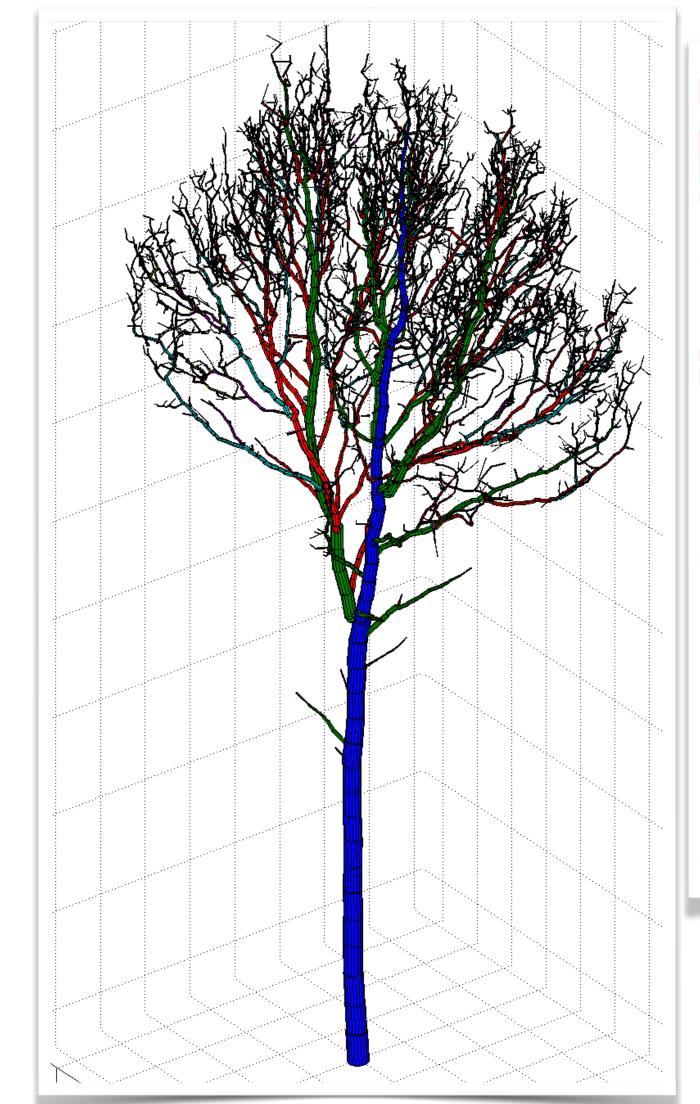
# Quantitative structure tree models from terrestrial laser scanner data

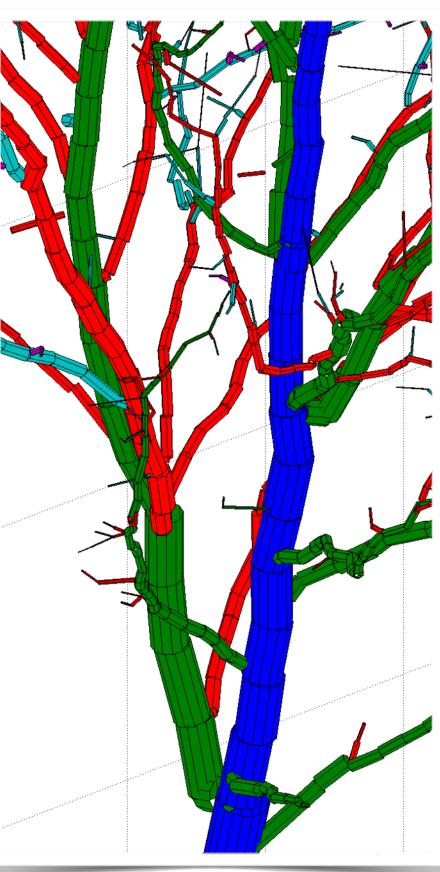
Pasi Raumonen
Tampere University of Technology

