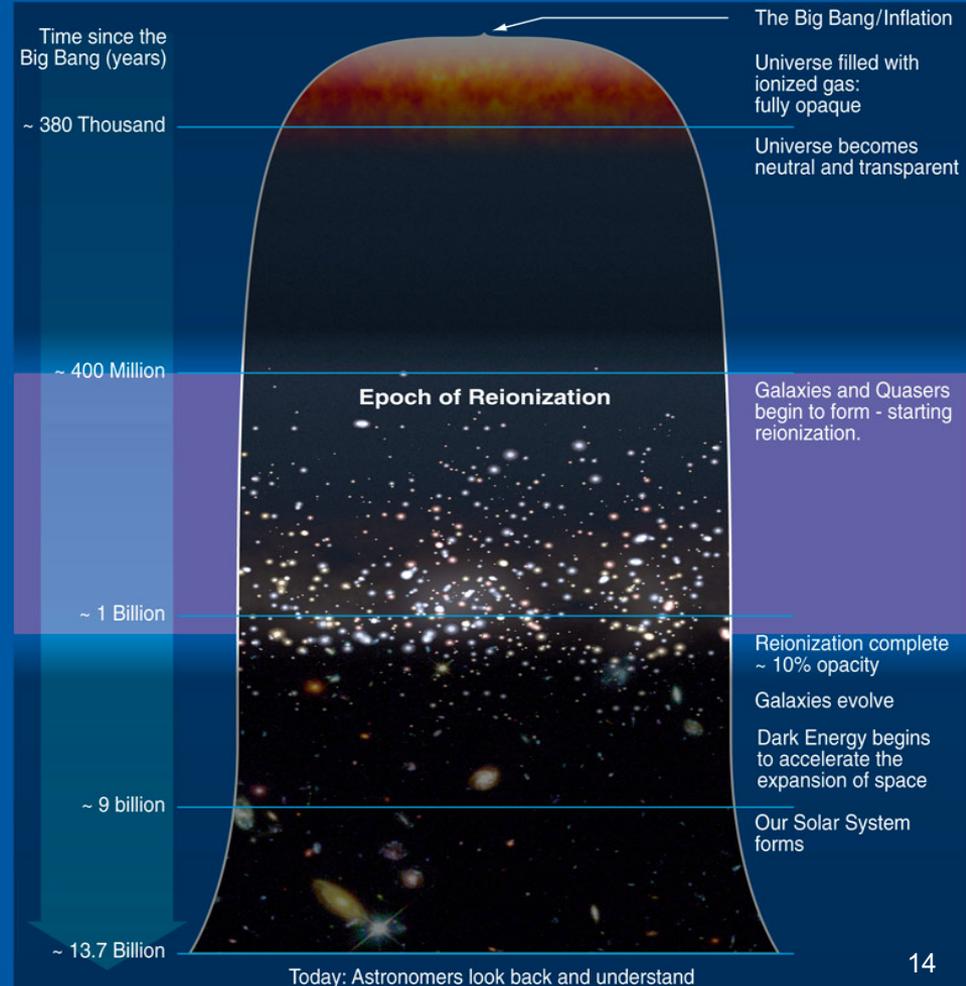
21 cm Hydrogen spectral line (HI)

Difficult to detect

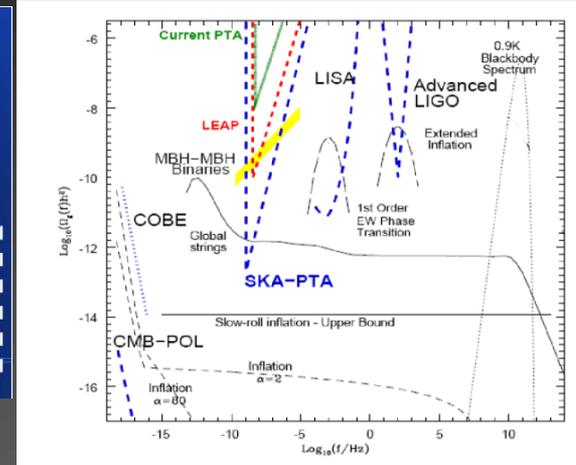
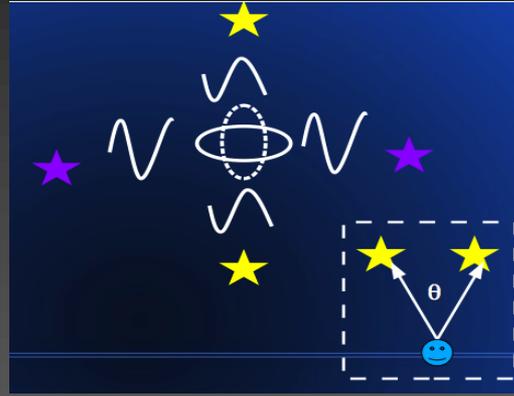
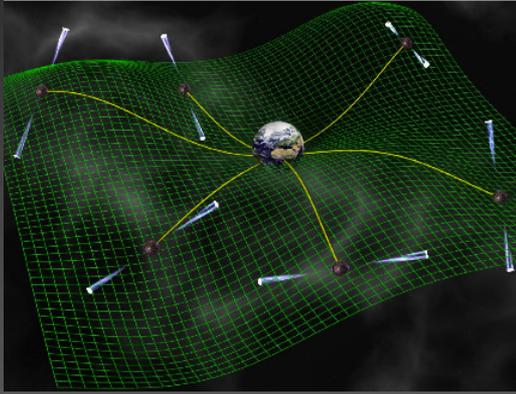
Tells us about the dark age:

400K – 400M years  
(current age 13.5G year)

## First Stars and Reionization Era

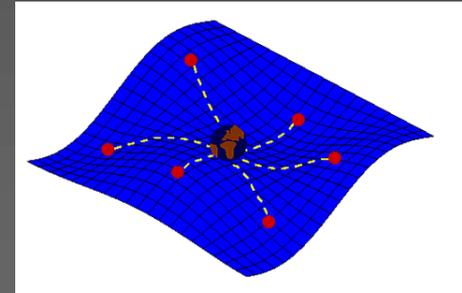


# Pulsar Timing Array



What can be found:

- gravitational waves
- Validate cosmic censorship
- Validate “no-hair” hypothesis
- **Nano-hertz frequency range**
- ms pulsars, fluctuations of 1 in  $10^{20}$
- SKA1 should see all pulsars (estimated  $\sim 30K$ ) in our galaxy



