Constrained simultaneous algebraic reconstruction technique (CSART) – a new and simple algorithm for ionospheric tomography

#### Hobiger T., Kondo T., Koyama Y. Space-Time Standards Group Kashima Space Research Center National Institute of Information and Communications Technology (NICT), Japan





## SART

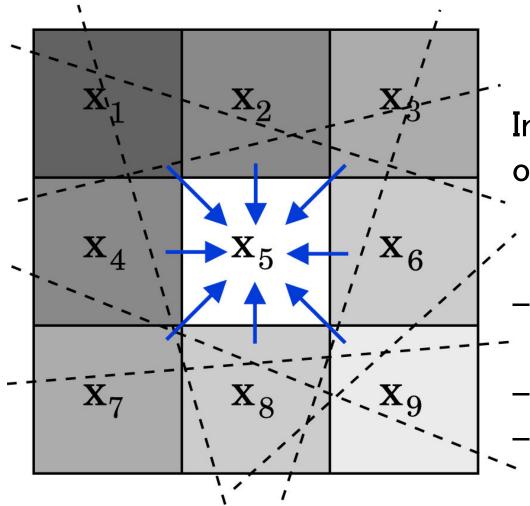
- Simultaneous algebraic reconstruction technique (SART) has been developed for medical applications
- Soon adopted for other (geo) scientific applications
- Easy to implement
- No matrix inversions
- Iterative process
- Several improvements concerning convergence speed (ART derivatives)
- But cells that are not crossed by rays are usually removed from estimation process  $\rightarrow \text{CSART}$

## SART (ctd.)

Andersen & Kak (1984)

$$\begin{split} x_{j}^{(k+1)} &= x_{j}^{(k)} + \frac{\omega}{A_{\oplus,j}} \sum_{i=1}^{M} \frac{A_{i,j}}{A_{i,\oplus}} \left( b_{i} - \bar{b}_{i}(x^{(k)}) \right) & \text{Iterator} \\ \begin{array}{l} \text{this ensures} \\ \text{convergence} \end{array} \left[ \begin{array}{c} A_{i,j} \geq 0 \\ A_{i,j} \geq 0 \end{array} \right] & \text{Path-length} \\ \text{in cell} \\ A_{i,\oplus} &= \sum_{j=1}^{N} A_{i,j} & \text{for } i = 1, 2, \dots, M \end{array} \begin{array}{l} \text{Cell: Tot. length} \\ \text{of all crossing} \\ A_{\oplus,j} &= \sum_{i=1}^{M} A_{i,j} & \text{for } j = 1, 2, \dots, N \end{array}$$

### C-SART - Basic idea



Introduction of artificial observations ("constraints")

$$x_{\gamma} - x_j = 0$$

 information transfer from surrounding cells

- 8 obs/cell (2D)

But: needs modification of SART since  $A_{i,i} > 0$  is violated !

$$\begin{aligned} \mathsf{CSART} &- \mathsf{mathematical prerequisites} \\ x_{j}^{(k+1)} &= x_{j}^{(k)} + \frac{\omega}{A_{\oplus,j}} \sum_{i=1}^{M} \frac{A_{i,j}}{A_{i,\oplus}} \left( b_{i} - \bar{b}_{i}(x^{(k)}) \right) \end{aligned} \qquad \begin{aligned} \mathsf{Iterator} \\ \mathsf{(unchanged)} \end{aligned}$$

Censor & Elfving (2002) have shown convergence for

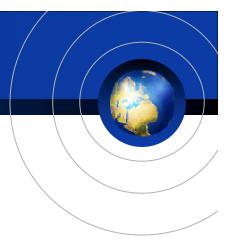
$$A_{i,\oplus} = \sum_{j=1}^{N} |A_{i,j}|$$
 for  $i = 1, 2, \dots, M$ 

Note: only absolute operator is introduced

$$A_{\oplus,j} = \sum_{i=1}^{M} |A_{i,j}|$$
 for  $j = 1, 2, \dots, N$ 

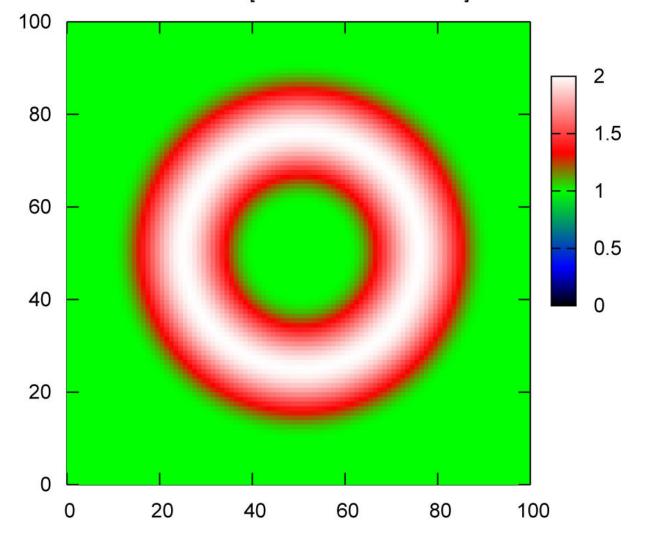
## GNSS tomography – test case

- Artificial 2D electron density field "donut"
- 100 x 100 cells
- 14 GNNS ground receiver
- 2 LEOs
- 6 GNSS satellites
- data from 3 epochs
- white noise with SNR 20 added
- DCBs are estimated too
- 288 obs. vs. 100022 unknowns
- no initial guess, starting from zero values at all cells
  Assumptions:
- Cycle slips corrected
- slant TEC already code leveled
- no ray-paths outside the model