Silvilaser 2015, 28-30 September 2015, La Grande Motte, France

### Tree modelling

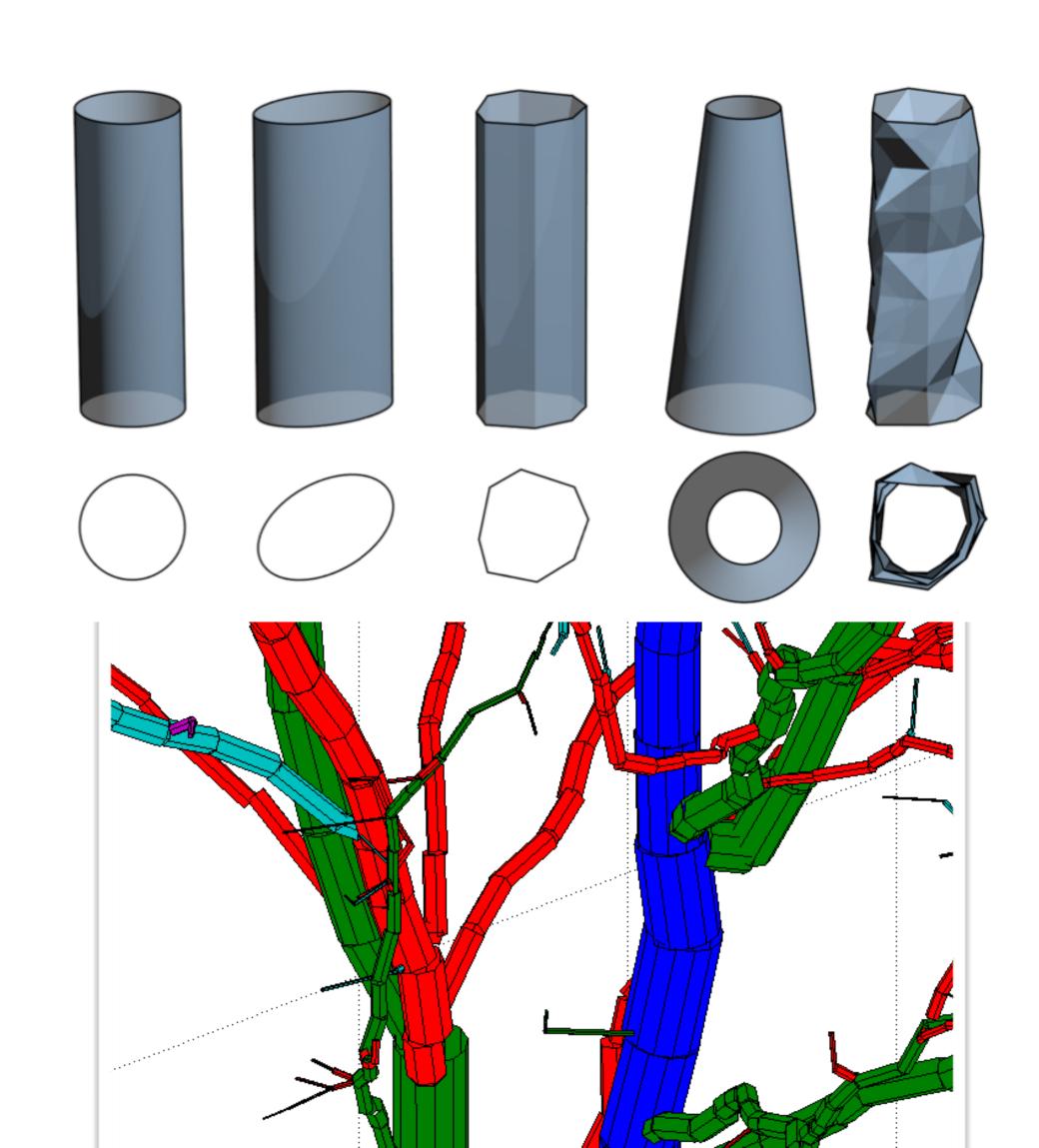
- How to use TLS data for tree modelling and data mining of tree information?
- No standard or obvious way to model trees
  - No useful functional series or parametrisable surface presentations
  - Easy extraction of information from the model
  - Compact size
- · "Building block" or "geometric primitive" approach
  - Tree modelled as a hierarchical collection of cylinders which are fitted to local details
- QSM Quantitative Structure Models
  - Volumes, lengths, taper, branches, topological branching structure, etc.





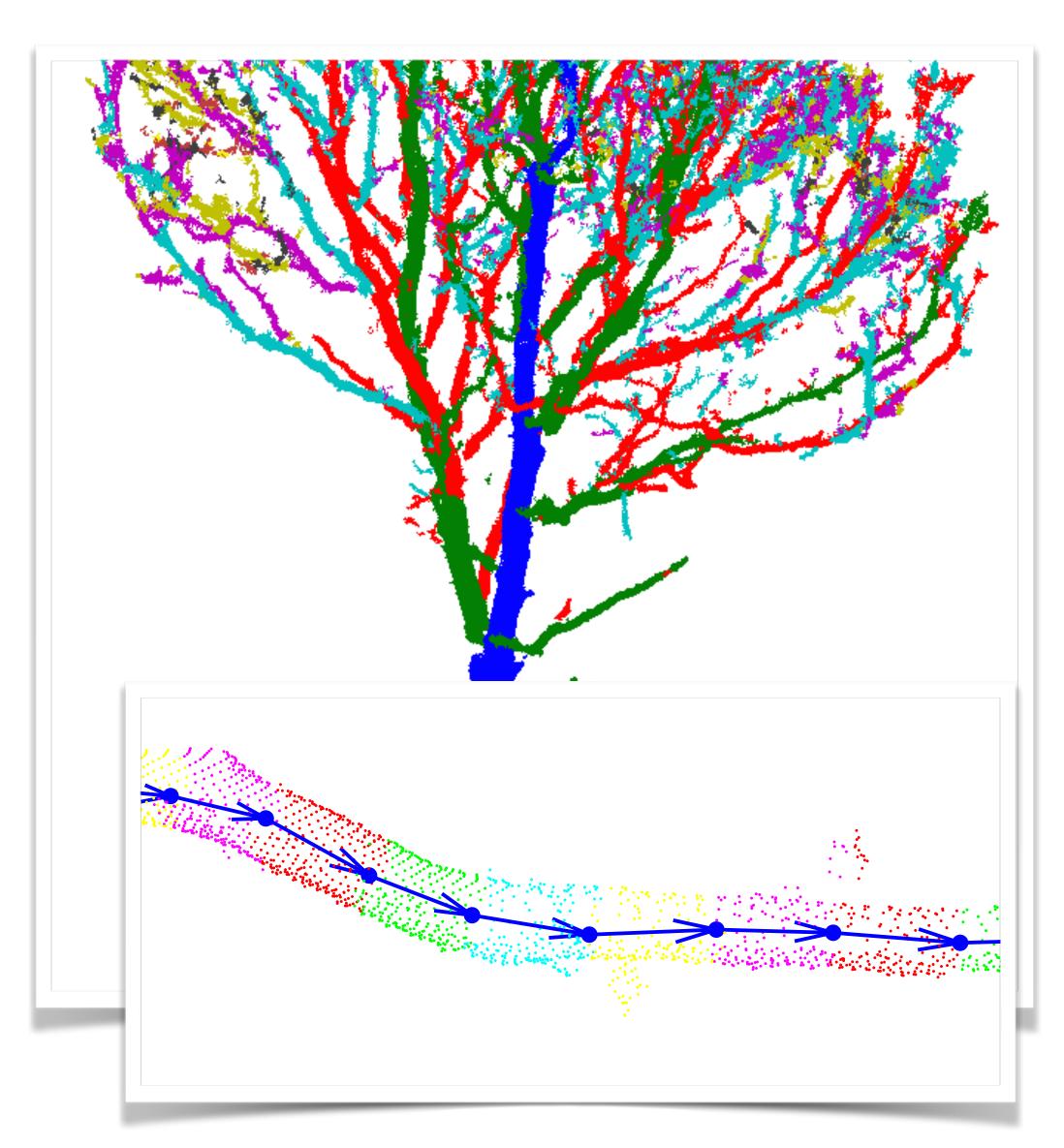
#### Tree modelling

- · Other primitives or blocks possible
  - · Elliptic and polygonal cylinders, cones
  - Special triangulations
- · Circular cylinder the most robust choice
  - Åkerblom et al. 2015: "Analysis of Geometric Primitives in Quantitative Structure Models of Tree Stems". Remote Sensing
- Dis-continuous surface is not a problem
  - Continuity adds no useful quantitative structure information but makes the modelling harder and less stable