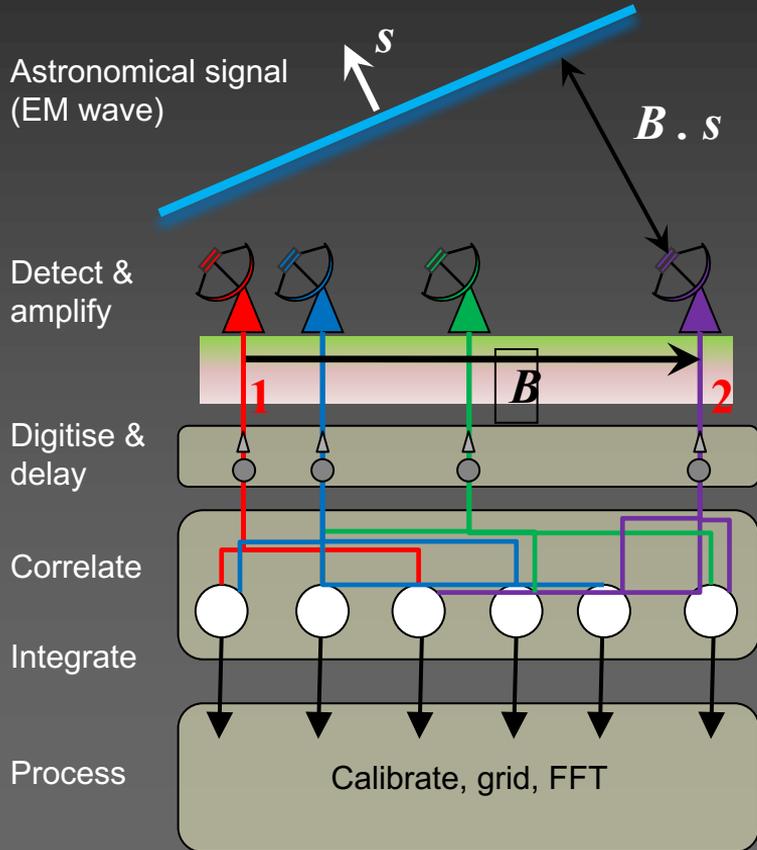
# Physics & Astrophysics

Many key questions in theoretical physics relate to astrophysics

Rate of discoveries in the last 30 years is staggering

# Imaging Problem

# Standard interferometer



Visibility  $V(B)$ : what is measured on baselines  
Image  $I(s)$ : image  
Solve for  $I(s)$

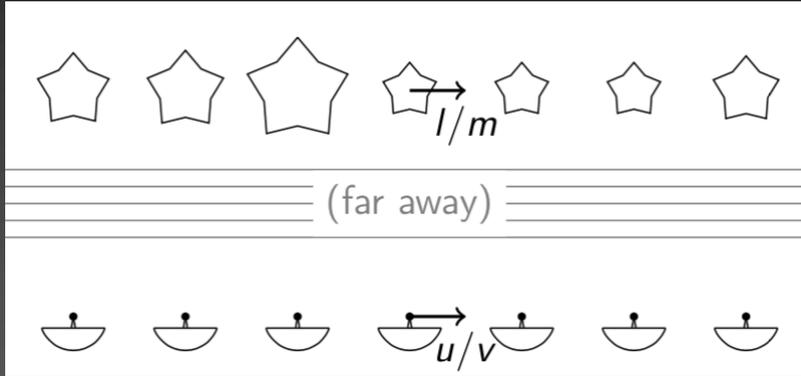
$$V(B) = E_1 E_2^* = I(s) \exp(i \omega B \cdot s / c) - \text{image equation}$$

Maximum baseline gives resolution:  
Dish size determines Field of View (FoV):

$$\theta_{\max} \sim \lambda / B_{\max}$$
$$\theta_{\text{dish}} \sim \lambda / D$$

SKY Image

# Interferometry radio telescope



## Simplified

Sky is flat  
Earth is flat

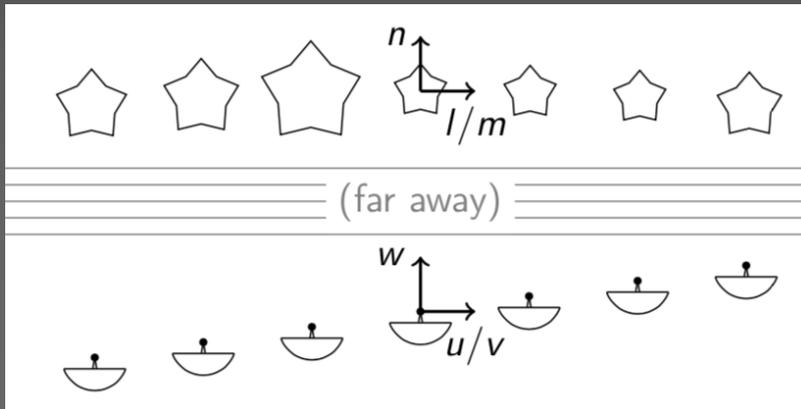
Telescope to image is Fourier transform

## Actually

Sky is sphere, earth rotates, atmosphere distorts

Now it is a fairly difficult problem:

1. Non-linear phase
2. Direction, frequency, baseline dependent gain factor



# Data in the computation

## Two principal data types

input is visibility – irregular, sparse uvw - grid of baselines  
Image grid - regular grid in sky image

