

Adaptive cancellation of ground or overlying volume responses using multi-baseline InSAR acquisitions: first application to BIOMASS data

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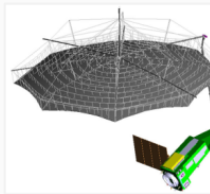
² CESBIO, University of Toulouse, France

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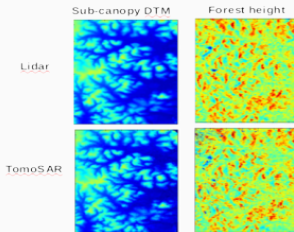
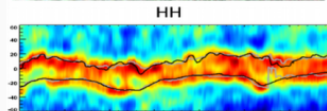
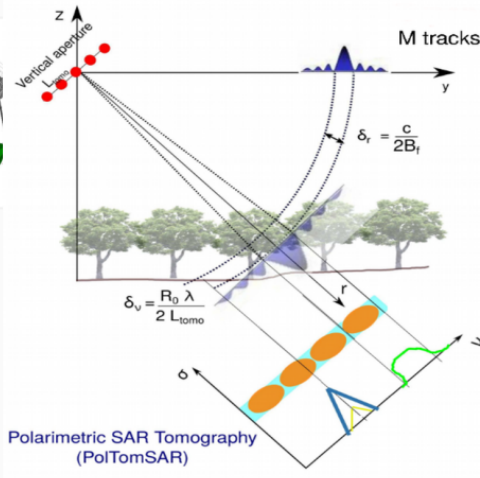
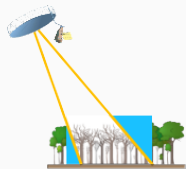
⁴ Ride group, Politecnico di Milano

⁵ ARESYS, Milan, Italy

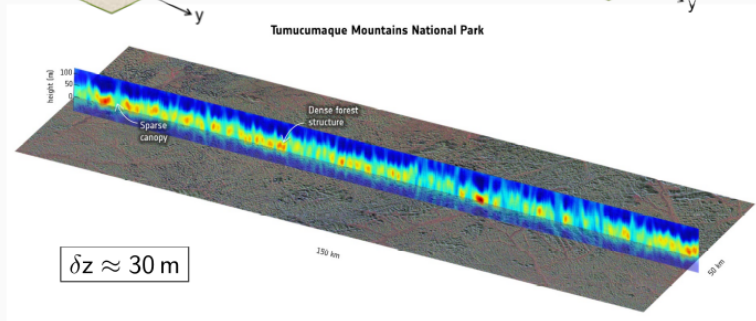
PolTomoSAR principle



BIOMASS
P-band
polarimetric SAR

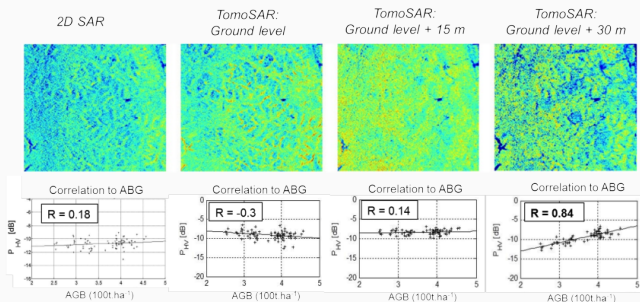


BIOMASS tomographic features



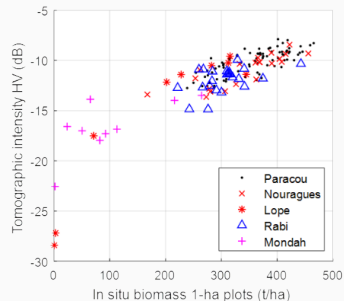
AGBD estimation using TomoSAR

Paracou



French Guiana: Paracou, Nouragues

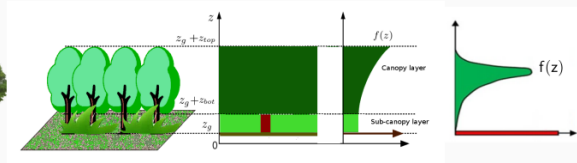
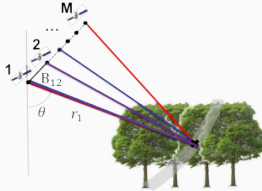
Gabon: Lope, Rabi, Mondah



D. Ho Tong Minh et al., "Relating P-band SAR tomography to tropical forest biomass", TGRS, Feb. 2014.
Ride group, PoliMi, ESA study

- AGBD: well correlated with $I_{HV}(z = 30\text{ m})$
- Ground echo leakage mitigation $\Rightarrow$ Ground notching