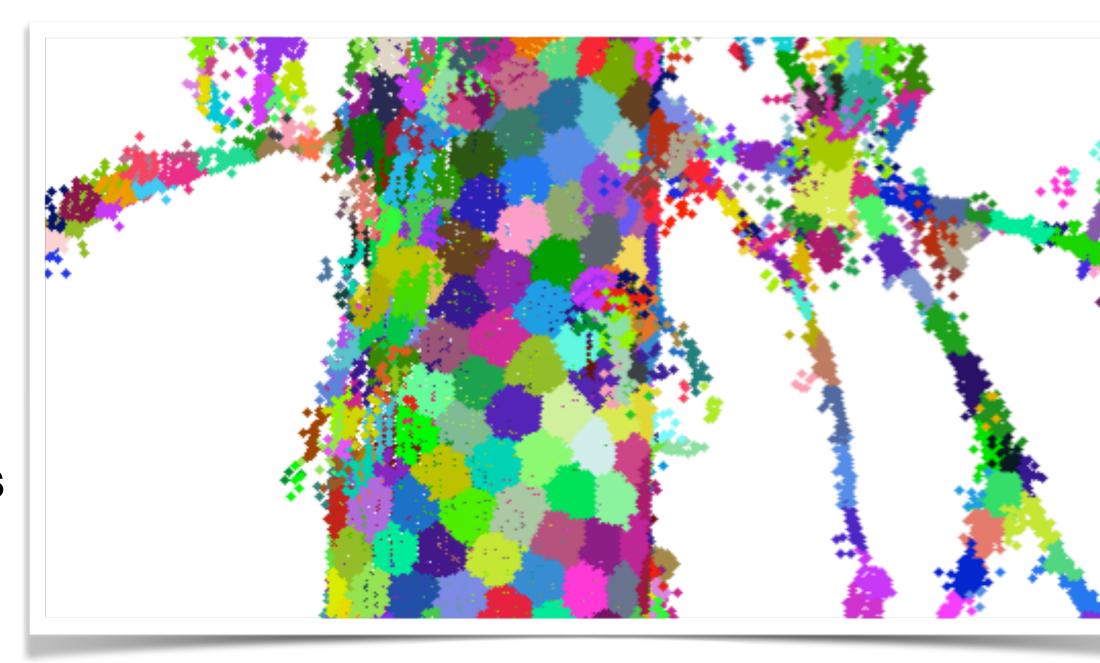


#### How to produce QSMs from point clouds

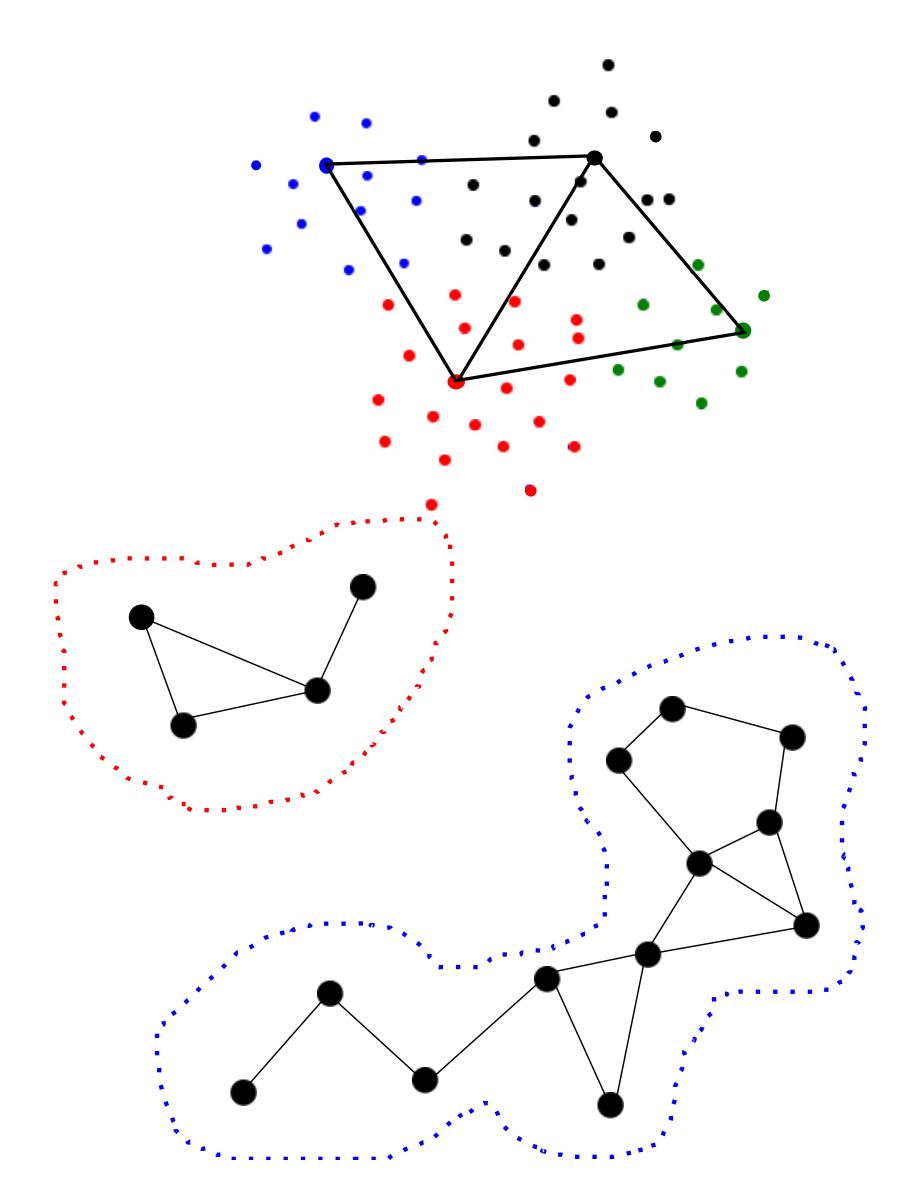
- Automatic reconstruction from a given point cloud in few minutes
  - General approach, no species or size dependent assumptions
  - Assumes only woody parts
  - Raumonen et al. (2013). Fast Automatic Precision Tree
     Models from Terrestrial Laser Scanner Data. Remote Sensing
  - · Calders et al. (2015). Non-destructive estimates of aboveground biomass using terrestrial laser scanning. Methods in Ecology and Evolution
- Two main steps
  - Topological tree structure from hierarchical segmentation of the point cloud
  - · Geometry from geometric primitives fitted to the segments



