Meq Silhocette

mm-VLBI simulations and parameter estimation







Roger Deane Rhodes University / SKA SA

outline

- MeqTrees: overview and past successes
- MeqSilhouette: mm-VLBI simulation pipeline (pre-alpha)
- Bayesian capabilities and plans

The Measurement Equation

 MeqTrees is (mostly) about building measurement equations, e.g.:



- An m.e. decomposes the observed visibility V_{pq} into intrinsic source properties and per-antenna Jones terms.
- Can describe an endless variety of (linear) physics.
 can add pol. leakage, field rotation angle, etc.

MeqTrees

"Meg" = Measurement Equation

"Trees" = computational trees

Trees = Expression Trees

• Any mathematical function can be represented by a tree:

 $f = \alpha * \sin(b * x + c * y + 1)$



MeqTrees Architecture



A library of RIME components



- TDL scripts essentially specify the structure of RIMEs on the meqserver side
- Modules provide many "pre-cooked" components

| ۲ | TDL Compile-time Options | | | |
|--------|--|---|-----------|-------|
| | Start Purr on this MS Simulation mode: Read additional uv-model visibilities from MS | 0 | sim only | ^ |
| Þ | Measurement Equation options | | PSvTensor | |
| Þ | Sky model | | | |
| Þ Þ | Use Z Jones (ionosphere) Use L Jones (parallactic angle or dipole rotation) | | | |
| ~ | Use E Jones (beam) Use 'Siamese.OMS.analytic_beams' module Use 'Siamese OMS pyheams, fits' module | 0 | | |
| | Use 'Siamese.OMS.paf_beams' module Use 'Siamese.OMS.fits_beams0' module | Ŏ | | Ξ |
| | Use 'Siamese.OMS.vla_beams' module Use 'Siamese.SBY.lofar_beams' module Apply pointing errors to E | 0 | | |
| | Advanced options UV-plane components | Û | | |
| | Use P Jones (feed angle) Use G Jones (gains/phases) Add noise | | | |
| - | Random generator seed: | 0 | time | |
| | Compile | | 😣 Ca | incel |

Performance / Flexibility

 Instrumental subtleties can be implemented very rapidly (10s of lines of Python vs. 100s of lines of C++)



- Without necessarily sacrificing performance
- For extra flexibility, particularly tricky nodes can be prototyped in Python
 - (and historically, none of these "prototypes" have ever needed to be rewritten)

Example applications:

- High dynamic range calibration & imaging (direction dependent calibration, etc.)
- Evaluation of beam-related effects
- Prime focus vs offset Gregorian performance
- Element gain drifts in phased array feeds
- Fundamental sensitivity limits due to beam instability
- Ionosphere and Epoch of Reionization sims
- Weak lensing simulations (incl. SKA1)
- MC & Bayesian sampling
- Generating training data for machine learning

3C147 field — JVLA L-band (C/D config) Oleg Smirnov & Rick Perley

regular self-cal



full stokes primary beam correction (no more JVLA beam squint)





Phased array feed calibration

- 50 deg² with 2 pointings down to 0.5 mJy/beam with ASKAP/BETA
- fully automated MeqTrees pipeline employing differential gains
- ~2200 sources detected above 5σ



credit: Ian Heywood

Direction-dependent gains for accurate bright source subtraction

- X-band JVLA observation of the WHT deep field
- bright source (4C +00.02, the phase calibrator) near the first primary ightarrowbeam null
- impossible to calibrate without MeqTrees differential gain solutions and accurate source subtraction.



JVLA Stokes I beam



CASSBEAM software, Walter Brisken, NRAO

Heywood et al., MNRAS, 428, 935, 2013

Antenna pointing error solutions



- subset of antennas in the WSRT deliberately mispointed (shown in blue)
- MeqTrees was able to determine to reasonable accuracy the precise offsets from the intended pointing (shown in red)
- resulting pointing offset solutions (as a function of time) revealed a regular pointing 'wobble' on some antennas that was not previously known



- MeqTrees is focussed on "niche" problems
- pushing interferometers to their limits by parameterising very subtle effects and solving for them
- recently made a big push towards Bayesian methods
- **KEY POINT:** parameters can (and should!) be a combination of source and instrument if this impacts the inferences that are made

simulating (and solving for) these effects is all in place for connected element, cm-wave radio interferometry

all that we need to do is tailor it to mm-VLBI

Meq Silhouette

robust, repeatable measurements



joint fitting of instrumental and science parameters

in the visibility domain

interferometric simulations

Richard Feynman's dictum

"What I cannot create I do not understand"