## Different kinds of locality

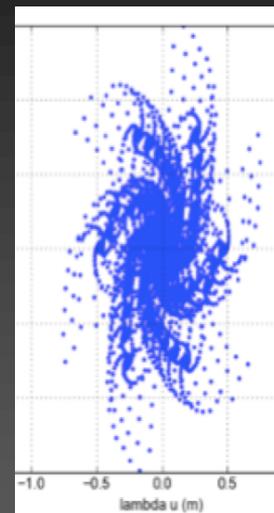
Splitting the stream by frequency

Tiling visibilities by region – but visibility “tile” data is highly irregular

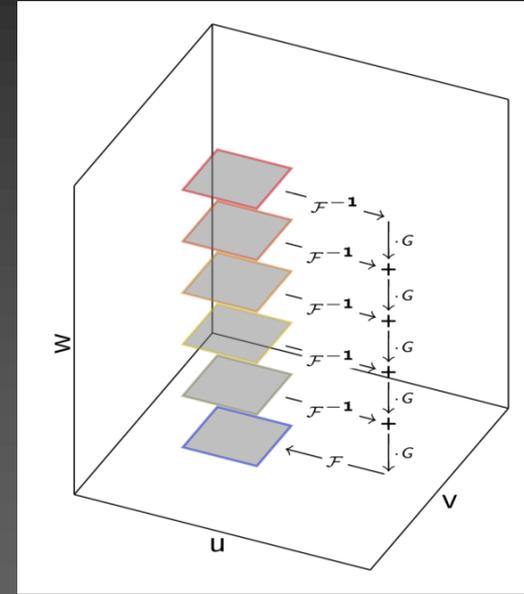
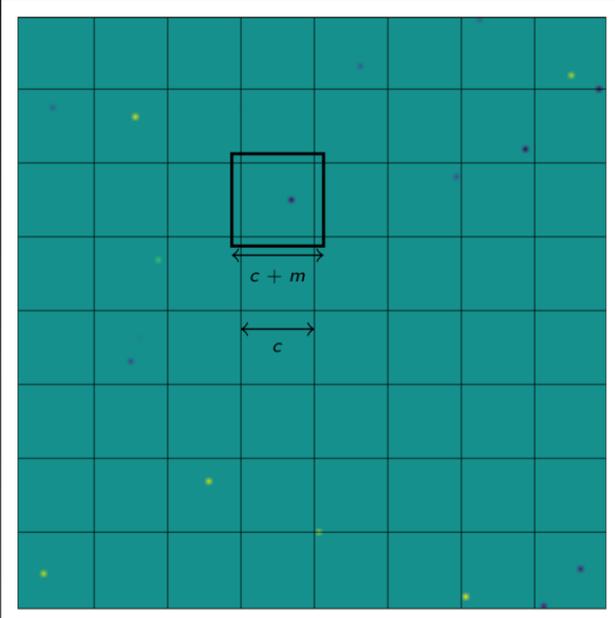
Analyze visibility structure – 0, sparse, dense: separate strategies

Remove 3rd dimension by understanding earth rotation

Data flow model with overlapping movement and computation



# Reducing to 2D



Try to go back from 2D to 3D problem by relating ( $\sim 100$ ) different  $w$  values.  
Domain specific optimization.

Grid size is 64K x 64K for 64K frequencies – problem is large  
Full FFT is  $O(k \log k)$ , sparse FFT:  $O(\#\text{nonzero} \log \#\text{nonzero})$ . This approach is close to this. 21

# Computing in radio astronomy - 101

@Antennas: wave guides, clocks, beam-forming, digitizers

@Correlator (CSP central signal processing): == DSP for antenna data

Delivers data *for every pair of antenna's (a "baseline")*

Dramatically new scale for radio astronomy ~100K baselines

Correlator averages and reduces data, delivers sample every 0.3 sec

Data is delivered in frequency bands: ~64K bands

3 complex numbers delivered / band / 0.3 sec / baseline

Do math: ~ 1 TB/sec input of so called *visibility data*

@Science Data Processor (SDP) – process correlator data

Create images (6 hrs) & find transients (5 secs) – “science products”

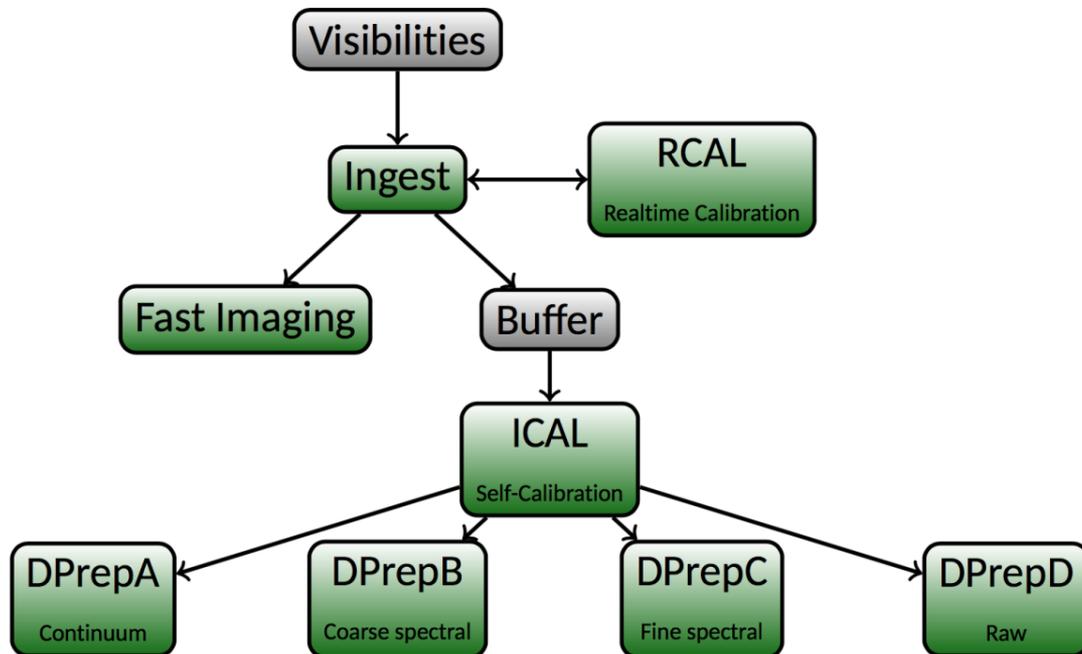
Adjust for atmospheric and instrument effects *calibration*

# Outline of algorithm

About 5 different analysis on the data are envisaged:  
e.g. spectral vs continuum imaging etc.