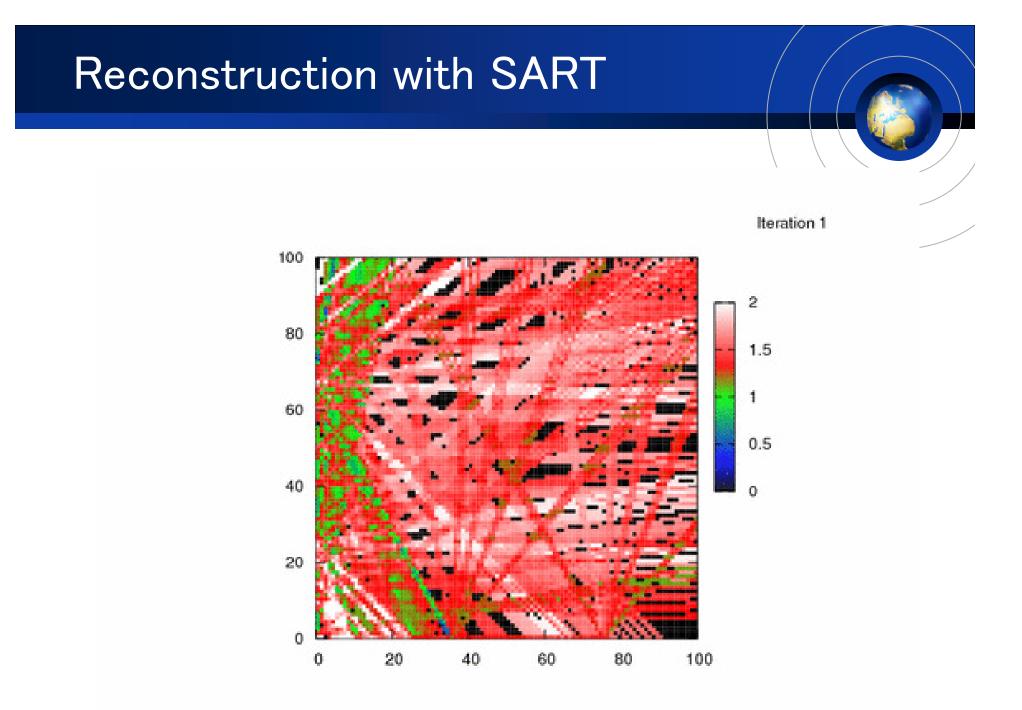


## GNSS tomography - test case(ctd.)/

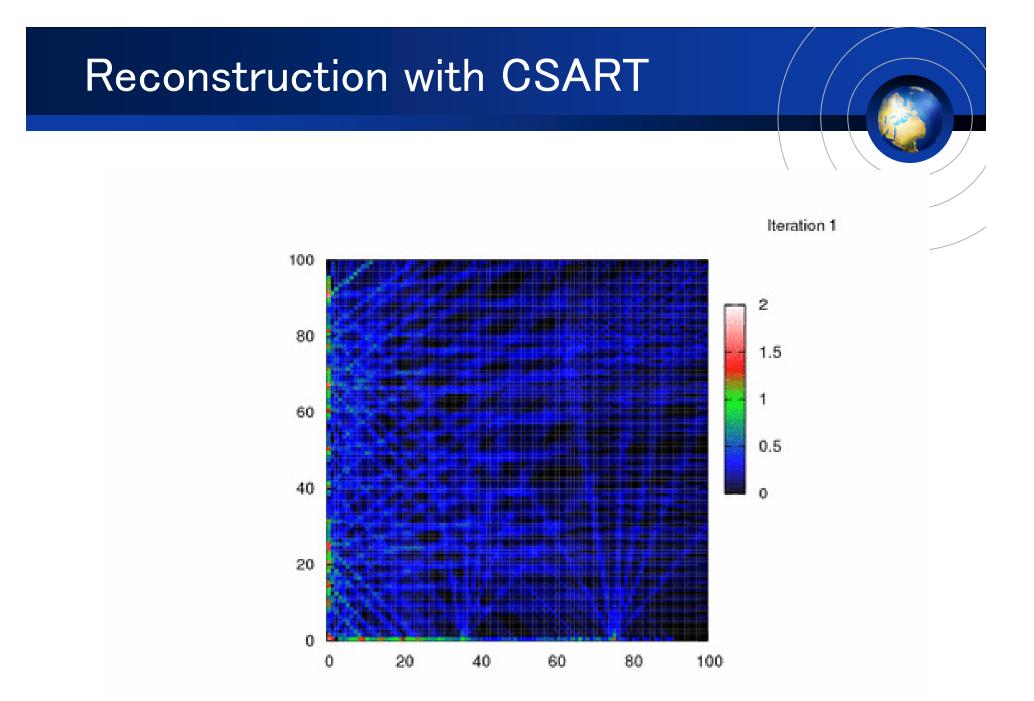
Test data set [arb. units of electr./m^3]