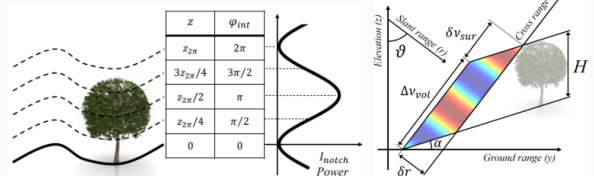
Interferometric ground-notching



- Two-tap notching filter
- Filtered intensity

$$I_{GN-In} \simeq \int_{C(x_0, r_0)} f(z) |H_{GN-In}(z)|^2 dz$$

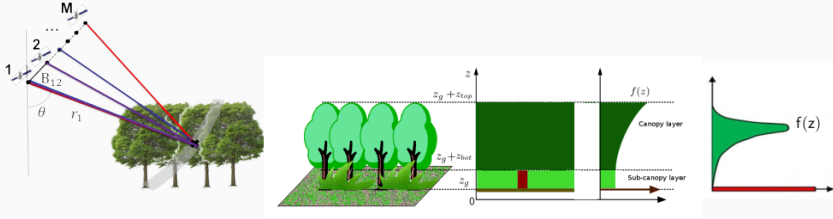
$$|H_{GN-In}(z)|^2 = \sin^2 \left(\frac{\Delta k_{z12}(z - z_g)}{2} \right)$$



M. Mariotti d'Alessandro et al., TGRS, 2020

$$\text{Ideally: } h_{amb} = 60 \text{ m} \Rightarrow |H_{GN-In}(30 \text{ m})|^2 = 1$$

Objective of SAR tomography



- Single-look complex MB-InSAR signal model

$$y_m \simeq \int_{C(x_0, r_0)} s(z) e^{ik_{zm}z} dz + \epsilon_m \quad m = 1, \dots, M$$

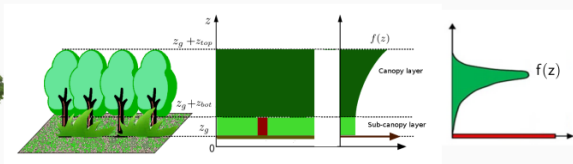
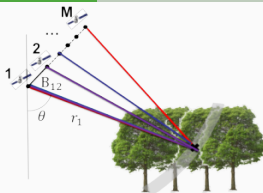
- Second-order statistics:

$$[R]_{mn} = E(y_m y_n^*) = \boxed{\rho(\Delta k_{zmn}) \simeq \int_{C(x_0, r_0)} f(z) e^{j\Delta k_{zmn}z} dz + \sigma_\epsilon^2 \delta_{m-n}}$$

- Objective: estimate $f(z)$ from multiple acquisitions (spectral sampling)

$$\boxed{\{\rho(\Delta k_{zmn})\}_{m,n=1}^M \longrightarrow \hat{f}(z)}$$

Non-parametric spectral estimation as a constrained optimization problem



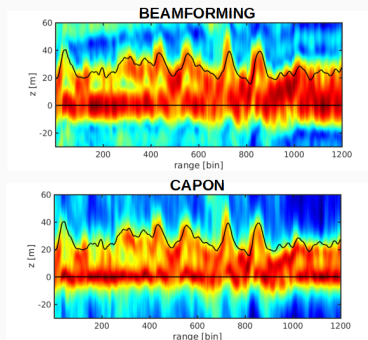
- Spectral estimation: linear filter $\mathbf{h} \in \mathbb{C}^M$

$$\hat{f}(z_0) = \mathbf{h}^H(z_0) \mathbf{R} \mathbf{h}(z_0)$$

- Power minimization with gain constraint

$$\mathbf{h}(z_0) = \arg \min_{\mathbf{h}} \left(\mathbf{h}^H \mathbf{M} \mathbf{h} \right) \text{ s.t. } \mathbf{h}^H \mathbf{a}(z_0) = 1$$

- $\mathbf{M} \propto \mathbf{I} \Rightarrow$ Beamformer (DFT)
- $\mathbf{M} = \mathbf{R} \Rightarrow$ Capon's adaptive solution



- Transfer function

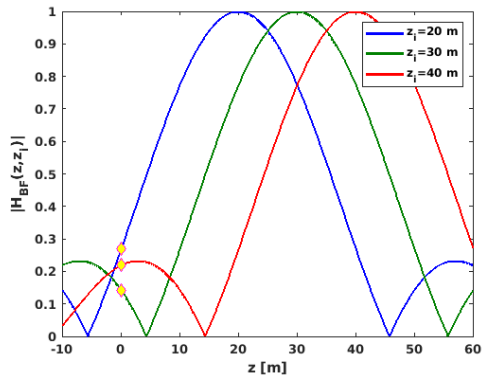
$$H(z, z_0) = DFT(h(z_0))$$

- Estimated (noise-free) reflectivity density

$$\hat{f}(z_0) = \int f(z) |H(z; z_0)|^2 dz$$

- Ground to Volume power Leakage

$$GVL(z_g, z_v) = \frac{|H(z_g; z_v)|^2}{|H(z_v; z_v)|^2}$$



A solution: Ground-Notched tomographic focusing

- Additional null-gain constraint

$$\mathbf{h}(z_0) = \arg \min_{\mathbf{h}} (\mathbf{h}^H \mathbf{M} \mathbf{h})$$