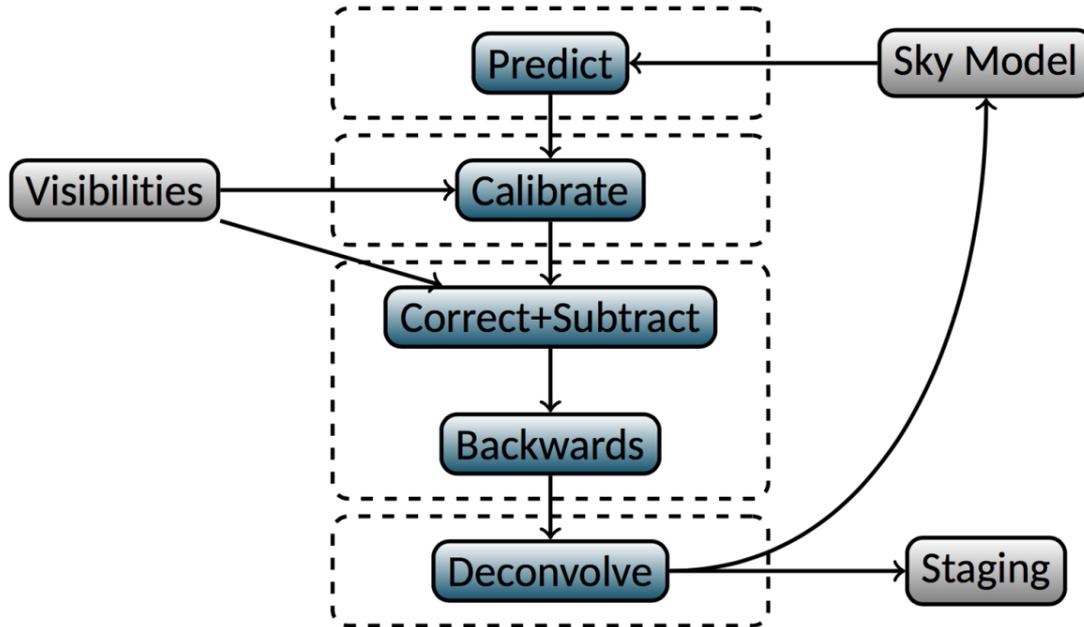
## Imaging pipelines:

- Iterate until convergence – approximately 10 times
- Compares with an already known model of the sky
- Incorporates and recalculates calibration data



Follows architecture, allows running multiple data preparations.

Rough structure and distribution pattern of most pipelines:



# SDP specific Pipelines

Algorithmic **similarities** with other image processing

Each step is

- Convolution with some kind of a “filter” – e.g. “gridding”
- Fourier transform
- All-to-all for calibration

Why new & different software?

- Data is very **distinct** from other image processing
- Problem is very **large** – much bigger than RAM
- Reconstruction dependencies: sky model & calibration

# Engineering Problem

# Requirements & Tradeoffs

## Turn telescope data into science products soft real time

1. Transient phenomena: time scale of ~10 seconds
2. Images: 1 image ~6 hours

## Agility for software development

Telescope lifetime ~50 years

SDP computing hardware refresh ~5 years

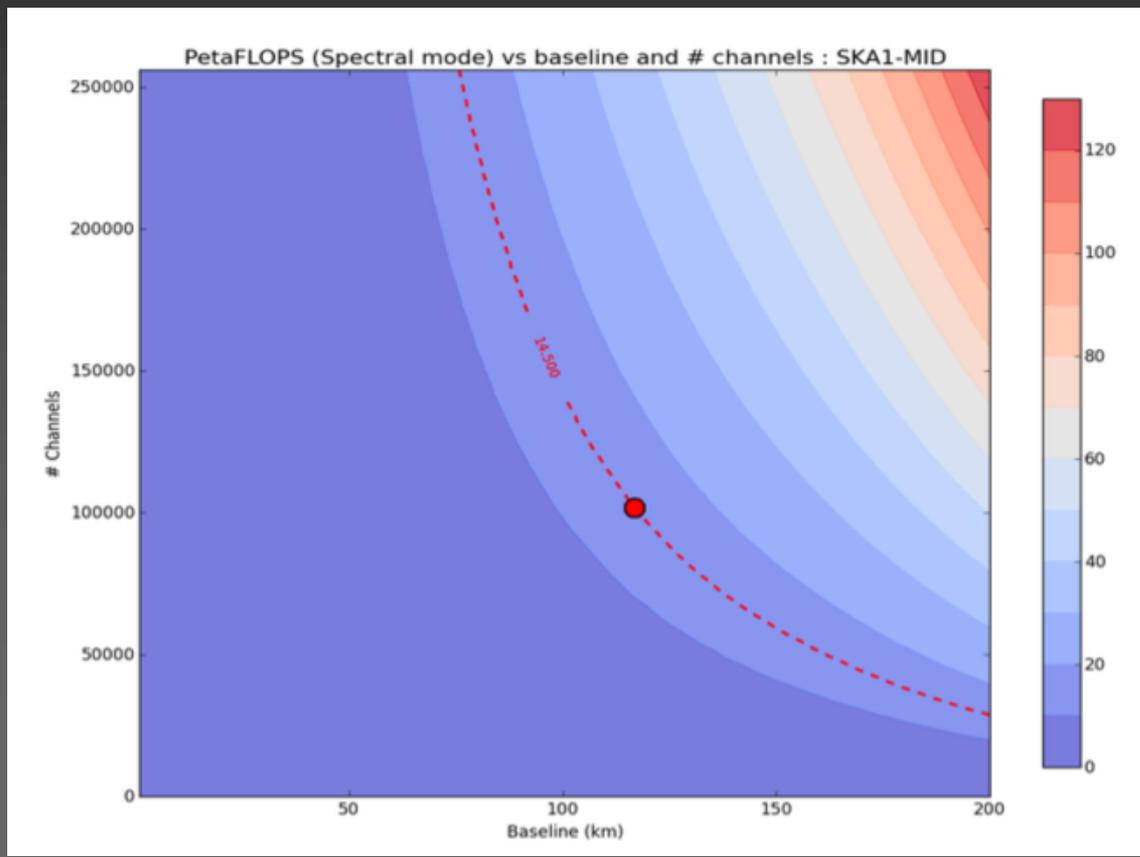
Use of large clusters is new in radio astronomy

New telescopes always need new algorithms

## Initial 2025 computing system goal: make SKA #1

So – how difficult is this?

# Flops vs. #channels & baseline



# SDP “performance engineering” approach

## Conservative - this is not computing research

Known-good algorithms, hardware

Perhaps deep math question remains: is problem really  $O(\#\text{antennas}^2)$ ?