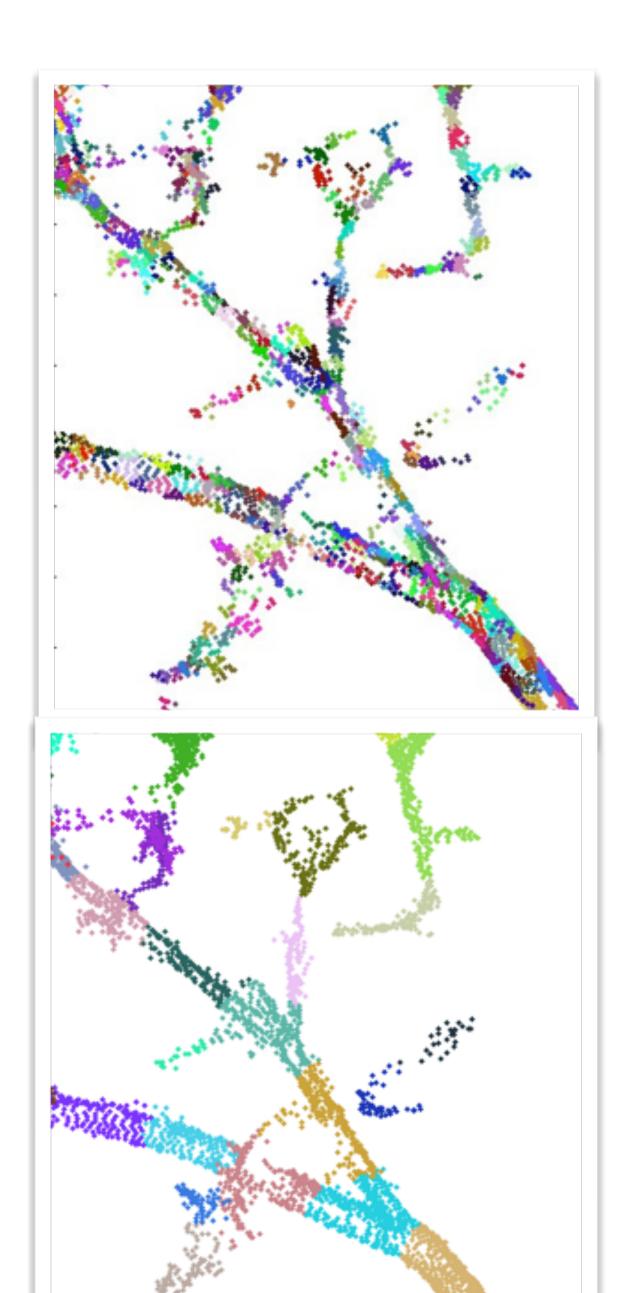
- How to determine individual segments from big point clouds fast and reliably?
- Random partition into subsets that correspond to small connected surface patches in the tree surface
  - Subsets are more efficient surface "units" than points
  - Much less subsets and more uniformly covered



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  - Much less subsets and more uniformly covered
  - Natural neighbour relation, forms a graph
  - Size (and location) affects the segmentation