Richard Feynman's dictum:

"What I cannot create I do not understand"

"If you can simulate it, you can solve for it"

— Oleg Smirnov

an end2end simulator

- form your measurement equations (python script, GUI, html interface)
- **inputs:** GR-MHD images, point srcs, etc. (full Stokes)
- **add corruptions** of choice (gain errors, polarization leakage, tropospheric model, pointing error, etc.)
- **simulate and image** (with a range of imaging algorithms)s
- automated metrics (e.g. polarization ratios, Radon transform, etc.)
- parameter estimation (MCMC and Bayesian model selection)

Monika's GR-MHD simulation jet at inclination = 30 deg; RA,Dec = M87



stations: SMA, LMT, CARMA, SMT, Pico Veleta, PdBI, ALMA, GLT 12 hour track, elevation > 15 degrees

Monika's GR-MHD simulation jet at inclination = 90; RA,Dec = M87



stations: SMA, LMT, CARMA, SMT, Pico Veleta, PdBI, ALMA, GLT 12 hour track, elevation > 15 degrees ...just add water corruptions

troposphere

- lots of work in MeqTrees on this for ionosphere (by Ilse, Pimm to continue(?))
- must be physical
- easily understand your risks (if *N* stations not participating due to weather)
- we have a lot of information on the sites already (and can envision each site having PWV radiometers in the future)

pointing errors

- seems more of problem than I originally thought
- substantial fractions of primary beam
- can calibrate out in station-dependent complex gains, but then there is dynamic pointing error

further effects

- intrinsic source variability
- ISM scattering

a point-and-click end-2-end simulator

RODRIGUES

RATT Online Deconvolved Radio Image Generation Using Esoteric Software

> created by: Sphesihle Makhathini Gijs Molenaar Oleg Smirnov



RODRIGUES

- browser-based, pipeline running on backend of GCE or HPC centre in Cape Town
- parametrised, platform independent scheduler
- Can be deployed on a laptop, cluster, cloud (Google Compute Engine, Amazon Web Services)
- Offers a standardised framework for comparing data reduction techniques (calibration, imaging, source finding, etc.)

Create new simulation

| Observatory | LWIMAGER deconvolution settings | CASA deconvolution settings |
|--|---------------------------------|---------------------------------|
| Name New simulation | Deconvolve with me! | Deconvolve with me! |
| Observator V MeerKAT | | NITER 1000 |
| SEFD JVLA-A | | Loop Gain 0,1 |
| System detaults will be used if left blank | Loop gain 0,1 | Clean Loop gain |
| Output type Visibilities \$ | Clean Threshold 0 | Threshold 0 |
| | Clean sigma level | Clean sigma level 0 |
| | In sigma above noise | In sigma above hoise |
| Sky Model | Clean algorithm csclean | PSF mode clark \$ |
| | Scales for MS 4 | Imager mode csclean 🛊 |
| Sky type | clean | Grid mode widefield \$ |
| Sky Choose File No file chosen | Clean scales | A-projection only works JVLA |
| KATALOG n | | ASA clean task |
| Ch | | |
| Radius 0,5 | 1 available | for |
| Rad | | |
| Flux 0.0 range Flui | | Volution scales in |
| Add noise | Cilhauat | 40 |
| | | ASA clean task |
| noise std Ger | | |
| | | ASA clean task |
| | me! | Restoring beam |
| Observation setup | NITER 1000 | Cycle factor 1,5 |
| | Minor loop gain 0,1 | Cycle speed up -1 |
| Synthesis time 0,25 | Major loop gain 0,9 | |
| in hours | Clean Threshold 0 | |
| Integration time | In Jy | MORESANE deconvolution settings |
| in seconds | Clean sigma 0 | |
| in MHz | level In sigma above noise | Deconvolve with me! |
| Channel width 50000 0 | Join 🗌 | Scale count |
| in kHz | polarizations | See MORESANE help |
| Channola | Join channels | Start scale 1 |

Create new simulation

| Observatory | | | | |
|-------------|---|--|--|--|
| | | | | |
| Name | New simulation | | | |
| SMT | | | | |
| CARMA | | | | |
| LMT | | | | |
| ALMA | | | | |
| PV | | | | |
| PdBI | | | | |
| Hawaii | | | | |
| GLT | Choose antennae set for observation | | | |

