



Waveform simulations and analysis of Lidar data for the development of a space-based vegetation lidar system

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General context

- Vegetation structure is the driver and the result of forest ecosystem ecological functions
- Structure measurements provide information on processes and on biophysical parameters and are needed
 - to advance our understanding on forest ecosystems functioning
 - and to sustainably manage forests
- Spaceborne Lidar missions are currently the best solution to expand forest structure measurements in space and time
- Several missions are planned or under study by space agencies: GEDI/NASA, MOLI/JAXA, LEAF/CNES





Outline

- LEAF, the vegetation lidar mission under study in France
- A modeling framework developed in the frame of an ongoing experimentation/validation study
- Results on vegetation representations for RT modeling
- Instrumental studies
- Research avenues to improve forest parameters assessment from Lidar
- Perspectives



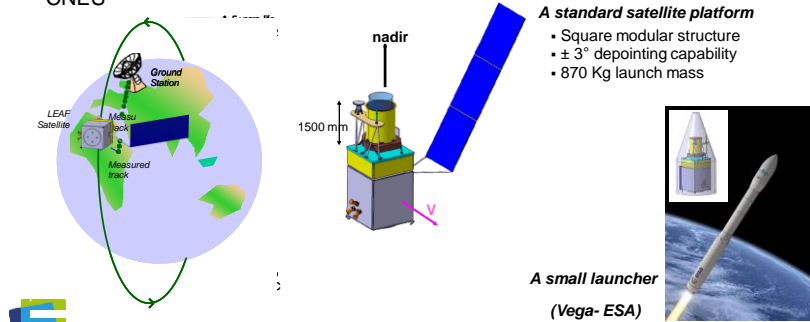
LEAF: Lidar for Earth and Forests A vegetation mission under study in France

- 2014 : Recommended as a possible mid-term mission following the scientific prospective seminar of CNES

LEAF mission

LEAF a satellite mission coupling a Lidar and an imager

- **Primary objective** is to provide spatialized information on **forest 3D structure and on its dynamics**
- Secondary objectives :
 - **Ground altimetry data** for Geodesy, Geohazards and Cryosphere studies
 - **Continental water level data** for Hydrologists
- Design by Airbus Defense and Space (former EADS Astrium) with the support of CNES



LEAF: current design

LEAF instruments

Fullwaveform lidar system

- **NIR wavelength : 1064 nm (eye safety)**
- **Pulse duration < 2ns**
- **Footprint diameter: 20 m with an array detector (4) slope**
- **Energy : 86mJ laser output => 60mJ instrument output**
- **Signal sampling = 1 ns Vertical resolution = 15 cm z res.**



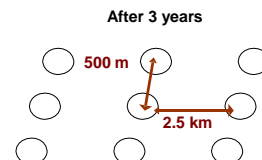
on the shelves VHR XS Imager

- **Panchromatic + B,G,R,NIR**
- **2m resolution, 14 km swath width**
- **Co-registered with the Lidar**

Enhance geolocation
Improve accuracy of forest parameters
Provide data for extrapolation of lidar results

Spatial and temporal sampling characteristics

- 15 Hz repetitive rate
- 3 year revisit period
- 5/6 years lifetime



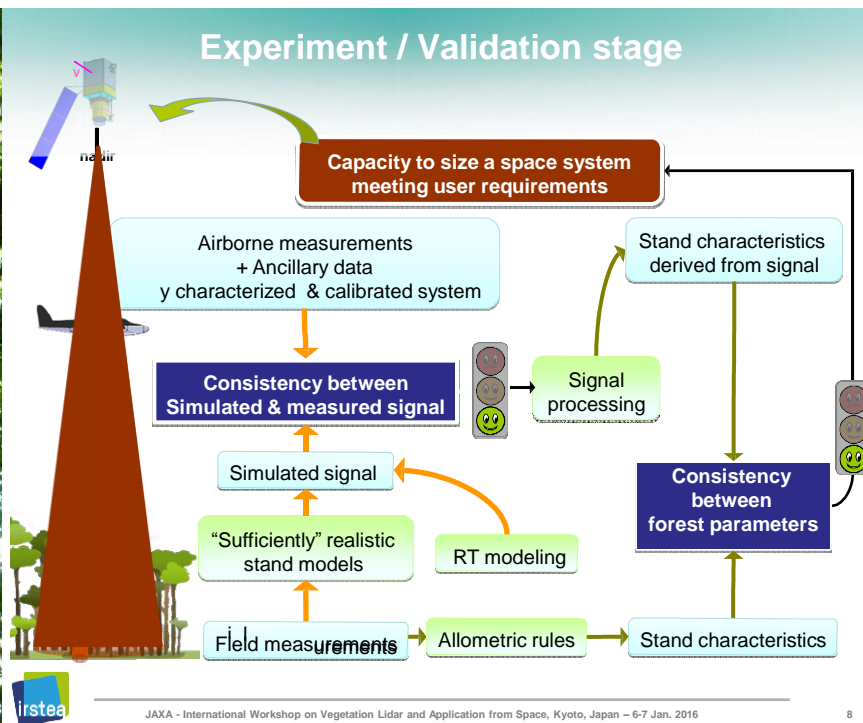
LEAF concept is not set in stone

- Models used to size the system are considered to be insufficiently reliable still pending issues to optimize the mission and enhance its capacity to monitor forest
- This led CNES to implement an experimentation/validation stage
- Objective for LEAF:** size a system providing complete vegetation profiles even for dense forests without any risk of calling into question the concept or the system architecture in the latter mission project phases