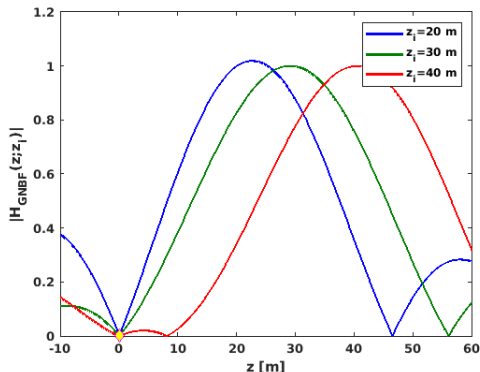
$$s.t. \begin{cases} \mathbf{h}^H \mathbf{a}(z_0) = 1 \\ \mathbf{h}^H \mathbf{a}(z_g) = 0 \end{cases}$$

- Closed-form solutions (BF & CP)

- ▶ $h_{GN-BF}(z) = g_c(z, z_g) \mathbf{\Pi}_{\mathbf{a}(z_g)}^{\perp} \mathbf{a}(z)$

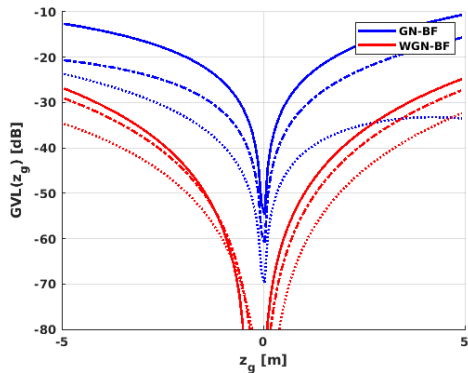
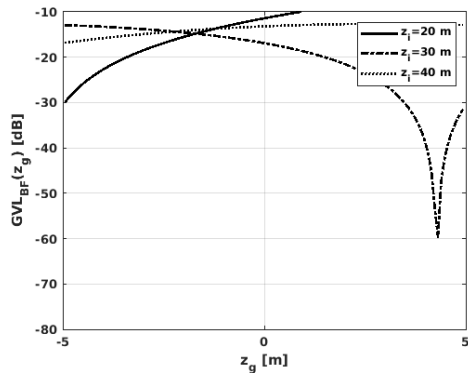
- ▶ $h_{GN-CP}(z) = \tilde{g}_c(z, z_g) \mathbf{\Pi}_{\tilde{\mathbf{a}}(z_g)}^{\perp} \tilde{\mathbf{a}}(z)$

- No additional complexity

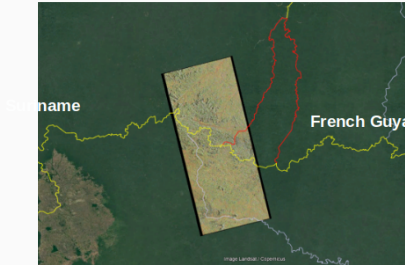


Tomographic imaging with a wide ground notch

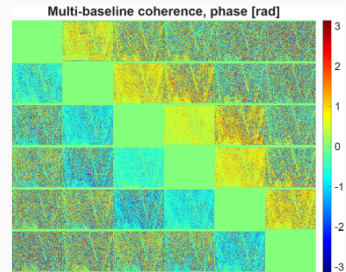
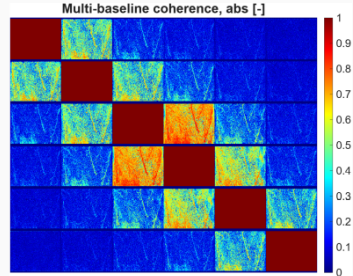
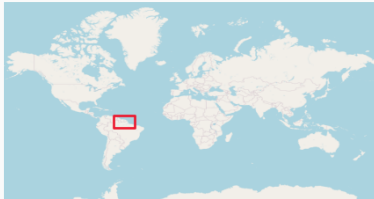
- Adding notches or using a flatter notching function
 - ⇒ requires additional DoFs, not adapted to small stack cases
- Spectral tapering and CP method
 - ⇒ widened nulls & preserved selectivity