## Parametric model of the computation

Detailed FLOPs, memory use, data movement, energy

Key outcome: 100 PF/sec & move 200 PB/sec from HBM to CPU

@50 PJ / byte this is ~10MW power

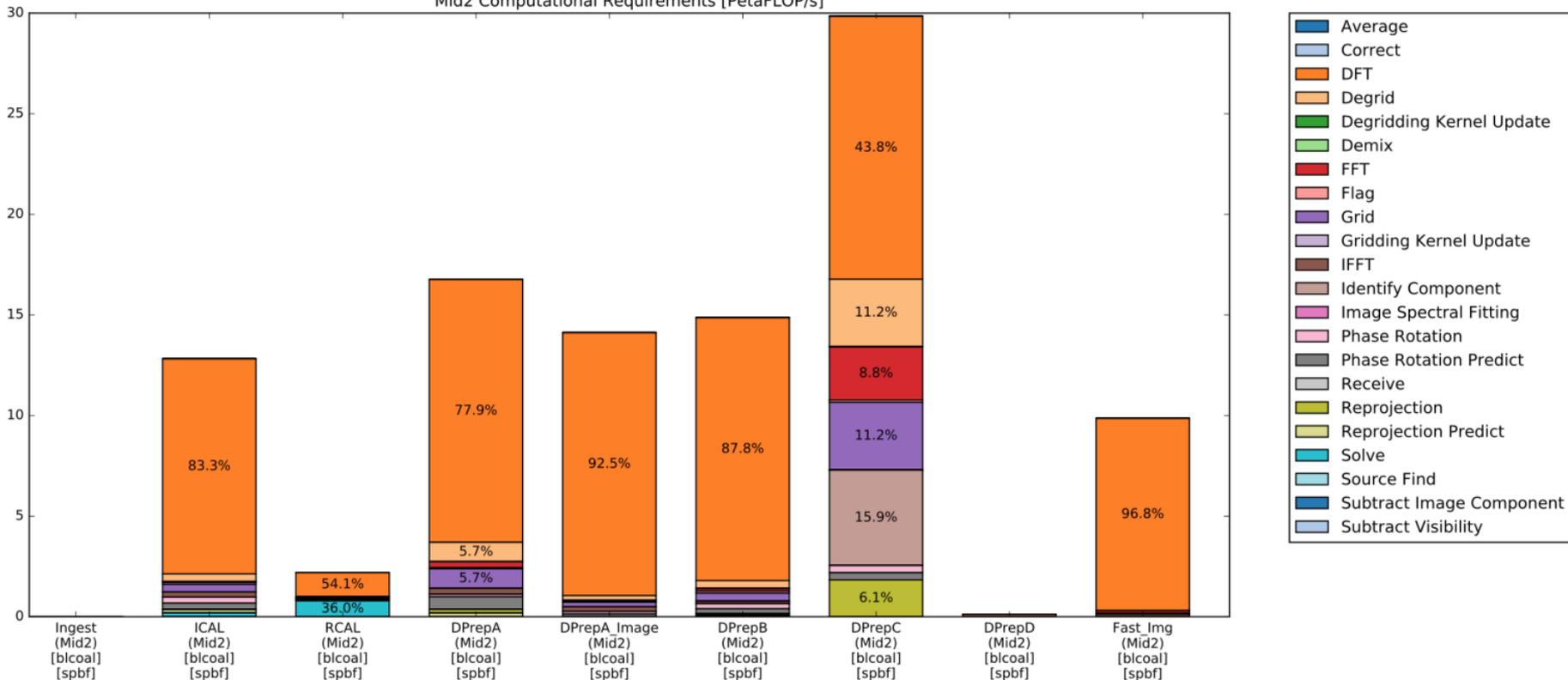
## Software

Reference Libraries with Algorithms

Address scalability issues

# Relative kernel cost

Mid2 Computational Requirements [PetaFLOP/s]



# Software Framework for SKA SDP

Creating software is a very high risk part of the project

Ideal perspective:

- Execution framework from 3rd party

- Domain specific application language for pipelines

- Automatic optimization – performance & energy

  - .... this is proving less easy than we had hoped

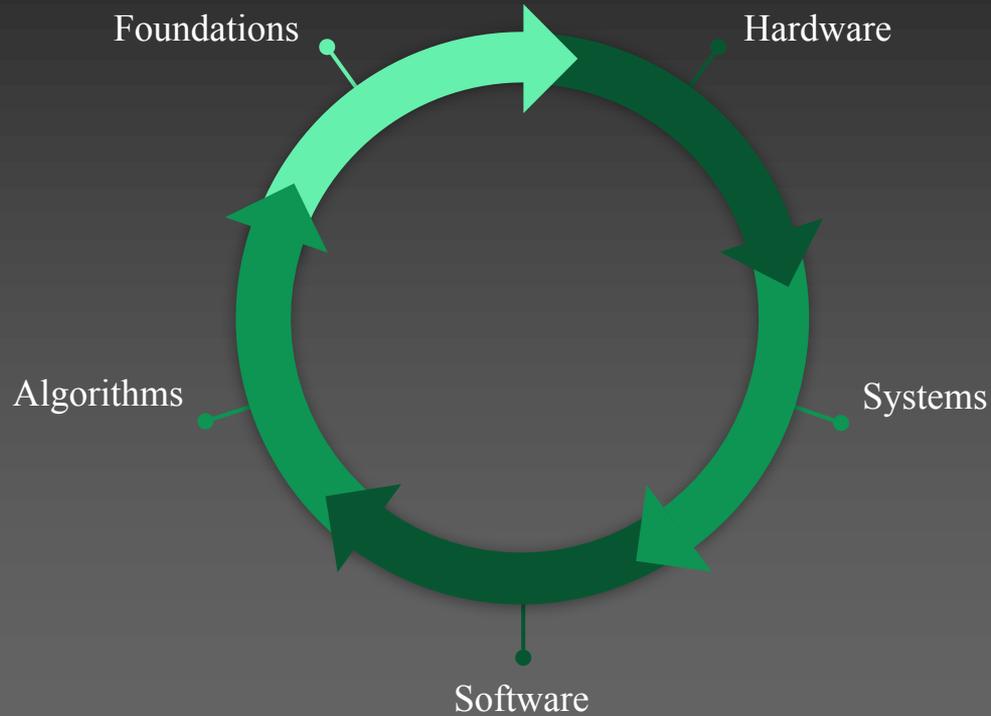
Many approaches – excellent compilers and ....