Establishment of a working plan to address pending issues



Experiment / Validation stage





A modeling framework developed in the frame of the experiment / validation study

Accurate modeling requires to develop

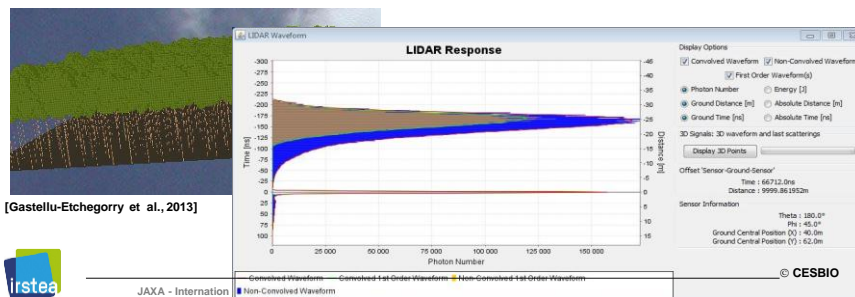
- An efficient and reliable radiative transfer model
- “Sufficiently” realistic stand models

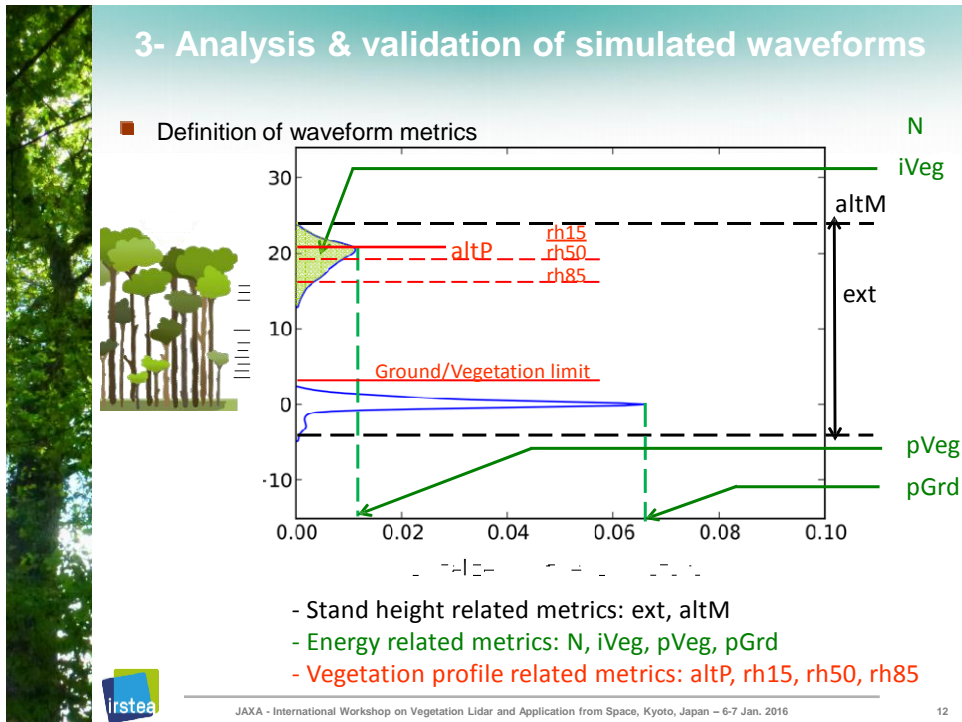
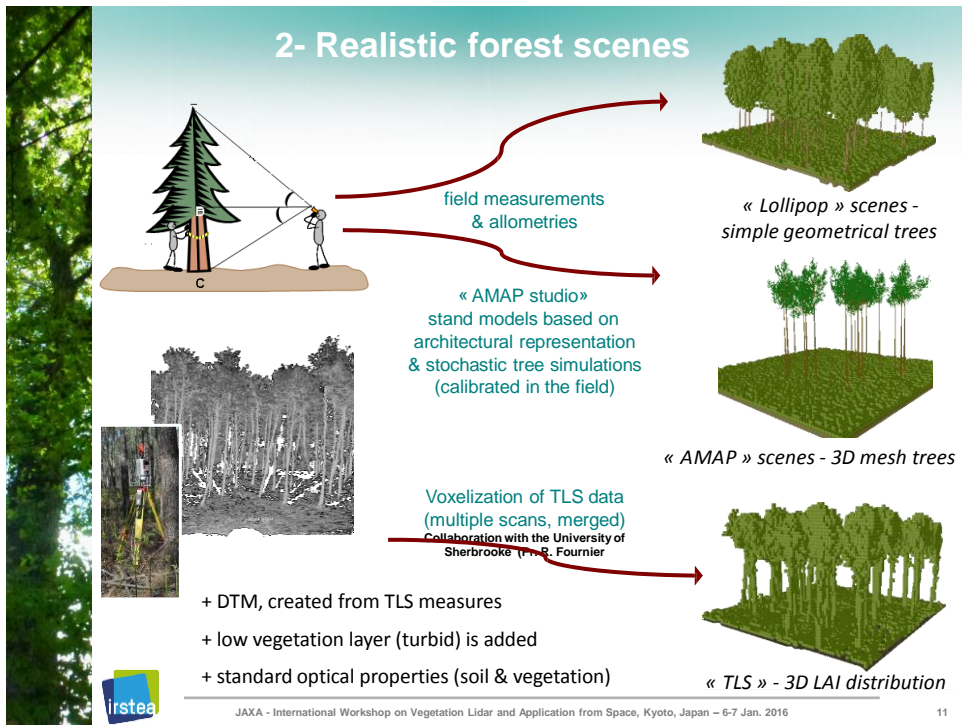
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1- Radiative transfer model