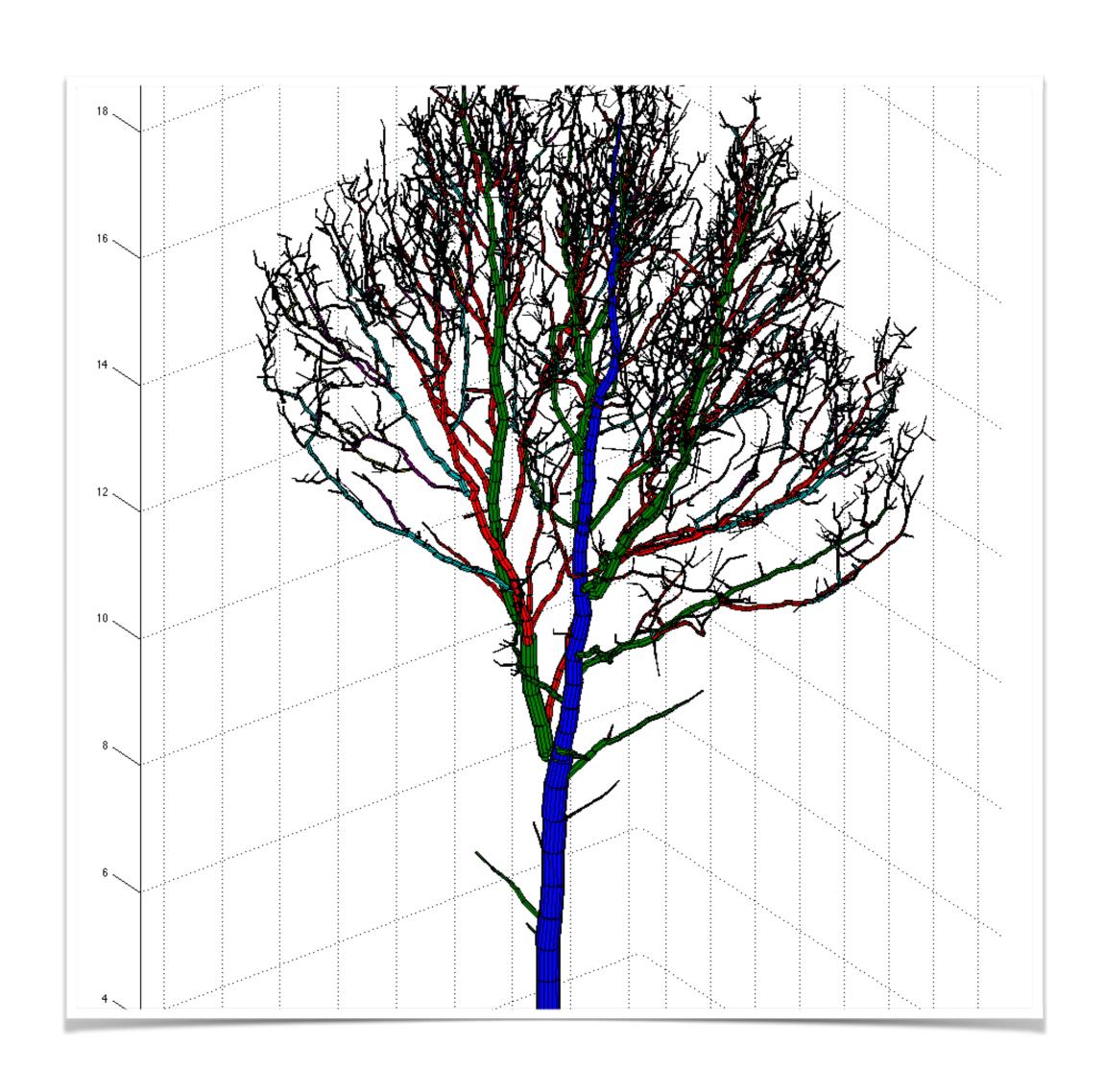


#### Sensitivities of the resulting QSMs

- Visibility
  - · Scan resolution, number of scans, height and structure of the trees
- Main approximation sizes
  - · Diameter of the patches, relative length of the cylinders
- Partitions are random
  - Resulting segmentation and QSM always little different
  - · Make about 5 models with same inputs to estimate variability
- · Cylinder is the most robust building block

### Many applications of QSMs

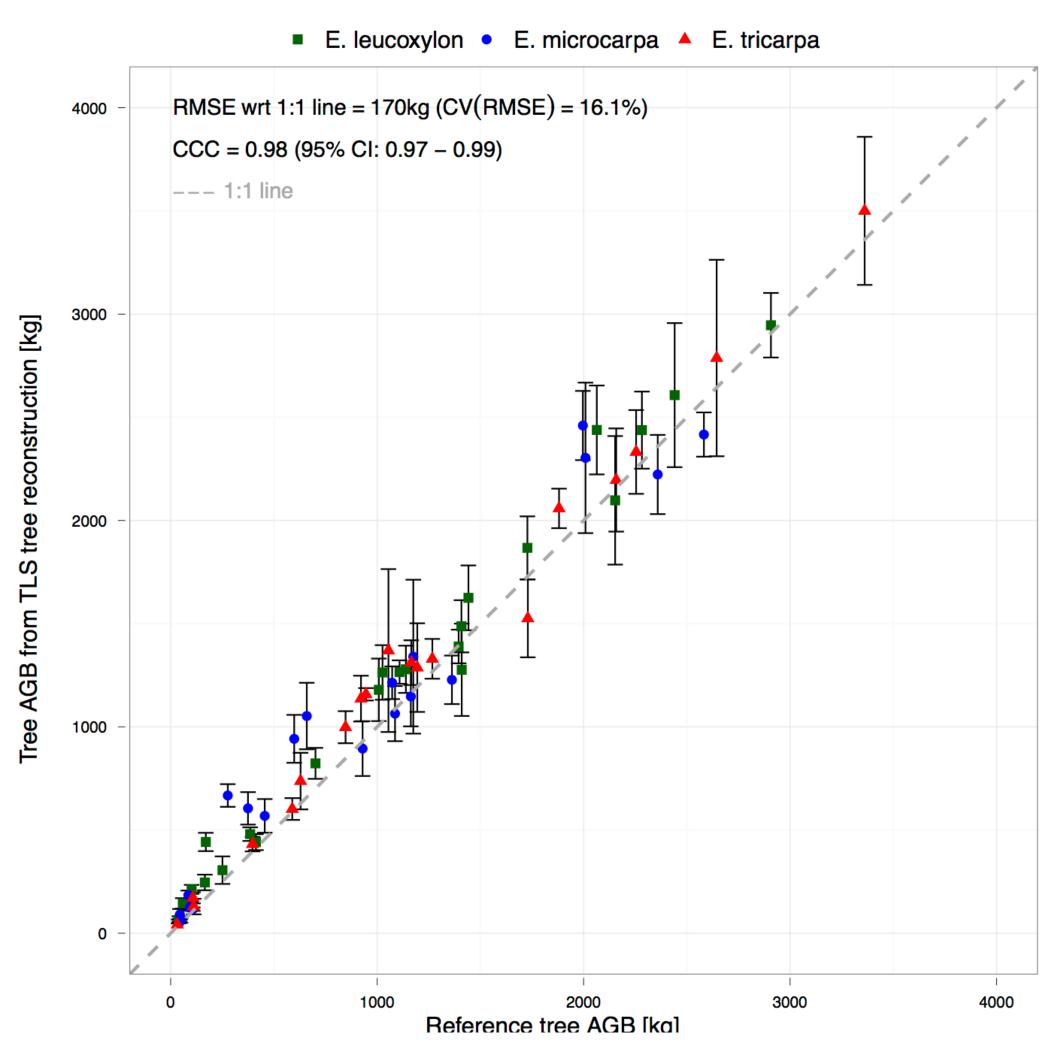
- Compact model containing most of the topological and geometrical tree information
- Not a model specifically build for a few particular attributes
- · Biomass estimation, change detection, species recognition, etc.



