Parametrization of the Measurement Equation





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IS.

• Generic Measurement Equation:

$V^{Obs}_{_{ij}}(u)$	$=J_{ij}(v,t)\int J_{ij}^{S}(\boldsymbol{S},v),$	t) $I(S)$ ϵ	$e^{i S.B_{ij}} d S$
Data	Corruptions	Sky	
$J_{ij} = J_i \otimes J_j^*$:direction independen	t corruptio	ns.
$\boldsymbol{J}_{ij}^{s} = \boldsymbol{J}_{i}^{s} \otimes \boldsymbol{J}_{j}^{s*}$:direction dependent ((image plan	e) corruptior

•
$$V_{ij}^{Obs} = J_{ij} W_{ij} E_{ij} V^o$$
 where $E_{ij} = F J_{ij}^s F^T$

 $- J_{ii}$ is multiplicative in the Fourier domain

- J_{ii}^{s} is multiplicative in the Image domain only if $J_{ii}^{s} = J_{ii}^{s}$

- $WF \equiv A$: The Measurement Matrix



• Calibration:

- → Keep sky fixed: $min: |V_{ij}^{Obs} J_{ij} \cdot V_{ij}^{M}|^{2}$ w.r.t. J_{ij}
- → V^{M} = Data on a source with known structure (Primary Cal.)
- Imaging: A^{-1} does not exist. Non-linear inversion required • Keep J_{ij} fixed $min: |J_{ij}^{-1}V_{ij}^{Obs} - AI^{M}|^{2}$ w.r.t. I^{M} • Final image: $I = I^{M} / PB$
- Self-Calibration: Treat J_{ij} and V^{M} (or I^{M}) as orthogonal • Iteratively, but independently, improve J_{ij} and V^{M}



• Unknowns of the ME

- Sky: Position, Flux, scale
 Frequency, polarization & time dependence
- Known effects
 - W-term, PB, dependence of PB on poln. and frequency
- Unknown instrumental & atmospheric effects
 - Complex gains, poln. leakage (direction indep.)
 - Pointing, PB deformation, ionosphere



• Parametrization of the ME in existing algorithms :

$$V_{ij}^{Obs}(v) = J_{ij}(v,t) \int J_{ij}^{S}(S,v,t) I(S) e^{\iota S.B_{ij}} dS$$
$$J_{ij}^{S}(S,v,t) = PB: \text{ Indep. of } t,v,S \& i-j$$
$$I(S) = \sum_{k} P(x_{k},y_{k}): \text{ Pixel Basis}$$
$$J_{..}(v,t) = J_{.}(v,t) \otimes J_{..}^{*}(v,t): \text{ Direction indep}$$

 More sophisticated parametrization required for imaging dynamic range (DR) >50dB

- Correct for PB effects, DD atmospheric effects
- Scale sensitive image decomposition



- Use of pixel basis for image representation: deconvolution errors limit: DR ~ 10⁴-10⁵
- Single pointing L-Band observations limited due to pointing/PB asymmetries: ~DR ~ few X 10⁵.
 - Next generation telescopes hope to do >10x better
- Mosaicking dynamic range limited by pointing errors and azimuthally asymmetric PB/sidelobes.
- Frequency dependence of the sky & the instrument: DR ~ 10⁴-10⁵



- Decomposition of the sky in a more appropriate basis
 - → Frequency sensitive
- Efficient algorithms to correct for image plane effects
 - Approximate inverse transform (Vis -> Image)
 - → Forward transform (accurate)
- Solvers for the "unknown" image plane effects
 - → As expensive as imaging!
- Larger computers! (More memory, CPU power, fast I/O)
 - → Parallel computing and I/O, GPU computing?



• Pixel-to-pixel noise in the image is correlated

 $I^{D} = PI^{o} + PI^{N}$ where P = Beam Matrix

The scale of emission *fundamentally* separates signal (l°) from the noise (l^{N}).