- DART - Discrete Anisotropic Radiative Transfer (CESBIO) :
 - “Ray-Carlo” method (combination of ray tracing and Monte-Carlo methods)
 - DART can model
 - ☒ Any lidar system (position, angular divergence, and pulse characteristics)
 - ☒ Multiple diffusions
 - ☒ Interactions between lidar signal and atmosphere
 - ☒ Solar noise
 - Compatible with complex and realistic vegetation representations





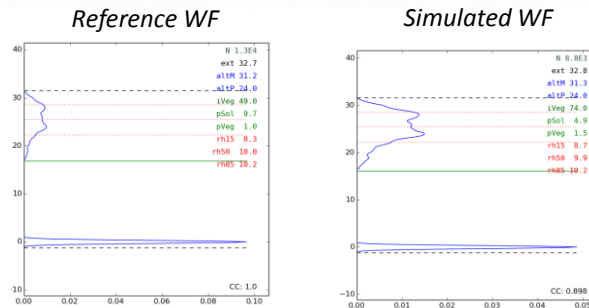
- Stand height related metrics: ext, altM

- Energy related metrics: N, iVeg, pVeg, pGrd

- Vegetation profile related metrics: altP, rh15, rh50, rh85

3- Analysis & validation of simulated waveforms

- Waveform comparison



- Absolute percent error computed for each metric

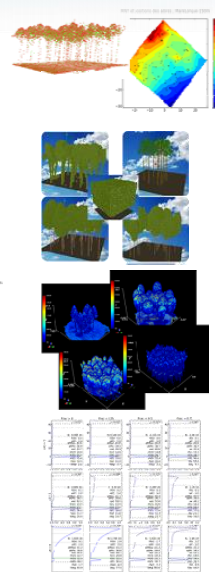
$$APE_i = \text{ABS} \left(\frac{\text{METRIC}_{i_simulation} - \text{METRIC}_{i_reference}}{\text{METRIC}_{i_reference}} * 100 \right)$$

- Bravais-Pearson Coefficient of Correlation (CC)



Simulation platform

- Integration of field measurements and preprocessing of ALS and TLS data
- Building forest scenes (3 types)
- Simulation of ALS and large footprint Lidar data with DART
- Analysis and validation of simulated Lidar data





Preliminary studies on vegetation representations

Questions:

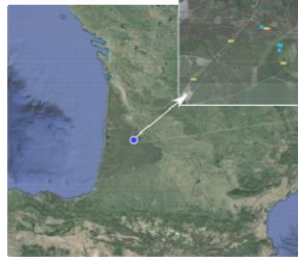
- What is the best way to represent a forest plot in RT model for lidar signal simulations?
- What are the impacts of uncertainties of the inputs used to create forest scenes on the simulated waveforms ?

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Data sites

The LANDES forest
Maritime Pine
plantations

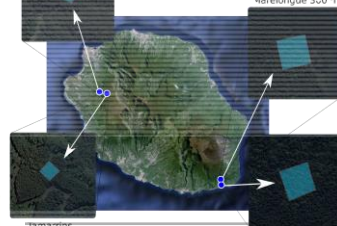


Cryptomerias



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Island of REUNION
Tropical forests