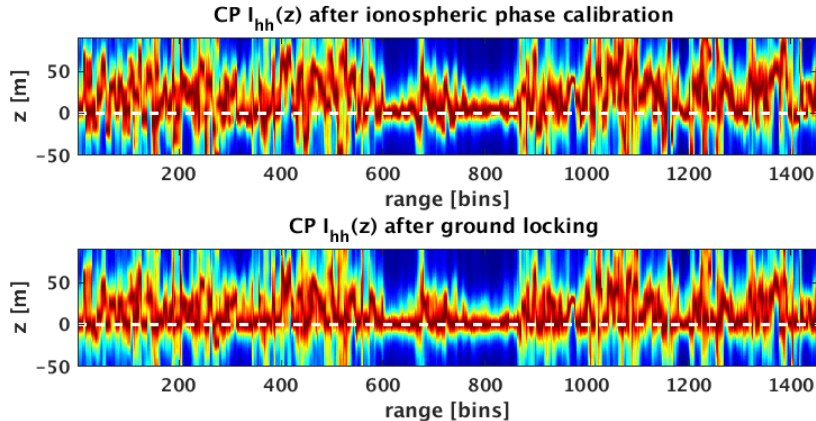
The Tumucumaque park test site



Coordinates: $2^{\circ} 20' \text{ N}$, $54^{\circ} 25' \text{ W}$

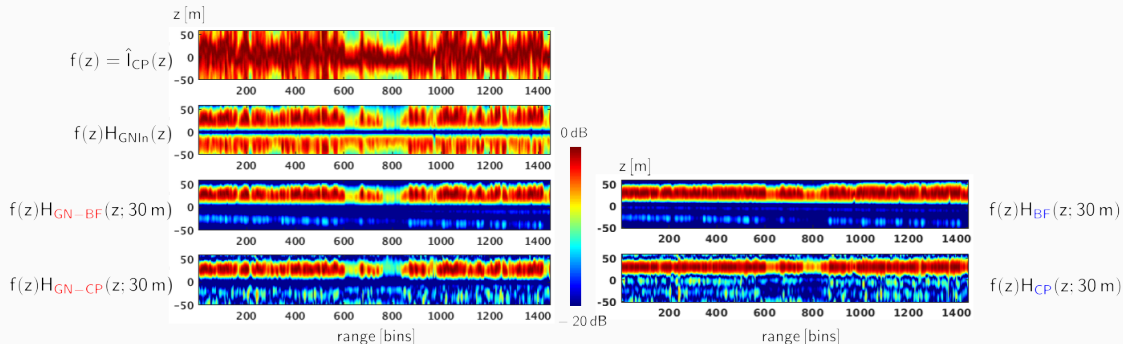


Ground locking



- Simple DTM-free ground locking technique (see presentation by F. Salvaterra):
- Critical step for Ground Notching !

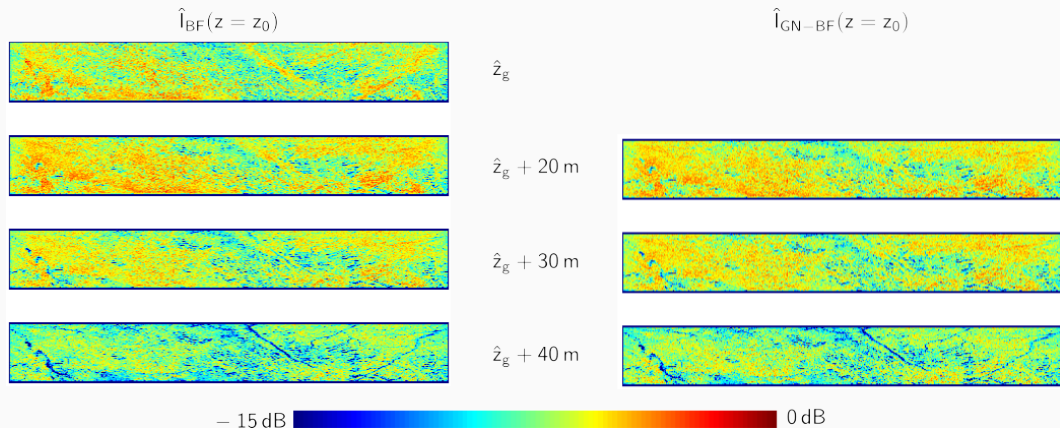
Ground-Notched tomography (M=6): filtering features