- Asp-Clean (Bhatnagar & Cornwell, A&A,2004)
 - Search for local scale, amplitude and position



General Structure of the Imaging Algorithms



Solve the normal equation

- → Compute the approx. update direction: $I^R = A^T [\Delta V^R]$
- → Update the model: (Minor Cycle) $I_i^M = T(I_{i-1}^M, I^R)$ (Steepest Descent minimization: Clean algorithm)
- → Compute residuals: (Major Cycle) Forward: $\overrightarrow{V^{M}} = A \overrightarrow{I^{M}}$ Backward: $\overrightarrow{I^{R}} = [A^{T}A]^{-1}A^{T}\overrightarrow{V^{R}}$

 $A^{T}[\vec{V} - A\vec{I}] = 0$

- Transform implemented using FFT:
 - → Forward transform: $CA = V^M = C[A\vec{I}^M]$
 - → Backward transform: $[CA]^{-1} = A^T C^T$
- Approximate methods:
 - Accurate forward and approximate backward transform is sufficient

Hierarchy of Algorithms



- Unknowns of the problem: J_{ij} , J^{s}_{ij} , and I^{M} .
- $J_{i}^{s} = J_{i}^{s}$ and *independent* of time

Imaging and calibration as orthogonal operations

• $J_{j}^{s}(t) = J_{j}^{s}(t)$ (Poln. squint, PB correction, etc.) (Cornwell,EVLA Memo 62)

→ J^{s}_{ij} is multiplicative in the image plane for appropriate ∇T $\Delta I^{D} \propto \Re \left[\sum_{n} J^{s^{T}}(n \nabla T) \sum_{ij} [\Delta V_{ij}(\nabla T) e^{\iota S.B_{ij}}] \right]$



- $J_i^s(t) \neq J_i^s(t)$ (Pointing offsets, PB variations, etc.)
 - Image plane effects not known a-priori
 - Pointing selfcal (EVLA Memo 84)
 - → Correct for J^s_{ij} during image deconvolution
 ◆ W-Projection, PB-Projection
 (EVLA Memo 67) (EVLA Memo 100)

• Simultaneous solver for J_{ij}, J^s_{ij} , and $I^M !!$



E_{ij} as a function of direction is measured a-priori (nominal full beam polarimetric imaging)

$$V_{ij}^{M} = E_{ij}[AI^{M}]_{ij}$$
 where $E_{ij}(u_{i}, u_{j}; p_{i}, p_{j}) = E^{o}f(p_{i}, p_{j})$

<u>Aperture Function</u>: *E_i different* for each poln. product *pq and* baseline (pointing offsets correction)

Needs a solver: Pointing SelfCal

<u>Asymmetric Primary Beams:</u>

Parameterize E°



• Full Stokes imaging requires full Sky-Muller matrix

$$J_{i}(S) = \begin{bmatrix} J_{i}^{p} & J_{i}^{pq} \\ J_{i}^{qp} & J_{i}^{q} \end{bmatrix}$$
$$\begin{bmatrix} OUT_{pp} \\ OUT_{pq} \\ OUT_{qp} \\ OUT_{qp} \end{bmatrix} = \begin{bmatrix} J_{i}^{p} J_{j}^{p^{*}} & J_{i}^{p} J_{j}^{pq^{*}} & J_{i}^{pq} J_{j}^{pq^{*}} & J_{i}^{pq} J_{j}^{qp^{*}} \\ J_{i}^{qp} J_{j}^{qp^{*}} & J_{i}^{qp} J_{j}^{qq^{*}} & J_{i}^{pq} J_{j}^{qp^{*}} & J_{i}^{pq} J_{j}^{qq^{*}} \\ J_{i}^{qp} J_{j}^{p^{*}} & J_{i}^{qp} J_{j}^{pq^{*}} & J_{i}^{q} J_{j}^{pq^{*}} & J_{i}^{q} J_{j}^{qp^{*}} \\ J_{i}^{qp} J_{j}^{qp^{*}} & J_{i}^{qp} J_{j}^{qq^{*}} & J_{i}^{q} J_{j}^{qp^{*}} & J_{i}^{q} J_{j}^{qq^{*}} \\ J_{i}^{qp} J_{j}^{qp^{*}} & J_{i}^{qp} J_{j}^{qq^{*}} & J_{i}^{q} J_{j}^{qp^{*}} & J_{i}^{q} J_{j}^{qq^{*}} \end{bmatrix} \begin{bmatrix} IN_{pp} \\ IN_{pq} \\ IN_{qp} \\ IN_{qq} \end{bmatrix}$$
$$J_{ij}(S) = J_{i}(S) \otimes J_{j}^{*}(S)$$