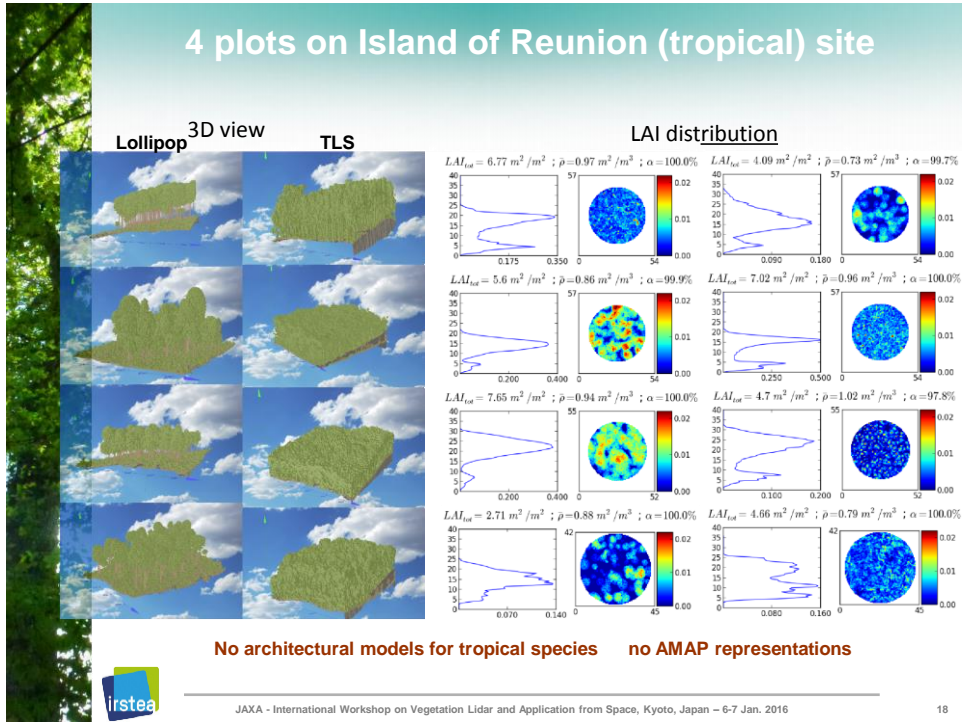
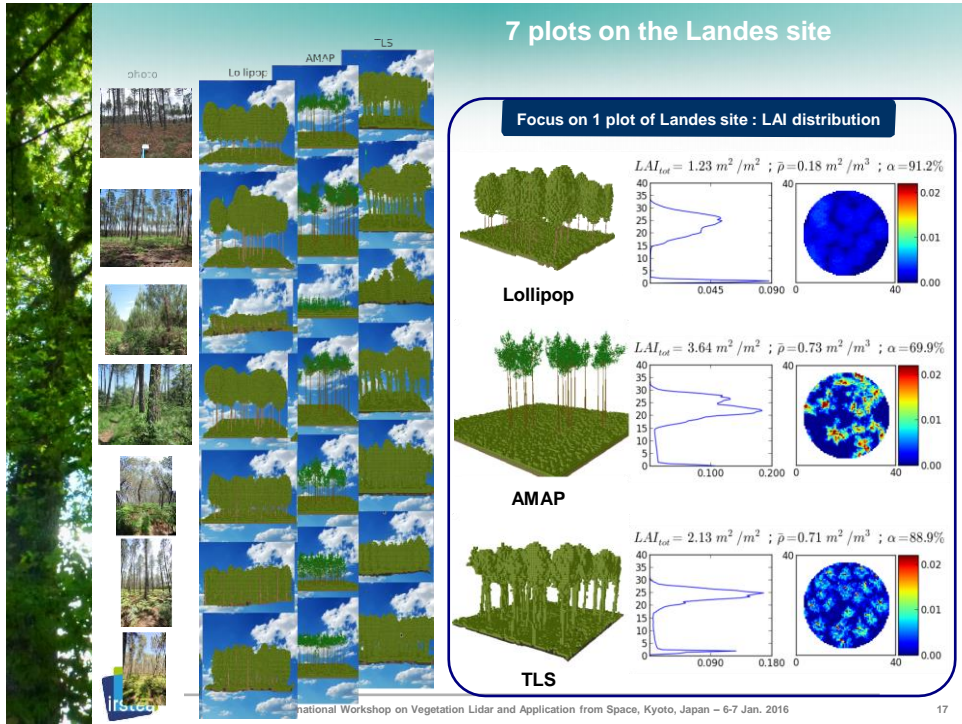
Marelongue 300 m



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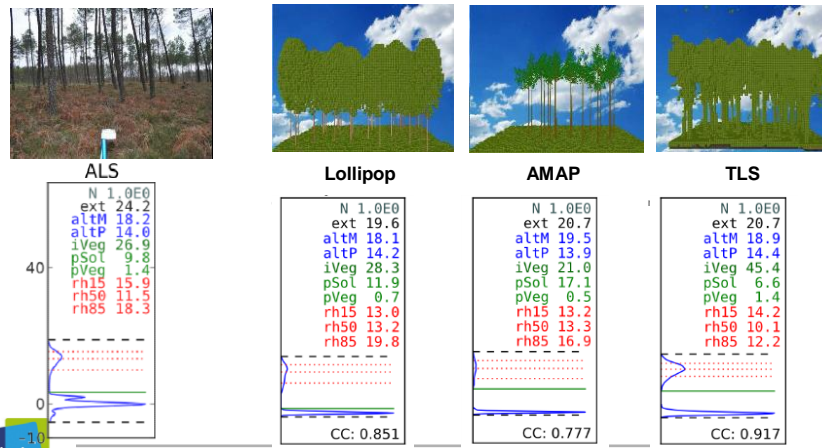


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Analysis

- Evaluation of the quality of the 3 forest representations (Landes site)
 - Reference for waveform comparison = ALS data aggregated at plot level
 - Analyzed waveforms = simulated ALS data aggregated at plot level



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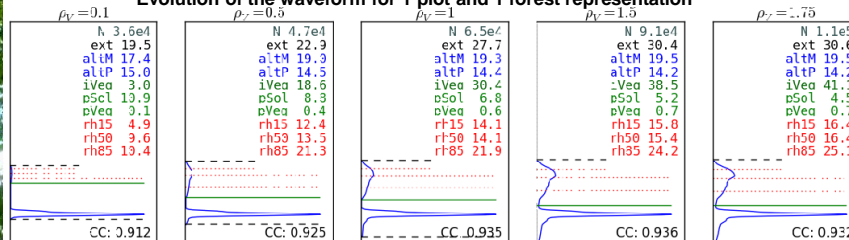
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Analysis