■ Adaptive Ground-Notching improves

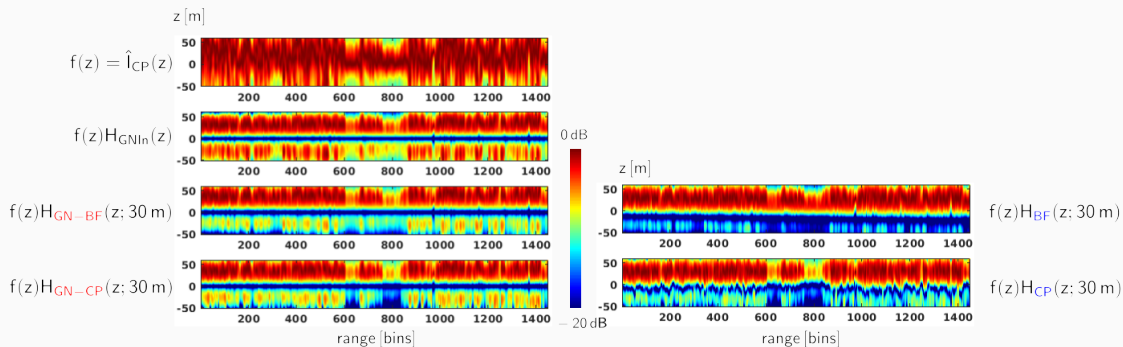
- ▶ GVL
- ▶ adaptivity in elevation

Ground-Notched tomography: spatial features



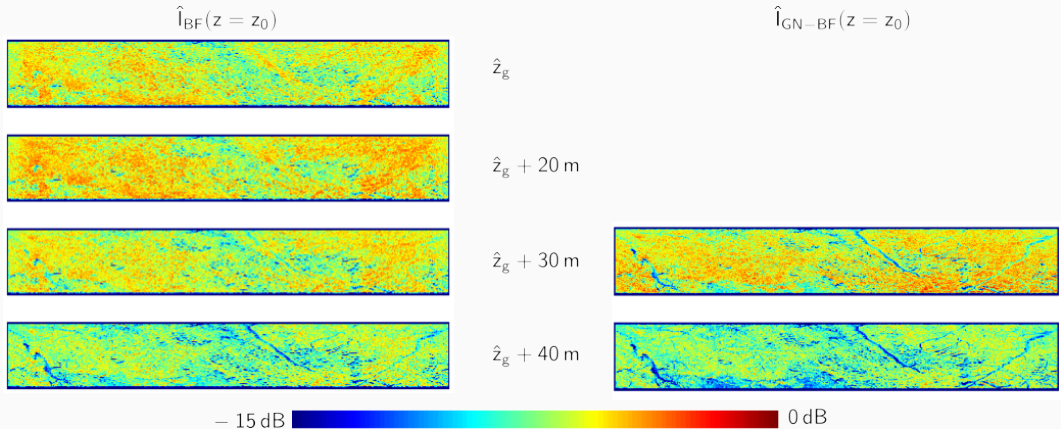
- Unbiased estimates with reduced GVL

Ground-Notched tomography for DB-InSAR configuration (M=3): filtering features



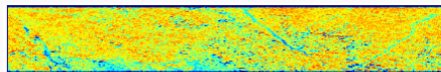
- Unconstrained TomoSAR $\rightarrow$ high GVL ($\delta z \approx 60\text{ m}$)
- GN-BF (3 images) vs. GN-In (2 images) $\rightarrow$ selectivity improvement ($\approx 6 - 8\text{ dB}$)

Ground-Notched tomography for DB-InSAR configuration (M=3): spatial features

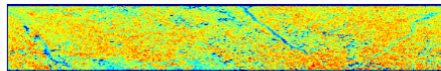


- 3-image Unconstrained tomography $\Rightarrow$ unacceptable GVL
- Ground-notched tomography $\Rightarrow$ GVL mitigation

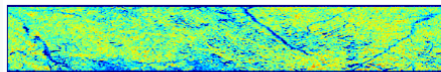
Ground-Notched tomography vs. Ground-Notched InSAR