## Above-ground biomass

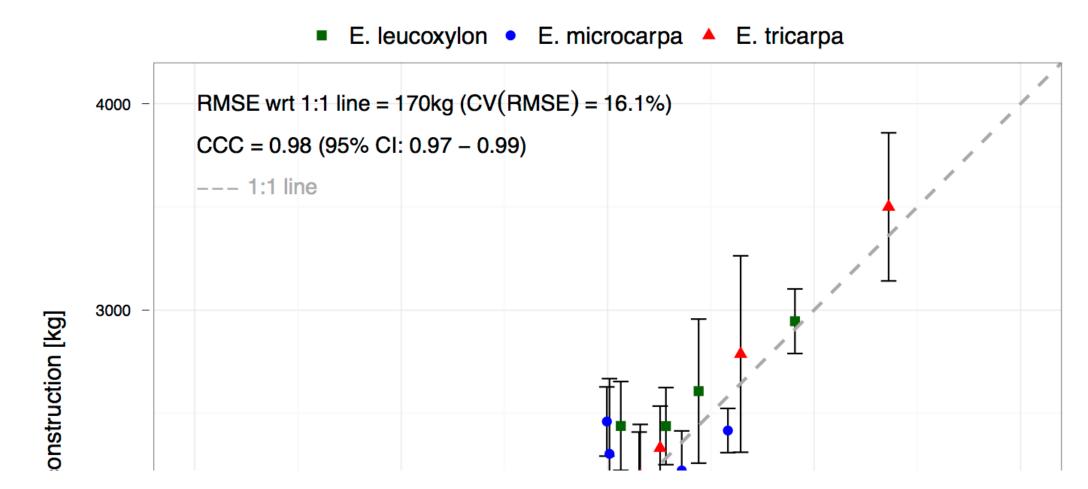
### Above-ground biomass

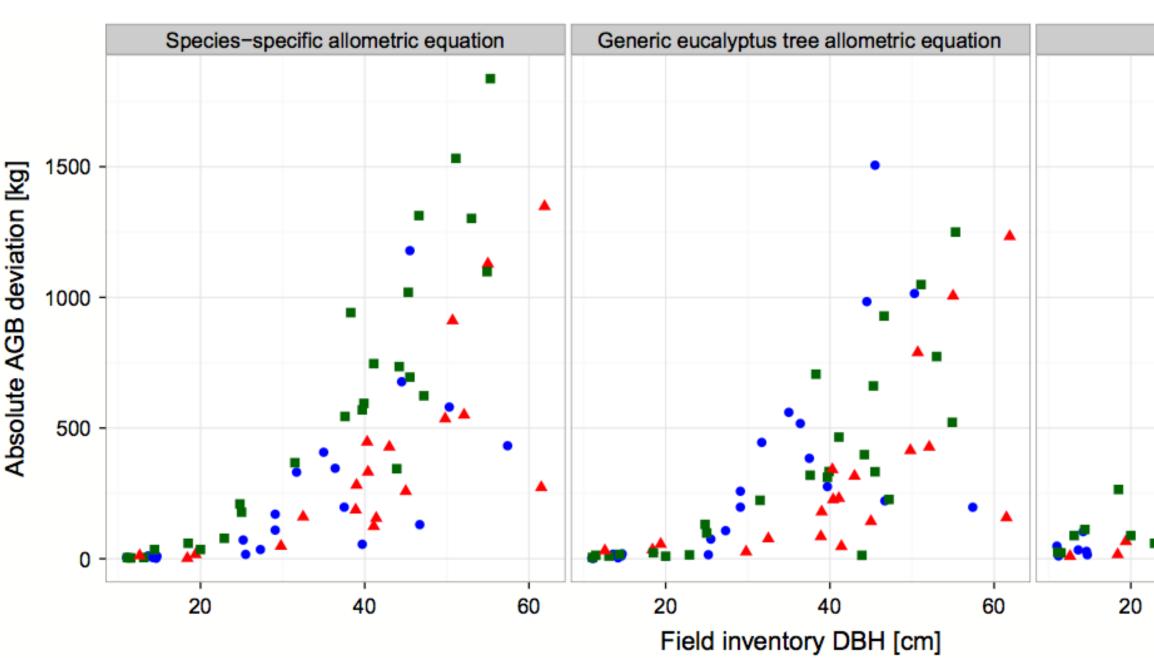
- TLS+QSM gives volume + wood density = biomass
  - Calders et al. (2015). Non-destructive estimates of above-ground biomass using terrestrial laser scanning. Methods in Ecology and Evolution
  - Hackenberg et al. (2015). SimpleTree an efficient open source tool to build tree models from TLS clouds. Forests
- Generally under 10% error in biomass