- Adapting existing packages – MPI C++ applications

- Use a big-data framework like Spark, TensorFlow

- Use HPC frameworks like Swift/T, Legion

# Co-design



## Lesson:

Interactions between these domains is a very big challenge

# Work Breakdown

**Foundations:** be conservative – no totally new approaches

**Algorithms:** innovation - adapt to scale

**Software:** prototyping, seeking mainstream solution

**Hardware:** much has been learned from working with the chip vendors

**Systems:** analysis by HPC experts, costing, vendor ideas etc.

# Samples of Data Processing Considerations

# SKA – data schematic

## Antennas



## Central Signal Processing (CSP)



Transfer antennas to CSP  
2024: 20,000 PBytes/day  
2030: 200,000 PBytes/day

Over 10's to 1000's kms

## Imaging (SDP) – HPC problem

2024: 100 PBytes/day  
2030: 10,000 PBytes/day  
Over 100's kms

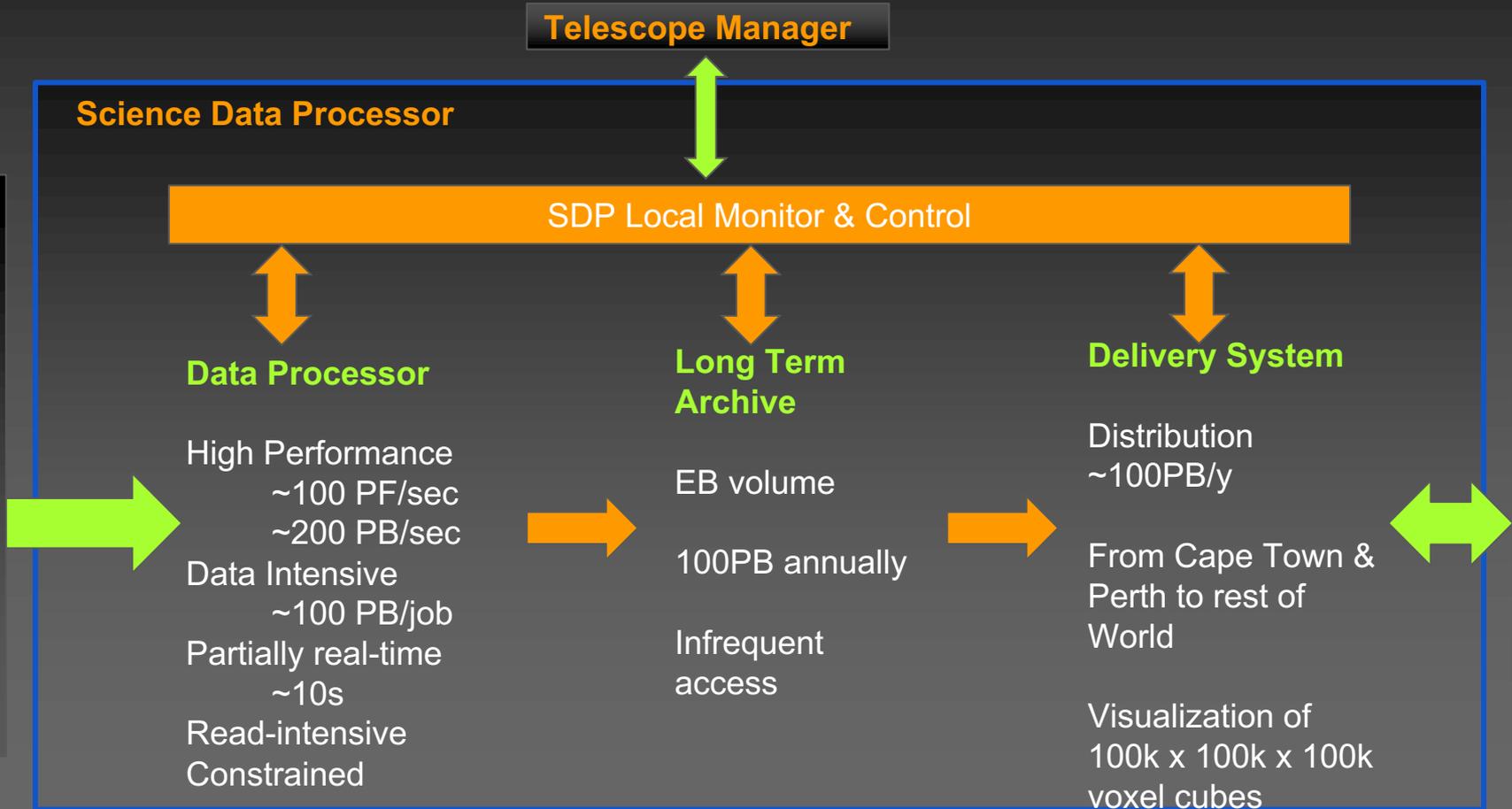


## High Performance Computing Facility (HPC)

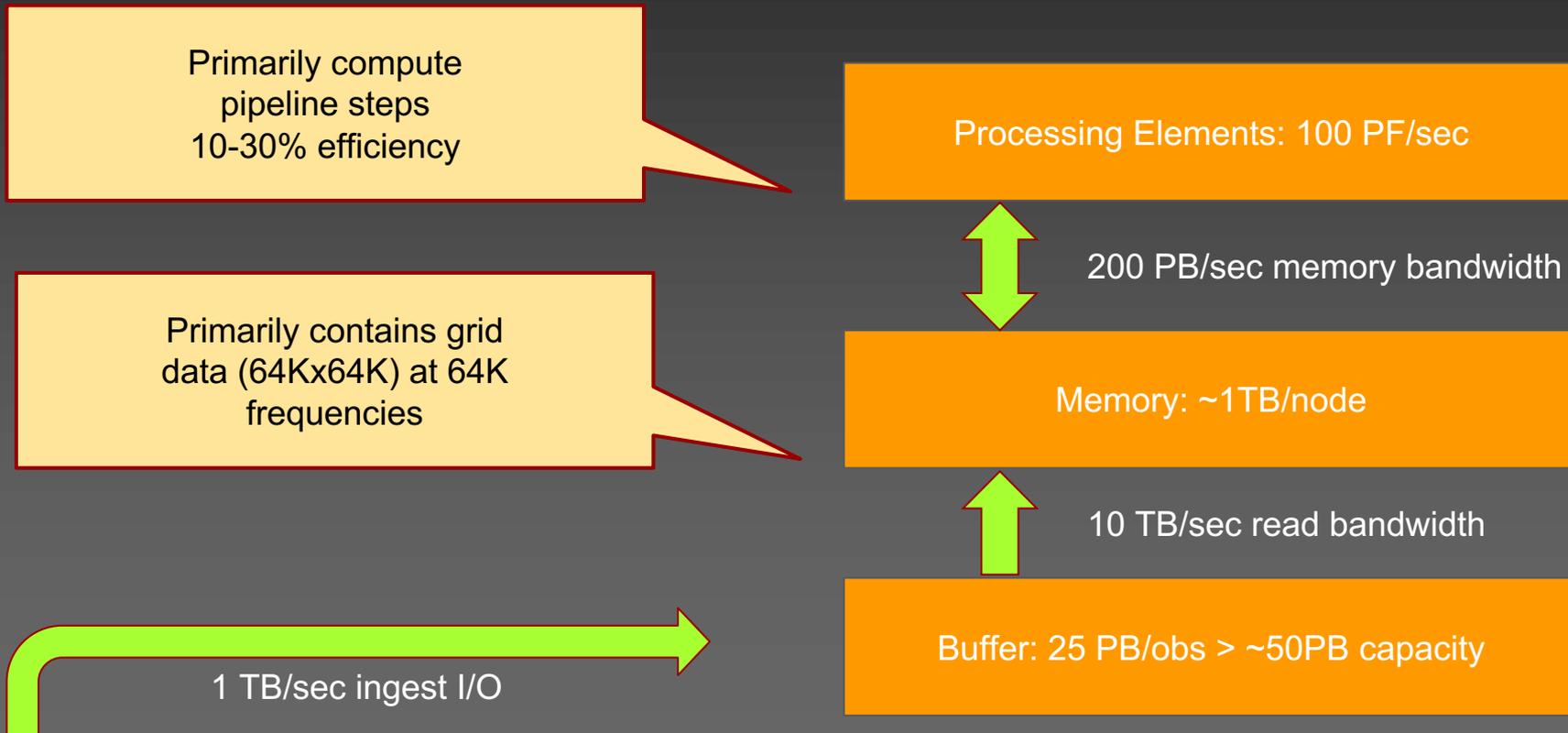
HPC Processing  
2024: 300 PFlop  
2030: 30 EFlop

**In: 20 EB in -> out: 100 TB**

# SDP top-level compute challenge



# Data Movement



# Supercomputer parameters

2025	LFAA (AU)	Mid (SA)
FLOPS	100 PF	360 PF
Memory bandwidth	200 Pb/sec	200 Pb/sec
Buffer Ingest	7.3 TB/s	3.3 TB/s
Budget	45 M€	3.3 TB/s
Power	3.5 MW	2 MW
Buffer storage	240 PB	30 PB
Storage / node	85 TB	5 TB
Archive storage	0.5 EB	1.1 EB

## Memory Bandwidth

- Cost
- Energy
- 10x 1st EF BW

# Memory ... SKA's biggest challenge

High Bandwidth Memory (HBM) is becoming dominant for HPC

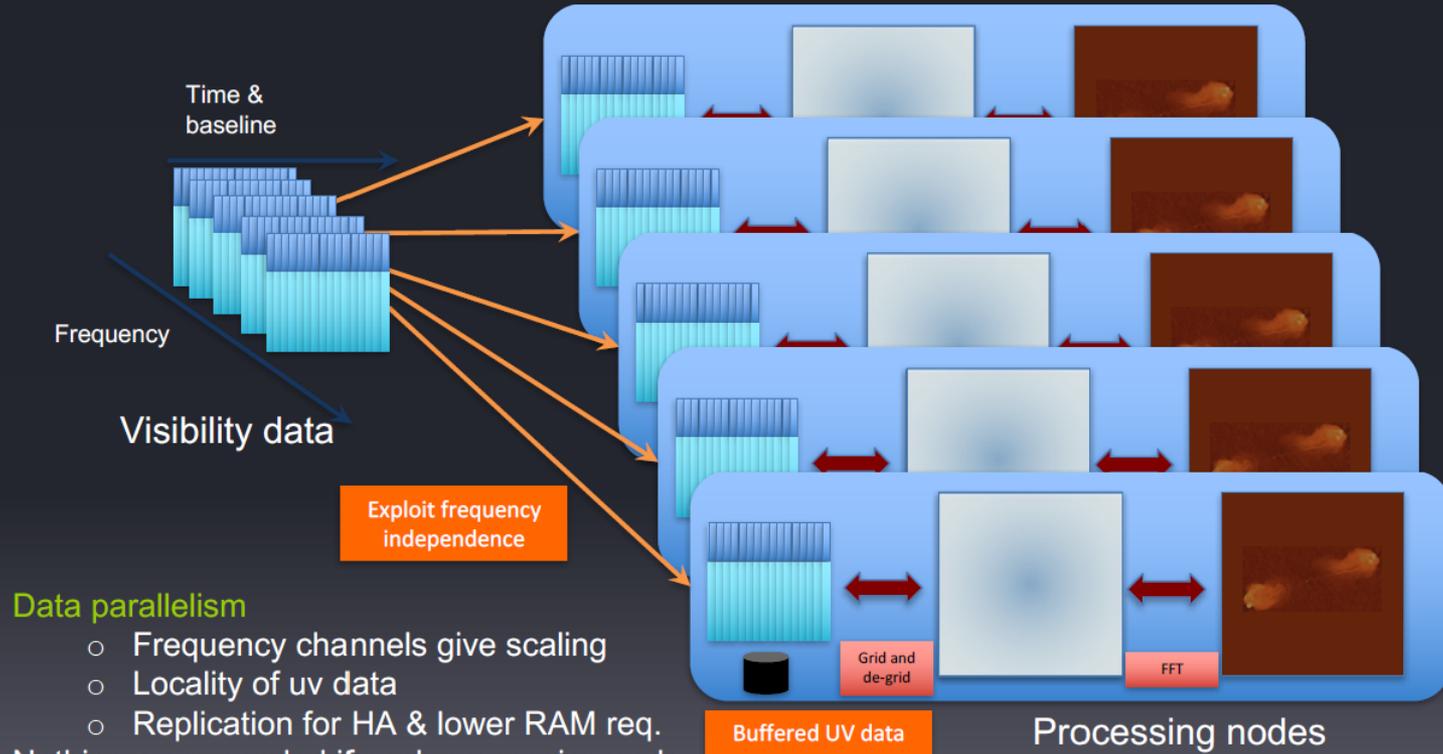
In 2013 the problem looked perhaps out of reach