$$\hat{I}_{\text{GN-In}}$$

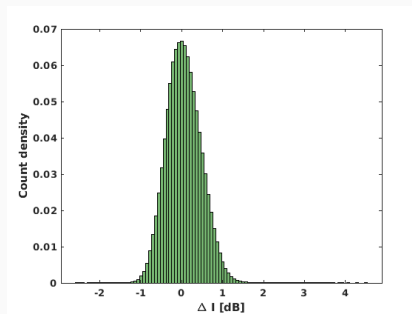


$$\hat{I}_{\text{GN-BF}}(\hat{z}_g + 30 \text{ m})$$



$$\hat{I}_{\text{GN-BF}}(\hat{z}_g + 40 \text{ m})$$

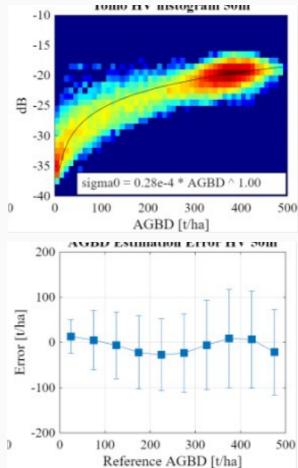
– 15 dB  0 dB



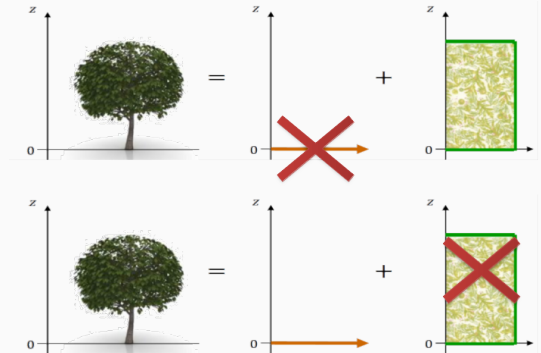
- 96% of estimates $\in [-1 \text{ dB}, +1 \text{ dB}]$ @ GN-InSAR fixed elevation
- Structured outliers: some local features may radically differ
- TomoSAR provides height adaptation: $\rightarrow$ application to various biomes (smaller trees ...)

Some applications of tomographic notching

AGBD estimation in DB-InSAR mode

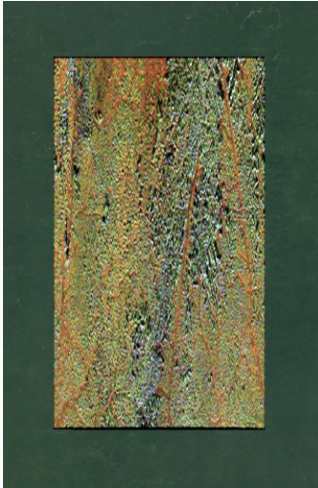


Ground vs. Canopy notching

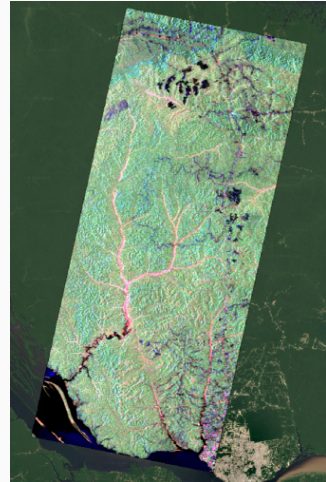


Polarimetric features of notched images

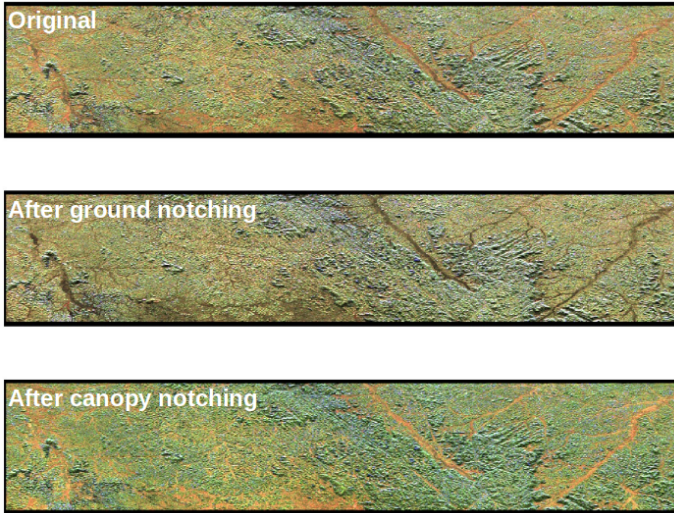
Tumucumaque national park, Amapá, Brazil



Manaus surroundings, Amazonas, Brazil

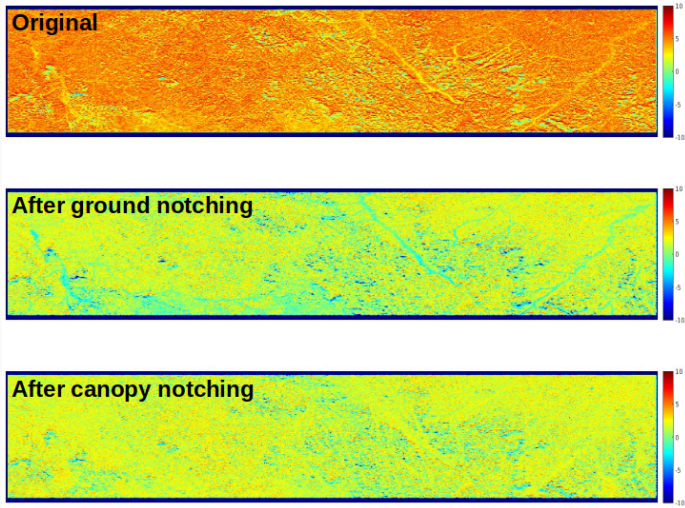


Tumucumaque: Pauli color-coded image



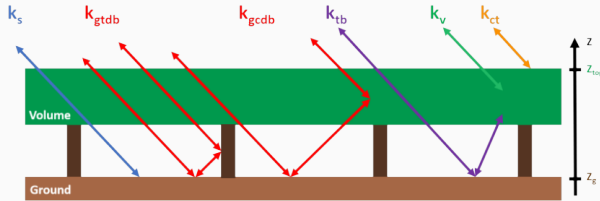
Ground Notching reveals hydrological network

Tumucumaque: Volume scattering (Arii's decomposition)



Significant volume response at ground level!