- Sensitivity analysis to evaluate the impact of uncertainties of the inputs on the simulations (2 sites)
 - Reference = large footprint simulated waveform
 - Compared to waveforms obtained by changing initial parameters
 - ☒ Simplification of AMAP 3D mesh
 - ☒ Changes in : ρ_{veg} , ρ_{ground} , total LAI, LAI distribution, $LAI_{underlayer}$, slope

Example : Impact of change in Vegetation reflectance

Evolution of the waveform for 1 plot and 1 forest representation



Mean evolution for all the plots



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Results

- Which representation is compatible with RT modelling?
 - Lollipop representation: inaccurate crown shapes poor results
 - AMAP & TLS: shape of the vegetation peak well reproduced but differences in energy metrics were observed
 - Different calibration needs
 - ☒ TLS : only reflectance
 - ☒ Lollipop: LAI calibration (+allometry)
 - ☒ AMAP (3D mesh) : very complex calibration
- ↓ Increasing needs for calibration
- TLS based approach appears to be a good candidate to represent forest scenes
- Sensitivity analysis :
 - Shape metrics are stables (except when slope changes)
 - Energy related metrics are very sensitive to changes in ρ_{veg} , LAI, ρ_{ground}
 - No absolute validation at this stage future experiments will include
 - Characterization of the airborne lidar system
 - Additional field measurements (spectroradiometer, atmospheric condition)
 - Simulations with errors in WF metrics < 10% can be expected



Instrumental studies

- Impact of systems characteristics for high energy fullwaveform systems
- Evaluation of a low energy photon-counting Lidar solution as an alternative to high energy FW lidar

Sensitivity analysis a FW system

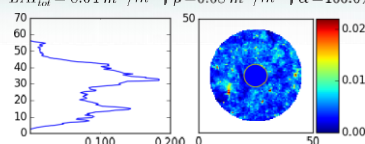
- Sensitivity analysis to evaluate the impact on waveforms of:
 - viewing angle, footprint size
 - atmospheric condition
 - solar noise
- Main conclusions
 - Intensity of ground and vegetation peaks decreases with viewing angle and footprint size due to the signal spread risk to miss the ground peak in dense forest
 - Minor impact of sun and atmospheric noises
 - Instrumental noise is likely to be the most significant source of noise and a determining characteristic to size the system



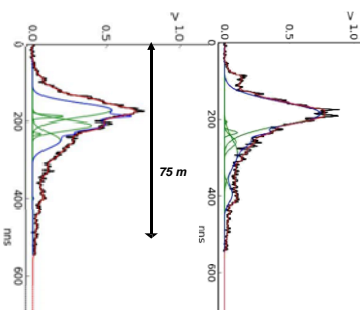
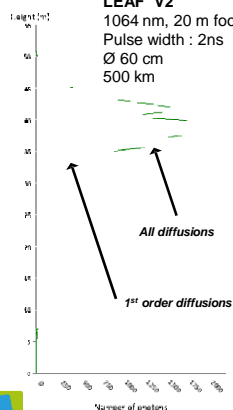
Simulation of LEAF waveforms on tropical forests



$$LAI_{tot} = 8.64 \text{ m}^2/\text{m}^2; \bar{\rho} = 0.68 \text{ m}^2/\text{m}^3; \alpha = 100.0\%$$



LEAF V2
 1064 nm, 20 m footprint, 60 mJ,
 Pulse width : 2ns
 Ø 60 cm
 500 km

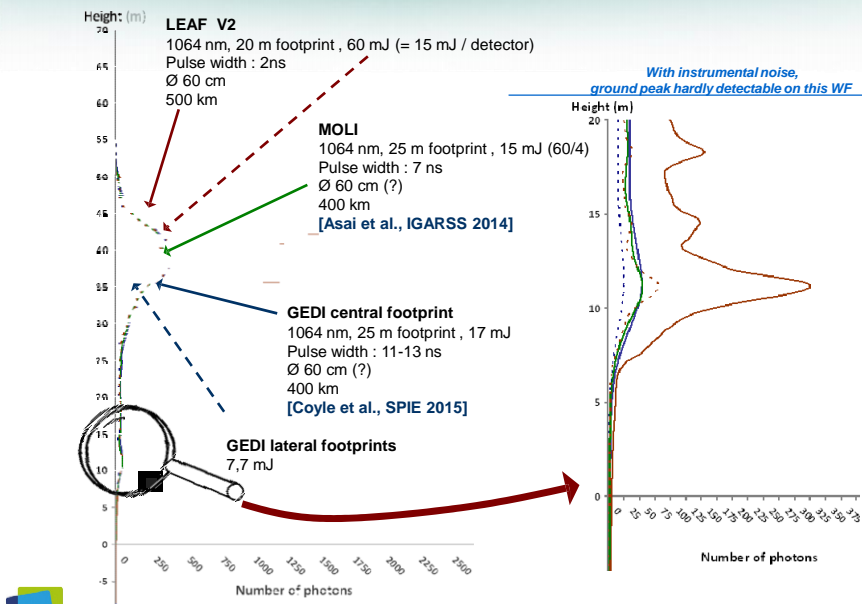


ICESAT data on tropical forest – emitted energy : 75 to 87 mJ





Comparing LEAF, GEDI & MOLI



Low energy Lidar: a viable alternative solution?