### Above-ground biomass

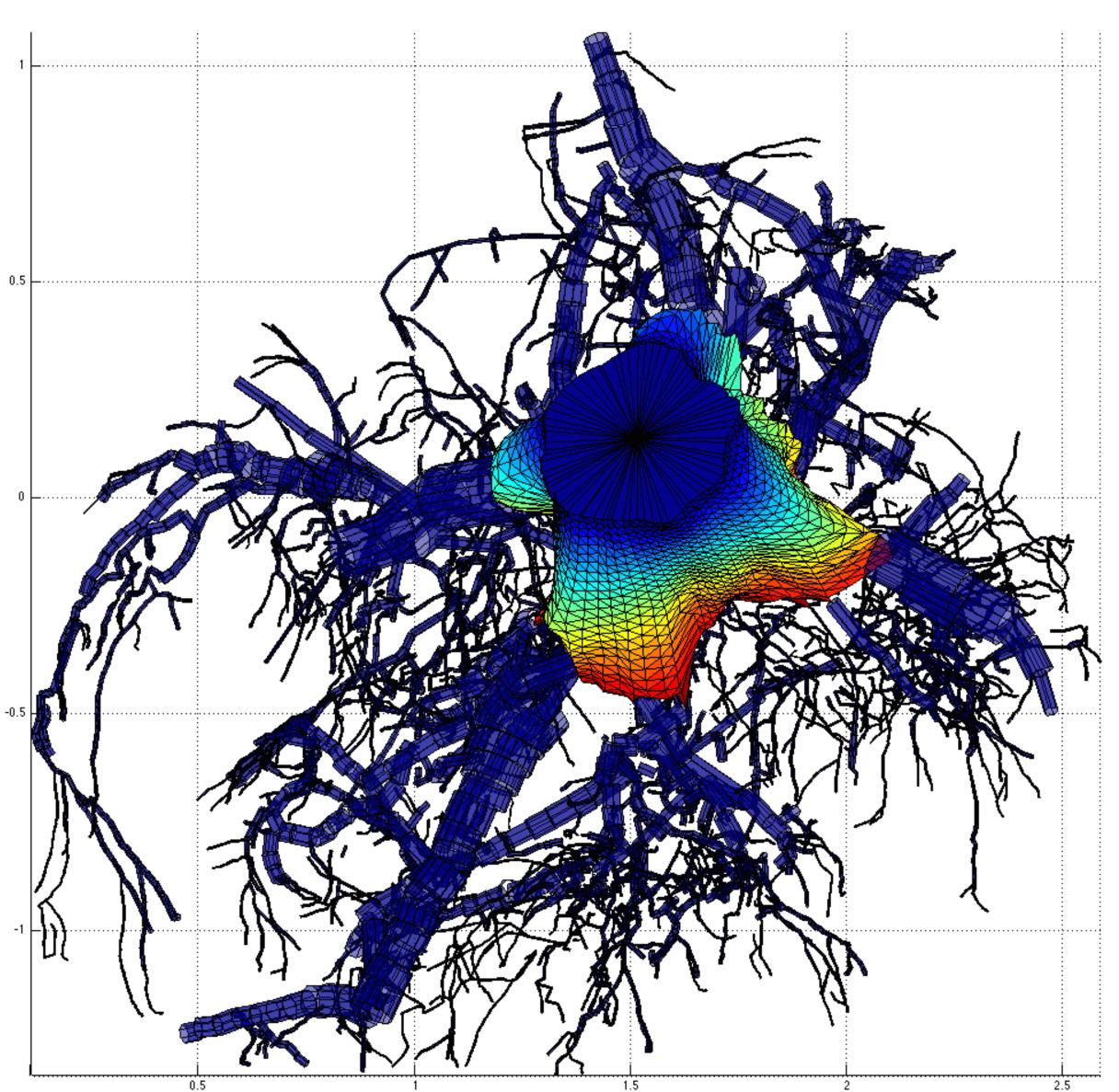
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- Generally under 10% error in biomass
  - For big trees allometry can give 30-50% errors