Ground-Canopy Volume-like DB scattering



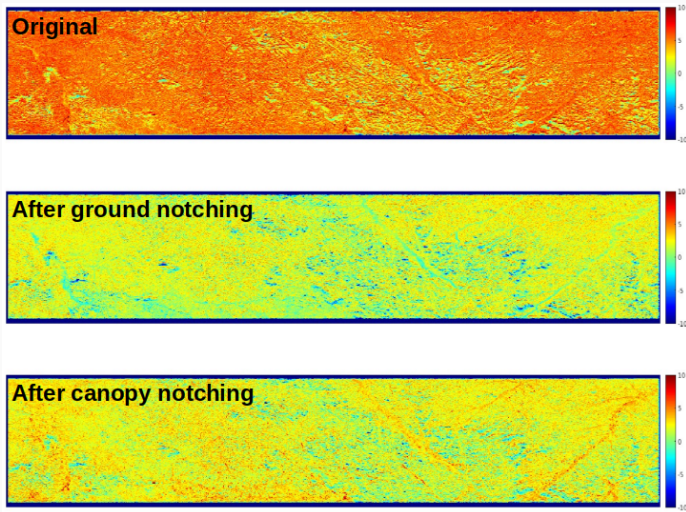
Abdo et al. RS, 2021



Mariotti d'Alessandro, TGRS, 2019

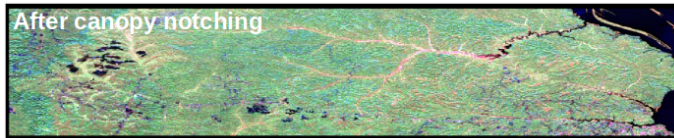
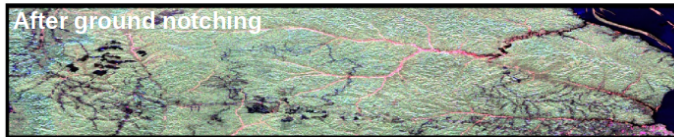
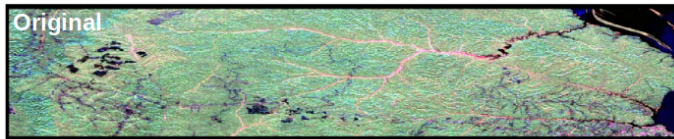
Volume component at ground level. Strong intensity in low density forest

Tumucumaque: Double-Bounce scattering (Arii's decomposition)



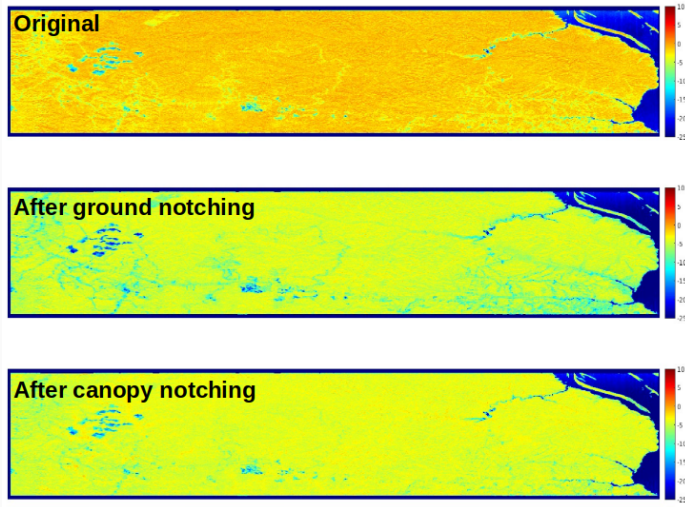
Canopy notching reveals ground DB features