- $J_i^p(S) \equiv$ Antenna voltage patterns
- $J_i^{pq}(S) \equiv$ Polarization leakage
- $J_{ij}(S)$ is not identity or even diagonal matrix for DR > 10⁴

Structure of the Sky-Muller Matrix





Correction of DD effects during imaging

- A class of Direction Dependent effects can be corrected during imaging
 - The effect should be "band limited"
 - Incorporate DD but "band limited" effects in the operator C
 - The operator C should be unitary (or approximately so)
- Devise an approximate backward and accurate forward transform
- Forward transform:

- Replace the operator C by: $E_{ij}^{P} = E^{P'} f (\phi_i - \phi_j) e^{\iota(\phi_i - \phi_j)}$

• Backward transform:

$$- V^{P,G}(n\Delta u, m\Delta v) = (E_{ij}^{P^{T}}V^{P}(u_{ij}, v_{ij}))(n\Delta u, m\Delta v)$$
$$I^{d} = det(F^{T}[E^{P^{T}}])^{-1}F^{T}V^{P,G}$$



Model for VLA antenna power patterns at L-band (modeling code courtesy W.Brisken)



Approximately Unitary Sky-Jones Matrix





Real part of $J_i J_i^T(0,1)$



Imag. part of $J_i J_i^T(0,1)$



Stokes-I imaging with and without PB effects (Polarization squint, Pointing offsets, PB rotation)



RMS ~15µJy/beam

RMS ~1µJy/beam

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Stokes-V imaging with and without PB effects (Polarization squint, Pointing offsets, PB rotation)











Pointing correction





Model image using 59 sources from NVSS. Flux range ~2-200 mJy

Details in EVLA Memo 84 (2004) http://www.aoc.nrao.edu/evla/geninfo/memoseries/evlamemo84.pdf



Continuous lines: Typical antenna pointing offsets for VLA as a function of time (Mean between +/-25" and RMS of 5").

Dashed lines: Residual pointing errors. RMS ~1".

Pointing Selfcal



Stokes-I imaging: Before and after pointing correction



Pointing Selfcal



Stokes-V imaging: Need to use component imaging?



Pointing selfcal: Unit test







Code development time much longer

- → <u>Complexity code base</u>
 - Partly unavoidable
 - Improvements: Possible & Necessary
 - Use of simpler UI (UNIX command-line, inp/set/save/go)
 - Currently usable on real data (minus data selection)
- → <u>Complexity algorithm</u>
 - Very difficult to predict (more difficult in evolving code-base)
 - Can run into dead-ends
- Optimization and stability/robustness
 - From "working algorithm" to "usable implementation"
 - Stability/robustness/numerical testing: Time consuming & related to the code-base complexity/stability/evolution.



- Use aperture function / eliminate re-gridding [Done]
- Write the imaging and solver code [Done]
- SelfCal <-> imaging iterations [Testing]
- Component image model (Asp-Clean + PB-Projection + W-Projection) [Next]
- Is current deep L-band imaging pointing-error limited?
- Mosaicking dynamic range limited by pointing errors?
- Wide-band imaging
 - Use PB-projection to correct for PB scaling
 - MSF extensions: Freq. sensitive image plane modeling (Component based imaging)

- Significant increase in run-time due to more sophisticated parameterization
 - Deconvolution: Fast transform (both ways)
 - E.g. limits the use of MCMC approach
 - → Calibration: Fast prediction
- Cost of computing residual visibilities is dominated by I/O costs for large datasets (~500GB for EVLA)
 - Deconvolution: Approx. 20 access of the entire dataset
 - Calibration: Each trial step in the search accesses the entire dataset
- 10 -100 Gflops + multi Terabyte I/O load



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- 6.Bhatnagar, Cornwell & Golap, 2004, Solving for the antenna based pointing errors, Tech. rep., EVLA Memo 84
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http://www.aoc.nrao.edu/~sbhatnag/talks.html

Variable sidelobe gains





Maximum gain variations at the location of the sidelobes

Numerical errors: Variations in the peak of the sidelobe.

Image re-gridding vs. direct evaluation

Error Patterns





of the Stokes-I error pattern $AvgPB - PB(t_o)$