Observation setup

| obslength time | 0,25 |
|------------------|------------------------|
| | in hours |
| Integration time | 10 |
| | in seconds |
| Start frequency | 230 |
| | in GHz |
| Channel width | 4 |
| | in GHz |
| Channels | 1 |
| | Number of frequency |
| | channels |
| lower elevation | 10 |
| flag | degrees |
| Start Time | 2009/04/06/12:20:00.00 |
| | |

| Noise | |
|-----------|--------------------------------------|
| Add noise | ✓ defaults taken from Lu. et al 201? |
| SMT | 11900 |
| CARMA | 3500 |
| LMT | 560 |
| ALMA | 110 |
| PV | 2900 |
| PdBI | 1600 |
| Hawaii | 4900 |
| GLT | 7300 |
| | |

ISM scattering gaussian

| Ismscatter | |
|----------------|-----------------------------|
| major axis | 1,309 mas/cm^2 |
| minor axis | 0,64 mas/cm^2 |
| rotation angle | 78 degrees East of North |

Submit simulation

imaging settings

| Image size | 128 in pixels (default is input image size) |
|-------------------------|---|
| Pixel size | 1 in micro arcseconds (default is input pixel size) |
| UV weight | uniform |
| robust | 0 |
| Clean operation | clark 🜲 |
| Number of iterations | 0 for a dirty image set this to zero |
| Loop Gain | 0,1 |
| Clean Threshold | 0 |
| STOKES | 1 |
| | |
| | |

Sky Model

fitsfile Choose File No file chosen

if blank a default image will be chosen

| Visibility outputs | |
|--------------------------------|--|
| Export Measurement Set <a> | |
| Export UV FITS | |
| | |

pipelined output:

| R.O.D.R.I.G. | .U.E.S. List jobs Create job | | logged in as deane | Log out |
|--------------|---|---------------------------|--------------------|---------|
| | Results for job #8 (defaults-test) | | | |
| | Job properties | | | |
| | status: FINISHED start: April 16, 2015, 3:13 p.m. finished: April 16, 2015, 3:15 p.m. duration: 0:01:26.051622 docker_image: skasa/simulator results_dir: 8-qqysnq9y | Reschedule Refresh Delete | | |

| Result files | | | | |
|--|---|----------|-----------------------------|------------------|
| name | type | size | modified | actions |
| input/parameters.json | ASCII text, with very long lines, with no line terminators | 2.2 KB | Thu Apr 16 15:13:57 2015 | view download |
| output/log-ska1sims.txt | ASCII text | 5.8 KB | Thu Apr 16 15:14:10 2015 | view download |
| output/results-psf.fits | FITS image data, 32-bit, floating point, single precision | 16.0 MB | Thu Apr 16 15:15:22 2015 | view download |
| output/results-dirty.fits | FITS image data, 32-bit, floating point, single precision | 16.0 MB | Thu Apr 16 15:15:17 2015 | view download |
| output/results-uvcov.png | PNG image data, 1500 x 1500, 8-bit/color RGBA, non- interl | 178.0 KB | Thu Apr 16 15:14:11 2015 | view download |
| output/plots-smakh1429190037.661782/log- smakh1429190037.661782.txt | ASCII text, with very long lines | 12.4 KB | Thu Apr 16 15:15:22 2015 | view download |

pipelined output:



| Console output | |
|---------------------------------|--|
| | |
| running #!/bin/bash -ve | |
| if [-z "\$1"]; then DATA=/ | |

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Bayesian Inference / Parameter Estimation

the problem with MCMC methods in interferometry



mm-VLBI (Bayesian) advantages

- relatively few stations
- required FoV is very small
- low dynamic range, not much cleaning (if needed)
- no clear direction-dependent effects

= rapid simulate-imagelikelihood compute cycle time

an example:



- simultaneously solve for pointing error and source flux
- covariance matrix with both instrumental and source parameters

Lochner+2015

jointly solved flux densities and pointing errors

Lochner+2015

model selection

that includes calibration systematics

Scattering at 230 GHz

0

0.33 Orbital Phase

0.67

Doeleman+2009

...but not just post-processing and parameter estimation

- plenty of priors available:
 - typical weather patterns
 - PWV measurements
 - typical pointing accuracy rms

future advantages

- MeqTrees development is "complete" (~10 years development by Oleg Smirnov and others)
- Now the focus is on simulation (and calibration) pipelines; as well as Bayesian techniques
- Large team, primarily focussed on MeerKAT, HERA/PAPER, SKA1
- MeqSilhouette will benefit directly from any development in MeqTrees (e.g. RODRIGUES, GPU acceleration, imaging algorithms)

so watch this space, but

COMMENTS / REQUESTS / SUGGESTIONS

would be most welcome at this point

more information

http://meqtrees.net

https://github.com/ska-sa/meqtrees