Manaus: Pauli color-coded image



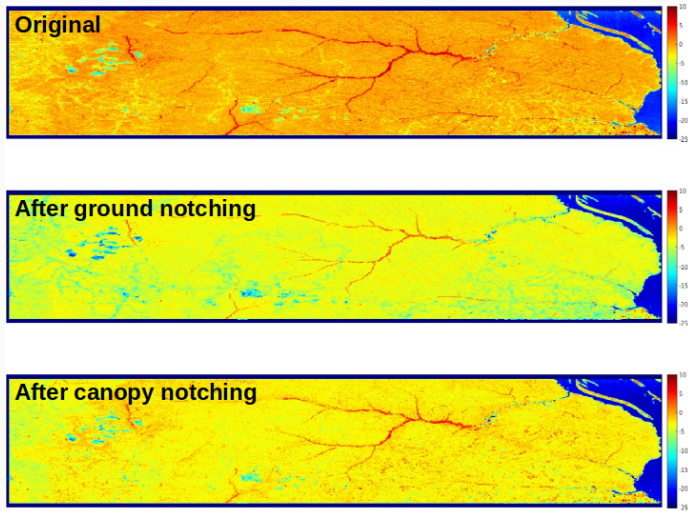
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Manaus: Volume scattering (Arii's decomposition)



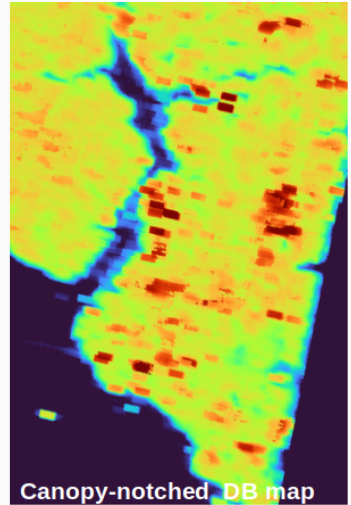
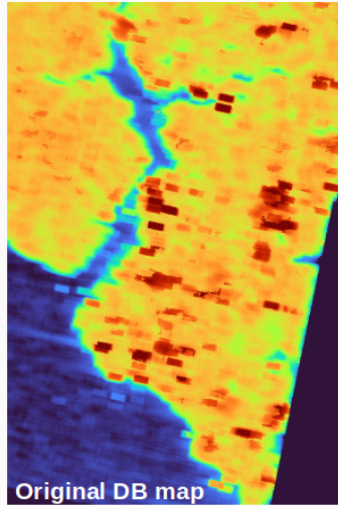
Significant volume response at ground level!

Manaus: Double-Bounce scattering (Arii's decomposition)



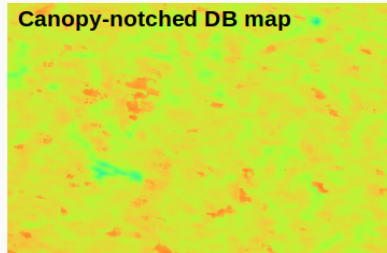
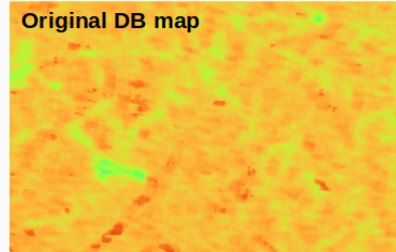
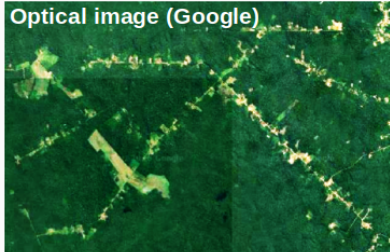
Canopy notching reveals ground DB features

Looking below the forest cover using Canopy-notched PolTomo



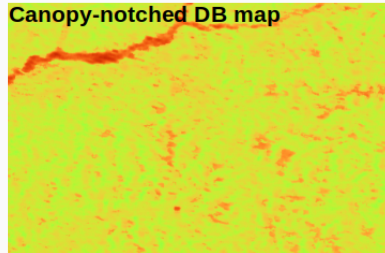
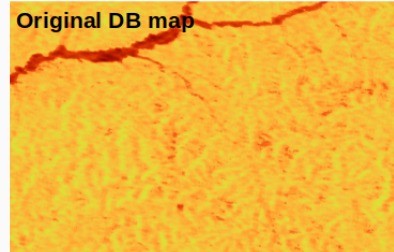
Canopy notching improves contrast

Looking below the forest cover using Canopy-notched PolTomo



Canopy notching improves contrast ... and provides different DB features

Looking below the forest cover using Canopy-notched PolTomo



Canopy notching improves contrast ... and provides different DB features

- Ground-Notched InSAR generalized to Ground-Notched TomoSAR
 - ▶ isolation guaranteed by accurate ground locking
 - ▶ adaptive scanning in elevation
- Main application: AGBD estimation in DB-InSAR mode
- Extension to canopy notching reveals
 - ▶ strong volume contribution at ground level
 - ▶ double-bounce PolSAR features at ground level:
could be related to human activity or the presence of water (under investigation)