HBM is 3D, on package, memory

10x bandwidth of RAM, perhaps similar cost

***Delay in SKA the deliverables*** has been very helpful

# Data Flow on System Architecture



## Data parallelism

- Frequency channels give scaling
  - Locality of uv data
  - Replication for HA & lower RAM req.
- Nothing more needed if each processing node can process a frequency channel completely

# Visibilities & Baselines distribution

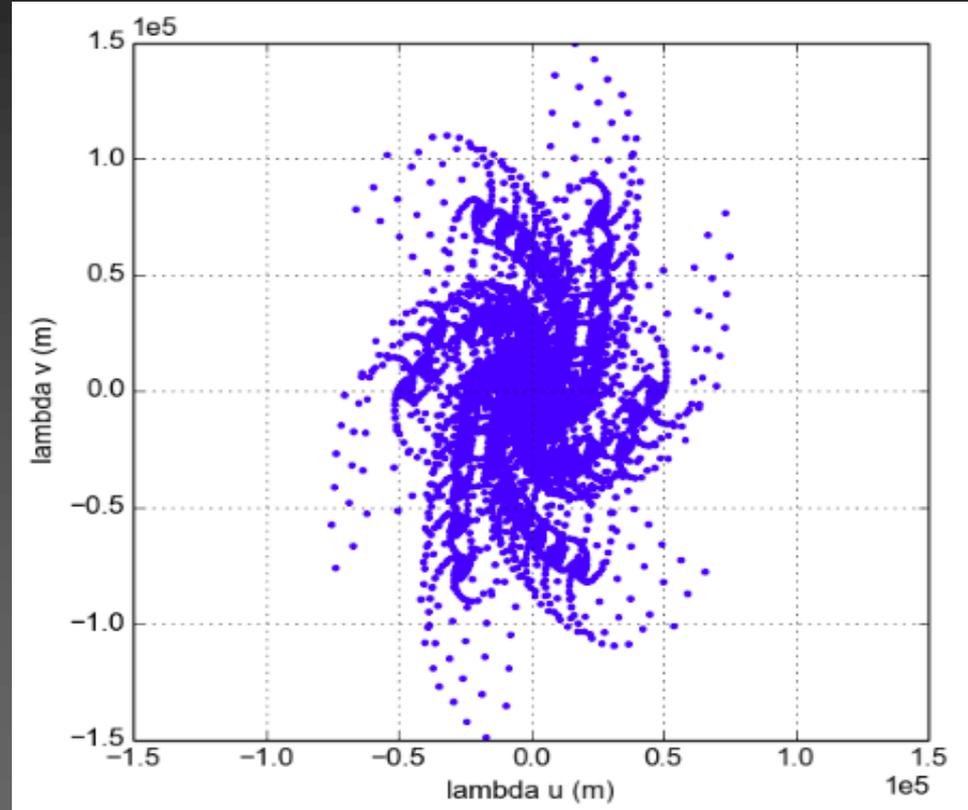
Each pair of telescopes has a **baseline**

Baselines rotate as time progresses

Each baseline has associated visibility data (“sample”)

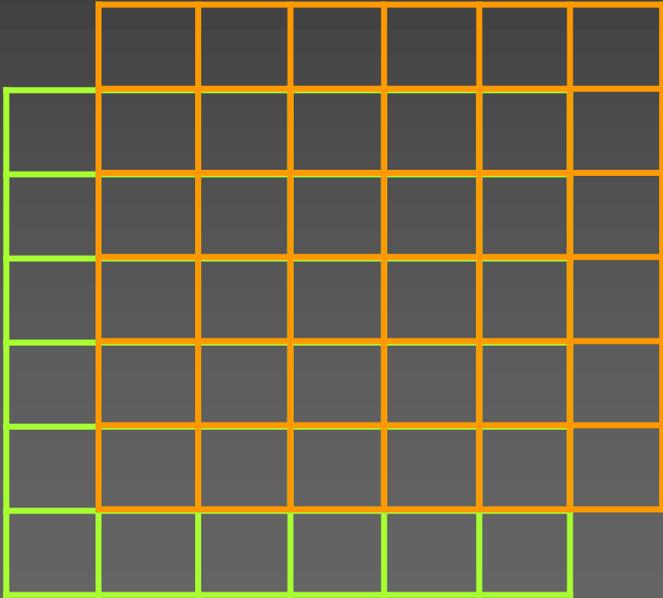
Baselines are sparse & not regular, but totally predictable

The **physical data structure** strongly enables and constrains concurrency & parallelism



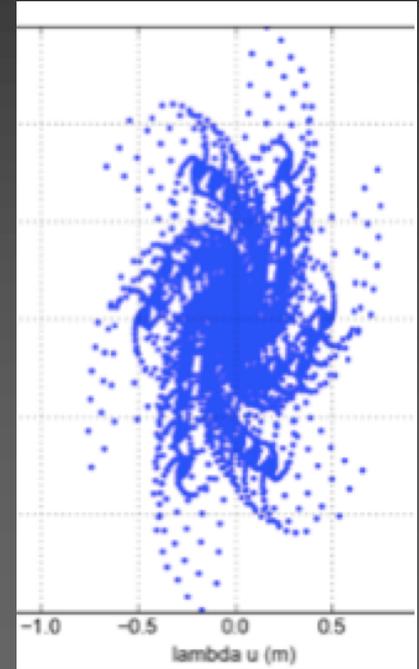
Simulated data from 250 SKA1-MID dishes

# Visibility gridding & cache re-use



Time rotation of  
UV grid.

Only fetch edges  
Re-use core



# Long vs short buffer question

Processing requires up to 6 hours of ingest – buffer that.



21,600 TB – “unit of data ingest” to compute on

Overlapping ingest and compute: double buffer ?



Double Buffer: ~50PB, write 1TB/sec, read 10TB/sec

But processing time is uneven –

**double buffer: minimizes storage cost,  
at expense of equally quick execution of worst compute cost**

# Stream fusion

Some kernels exchange too much data

Solution: deviate from pipeline actors

do more operations and less data movement.

Few compilers / frameworks automatically

Doing it manually is awkward for portability

# Conclusions

# Conclusions

Computing is extremely central, well beyond the instrument  
e.g. applying AI / ML to analyzing the science data

Astrophysics has everyone's attention – this project must succeed

SKA will succeed based on astrophysics  
but its computing lies on the frontier of big data handling

Software may be the highest risk and hardest problem of all

Thank you.

questions?

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