- Operating high energy lasers in space (e.g. full waveform systems with few 10 mJ at few 10 Hz) is associated with risks: laser induced damage, contamination, eye safety...
- The design of ATLAS on ICESat-2 shows that alternative approach is possible (few 10-100 µJ/shot at 10 KHz)
- ATLAS design optimized for hard ground targets, vegetation (tree height) comes as secondary goal.
- Study conducted by Airbus Defense and Space to verify if the low energy approach is suited for tree height determination



Technical point on emission & detection parts

Two main options considered

	Crystal amplified lasers	Optical fiber amplified lasers
Advantages +	High TRL for space mission	-Reduced alignment constraints -Lower sensitivity to vibrations and to contamination - Better thermal dissipation...
Drawbacks -	Complex production	-Limitation in peak power -Concern on the resistance to radiations

Two candidates identified

	Photo-multiplier tubes (PMT)	Avalanche Photodiode (APD)
Advantages +	-Higher TRL (Caliop, soon ICESat-2) - Low dark current - No blind time	-Large accessible spectral domain (UV to IR, with various substrates) - Higher quantum efficiency
Drawbacks -	Reduced spectral domain [0.3μm-0.9μm]	Need to operate at lower temperature for IR



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Performance and design sizing approach

Performance requirement:

- Measurement noise < 2 m rms (= random error on tree height)
- Bias < 4 m

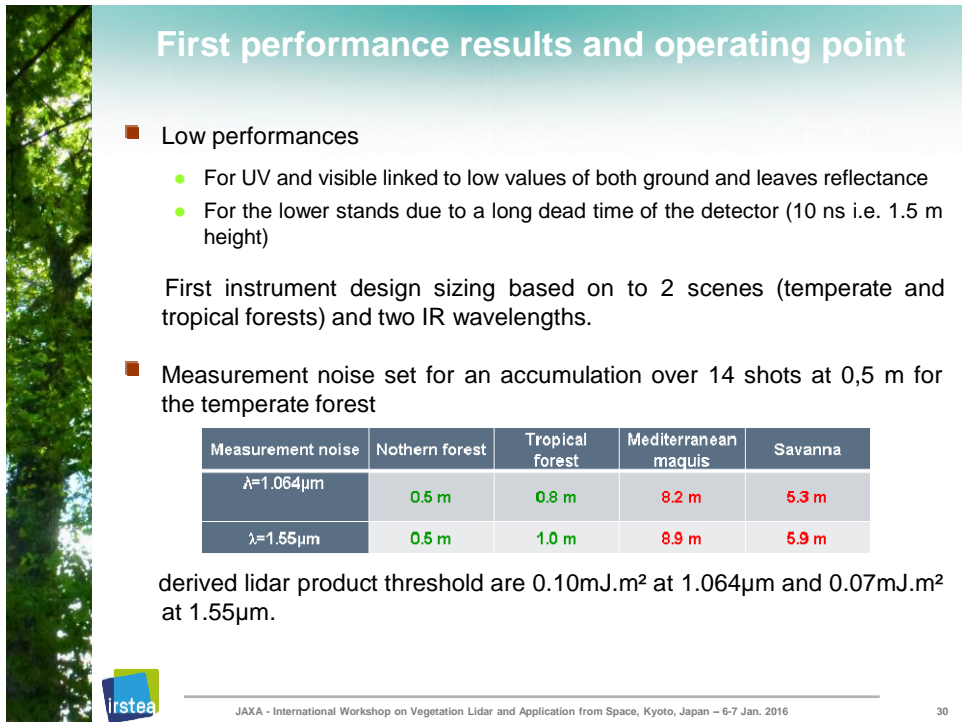
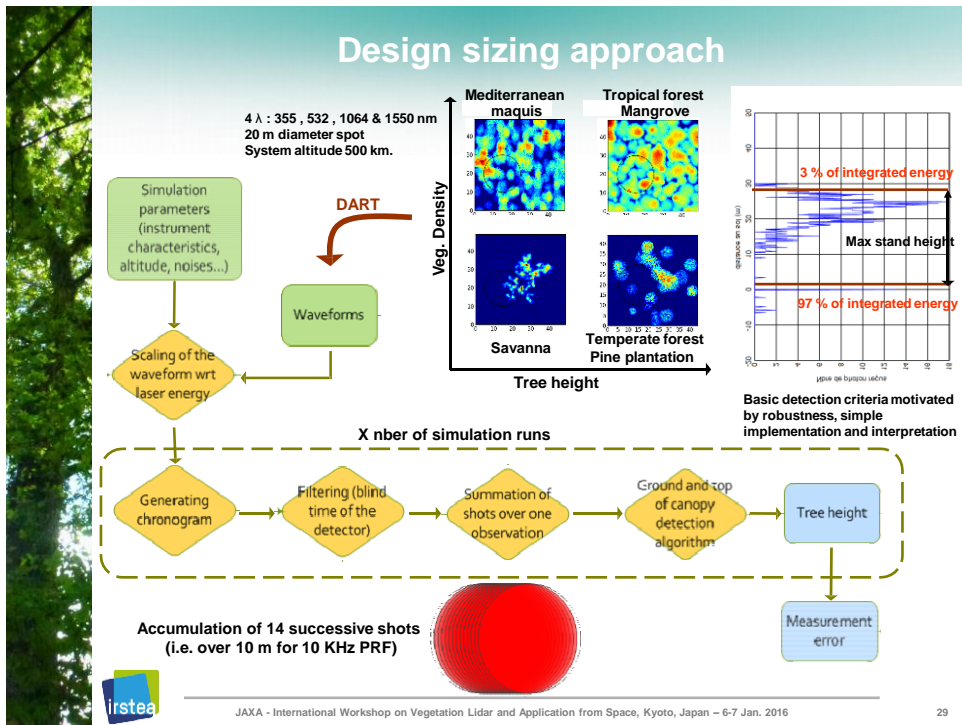
Overall approach toward instrument design:

- Definition of reference scenes and waveform simulations
- Performance estimation through performance model and comparison to the requirement
- Setting of a threshold value for the lidar product (laser energy x telescope collecting surface)
- Instrument design based on the lidar product.



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Budget and conclusions

- Operating point: a 0,8 m Ø telescope and
 - 200 μ J / shot at 1.064 μ m
 - 140 μ J / shot at 1.55 μ m
 - Resulting instrument mass: 220 kg (incl. 25 % margin)
 - Power budget : 240 Watt (incl. 20 % margin)
- } Same satellite class than for LEAF with current FW specifications
- Simulations show the viability of such an approach for tree height determination with metric accuracy for scenes of major interest including the tropical forests
 - Limitations of the study
 - A full error budget would require to consider additional contributors (e.g. uncertainty on the atmosphere characteristics and effects linked to the platform (e.g. pointing, altitude uncertainties))
 - Results highly dependent on the method used to estimate height

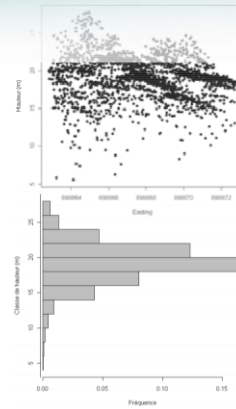


Research avenues that could be explored to improve forest parameters assessment from Lidar

- Promising recent studies using ALS data
- To what extent these approaches can be transferred to process spaceborne data?

User requirements not always met with existing ALS based ABA

- ABA approaches are widely used to assess forest parameters (Volume, AGB, basal area) from ALS data
- Metrics are derived from height and density distributions of ALS echoes
- Most explanative metrics are used to build a predictive model
- But low robustness level for such approaches
 - Metrics are highly correlated
 - One model / site
 - Insufficient accuracy for complex stands (e.g. multilayered broadleaved stands), e.g. RMSE > 20% for biomass assessments

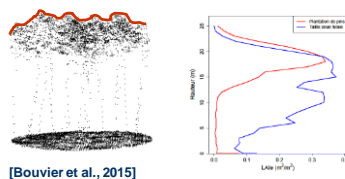


Development of new methods to overcome these issues



Explored approaches

- Seeking for new metrics
 - Using normalized vegetation profiles [Bouvier et al., 2015], [Vincent et al., 2015]
 - Penetration distribution metrics instead of height metrics [Vega et al., 2016]
- Using few meaningful metrics to build more general models (one shape)



[Bouvier et al., 2015]

$$\hat{y} = \beta_0 \underbrace{\mu_{CH}^{\beta_1} \sigma_{CH}^2 \beta_2 P_f^{\beta_3}}_{\text{Heterogeneity of the canopy surface}} C v_{LAD}^{\beta_4}$$

↑
Vertical heterogeneity

$R^2 > 0,85$ - $RSD < 20\%$
even for broadleaved multilayered stands

- “Combining LIDAR and growth and yield models” [St-André et al., SilviLaser 2015]

- Strengths of each approaches (growth and yield, LIDAR) integrated in a consistent and comprehensive way – not only additive or multiplicative combination of metrics
- No bias among 10 different sites with a **single model** for BA estimation

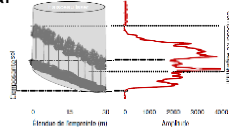




Remaining challenges

- Transfer these approaches to tropical forests and to large footprint FW lidar signal

- Relief

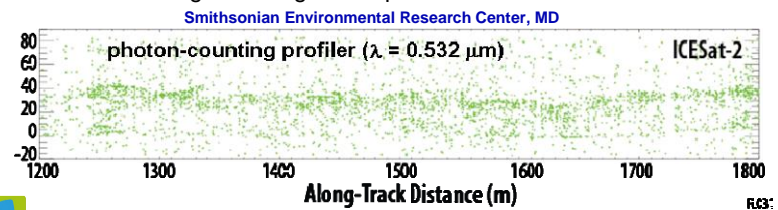


Mix between ground and vegetation signal

One of the limitation when processing ICESat 1

- Improved height prediction expected with future systems
 - Smaller footprint
 - Local slope assessment (better than SRTM DTM)
- Vegetation profile?

- Photon-counting data: vegetation profile?