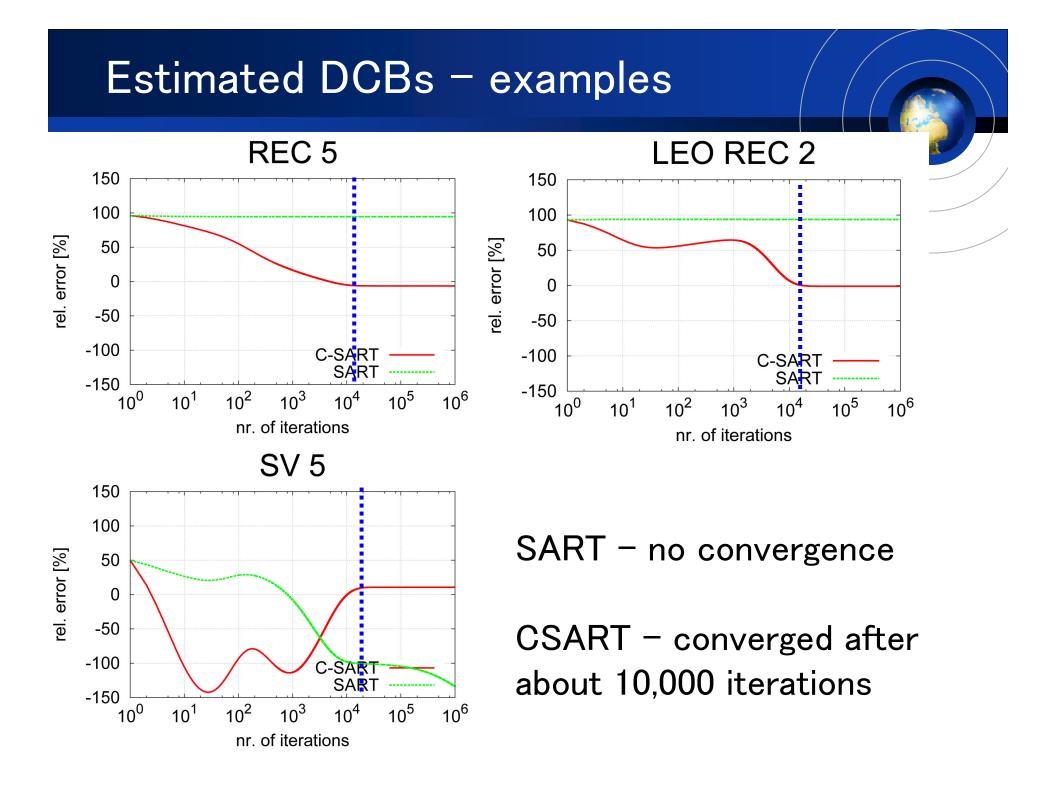
## GNSS tomography - test case(ctd.)/



(Note: time scale of animation is logarithmic)



(Note: time scale of animation is logarithmic)



#### Convergence Sum of squared improvements 10<sup>5</sup> C-SART (1585 sec) SART (899 sec) 10<sup>0</sup> 10<sup>-5</sup> $10^{-10}$ SSI 10<sup>-15</sup> $10^{-20}$ 10<sup>-25</sup> 10<sup>-30</sup>

SART does not converge, even after 1,000,000 iterations

10<sup>2</sup>

10<sup>0</sup>

10<sup>1</sup>

C-SART converges after about 100,000 iteration (159 sec)

10<sup>3</sup>

number of iterations

10<sup>4</sup>

10<sup>5</sup>

10<sup>6</sup>

## Performance summary

	SART	CSART
Avg. abs. err (el. density)	<b>52 %</b>	13 %
Avg. abs. err. (DCBs)	> 100 %	5 %
Convergence		100,000 iter.
Time for 10 <sup>6</sup> iter	900 sec	1585 sec
DCB convergence		10,000 iter.

## Outlook

- CSART can be applied to other scientific tasks (e.g. seismology, boundary value problems, …)
- The constraint operator can be chosen to consider physical conditions in the form of finite differences
- Good a-priori DCB values are much more important than ionosphere start model
- If the initial DCB are only 10% off in the "donut" example iteration time is reduced to 5 seconds.
- Started working on an expression for the computation of a "standard deviation equivalent" in order to judge the results by their "formal error"

## Outlook (ctd.)

- Actually routines are coded in C++
- Recoding in ASSEMBLER under progress, expected speedup factor 10–30x
- Support of multi-core processors via OpenMP<sup>™</sup>
- Online cycle-slip detection and phase-smoothing under development

#### <u>Thereafter</u>

- Tests using the Japanese GEONET & 3D voxel structure
- Verification of results by ionosonde measurements



## Thank you for your attention !



# NICT Kashima