Crédit: R. Nelson, FLORESTA project-2013



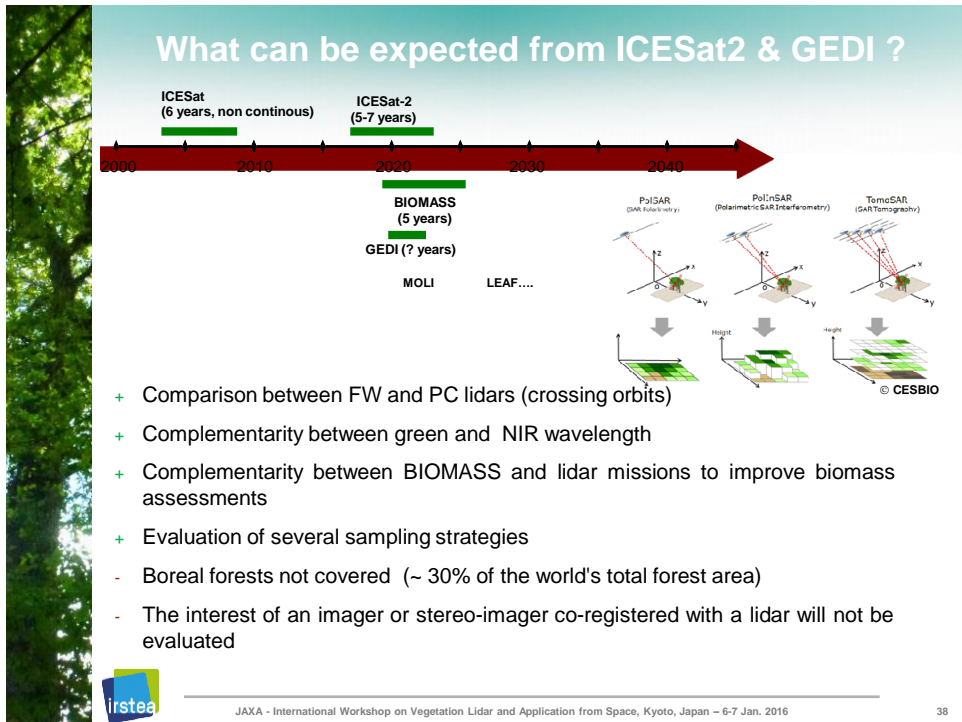
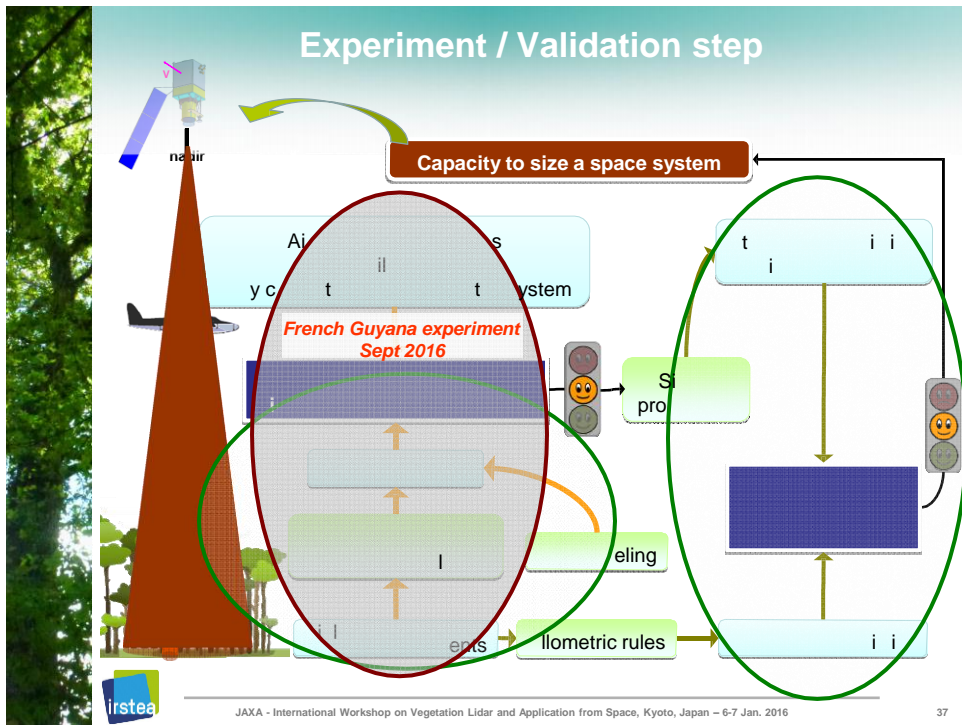
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Perspectives

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Technology is not everything...

- Research is needed to refine and integrate user requirements in link with emerging research topics; e.g. assimilation of lidar data in
 - Biodiversity models
 - Ecosystem models for carbon stocks and fluxes assessment



New global models developed to include inter-grid variability & management practices

- The capacity to meet user requirements is highly dependent on field measurement efforts
 - Allometry

Landes Forest – France - Pine plantations

$$\hat{y} = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \beta_3 x_3 + \beta_4 x_4$$

		Deleuze et al. (2013)	O. Shaiek et al. (2011)	Cacot, (2007)	JY Fraysse et L Cotten
Predictive model for biomass (T/ha)	R ²	0.95	0.93	0.79	0.50
	RSD (%)	12.7	13.0	19.8	32.6
	RMSE	10.8	10.8	18.8	31.3

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