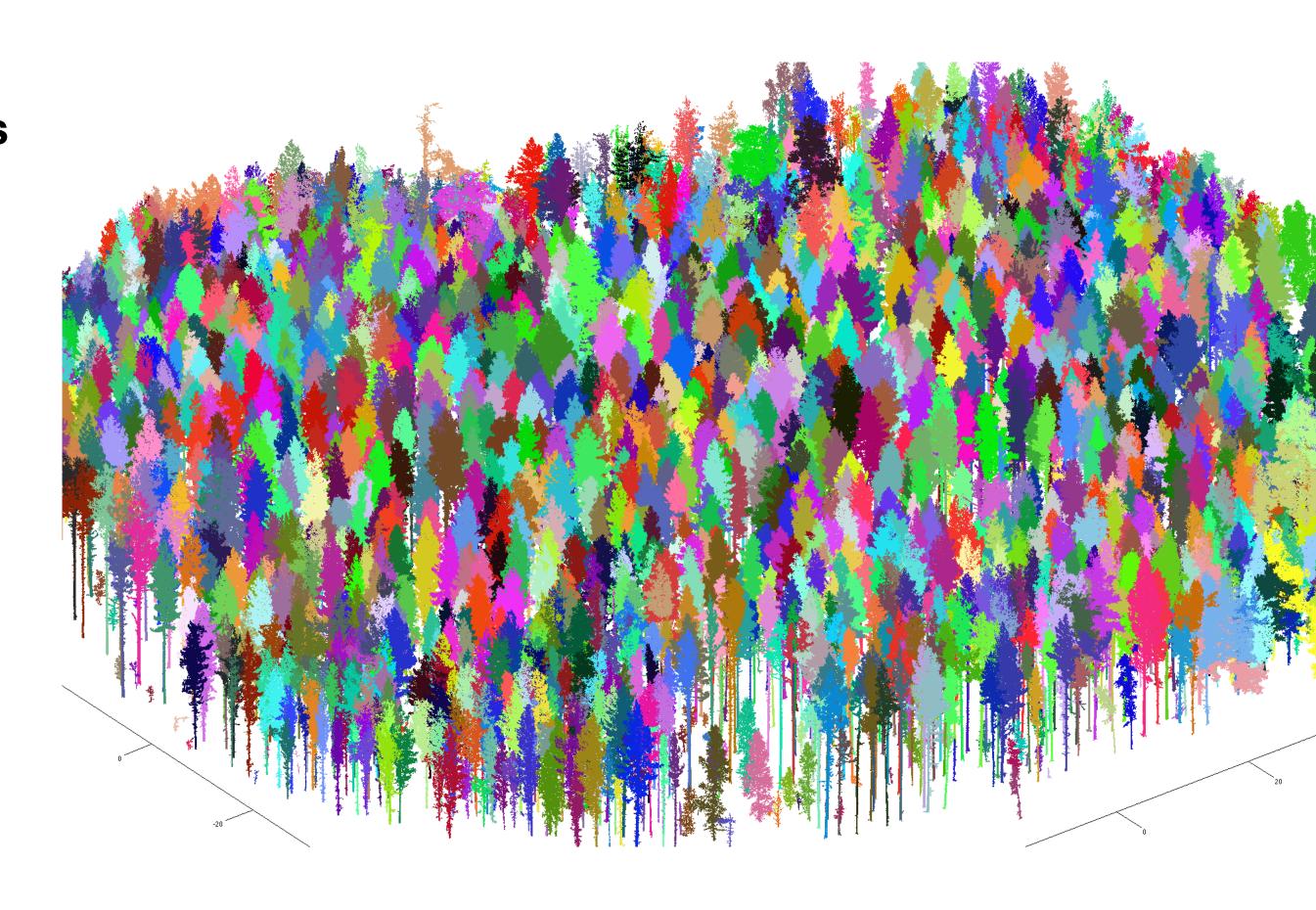
#### Below-ground biomass and structure

- Stump-root systems of big trees were uprooted and cleaned, then scanned
- Hybrid QSM
  - triangulation for the stump
  - cylinders for the roots
- Smith et al. (2014). Root system characterization and volume estimation by terrestrial laser scanning. Forests
  - Underestimated volume by 4.4%
  - Widely applicable and easily adapted to derive other topological and volumetric root variables



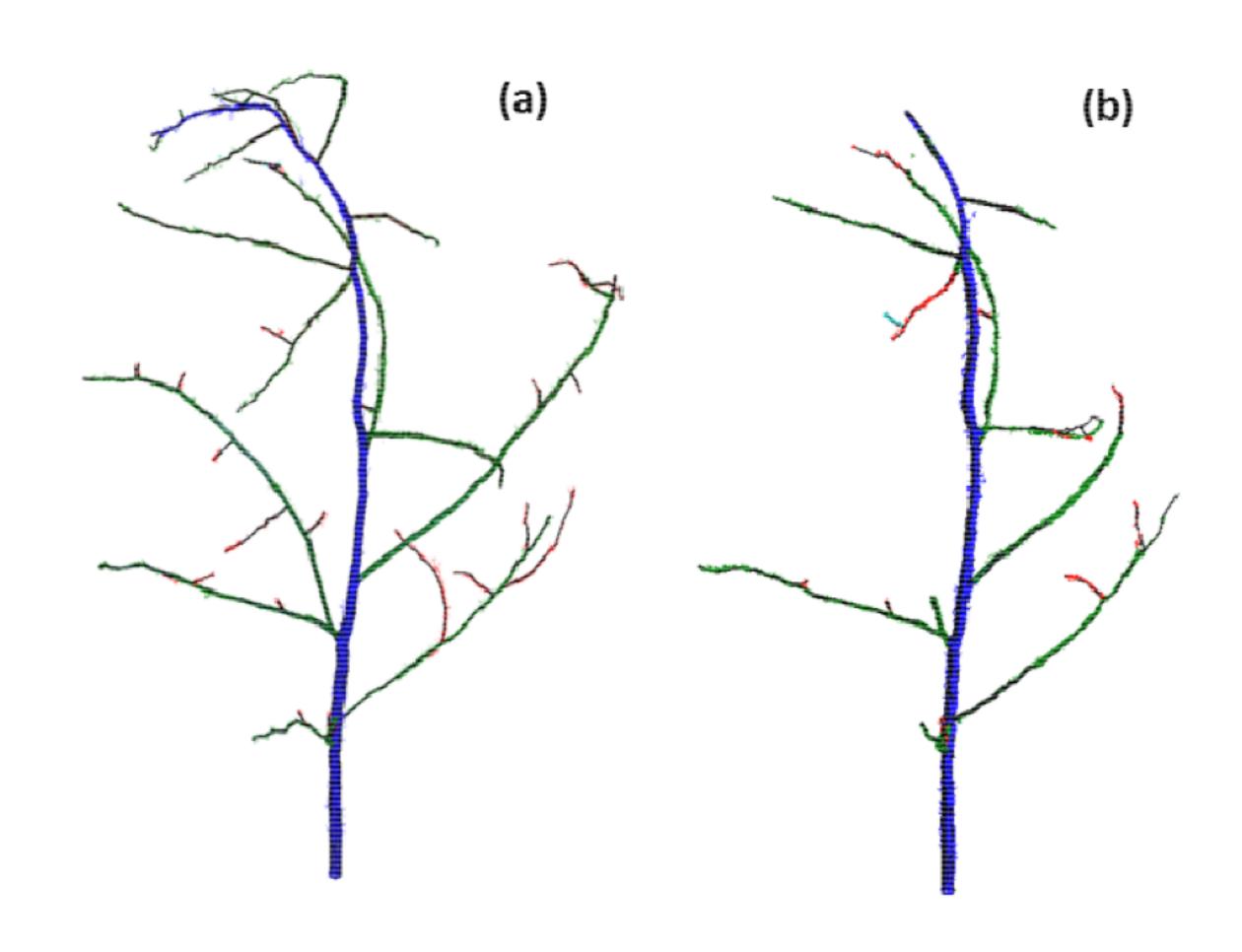
#### Massive scale tree modelling

- Huge point clouds from forest plots and regions
  - Multi-hectare, thousands of trees, 10^8-10^9 points
  - Basic computer is enough
  - Raumonen et al. 2015: "Massive-scale tree modelling from TLS data". *ISPRS Annals*, Volume II-3/W4
- The challenge is automatic tree extraction
  - Partition the whole point cloud into small subsets
  - Locate stems using heuristics
  - Segmentation separates the trees



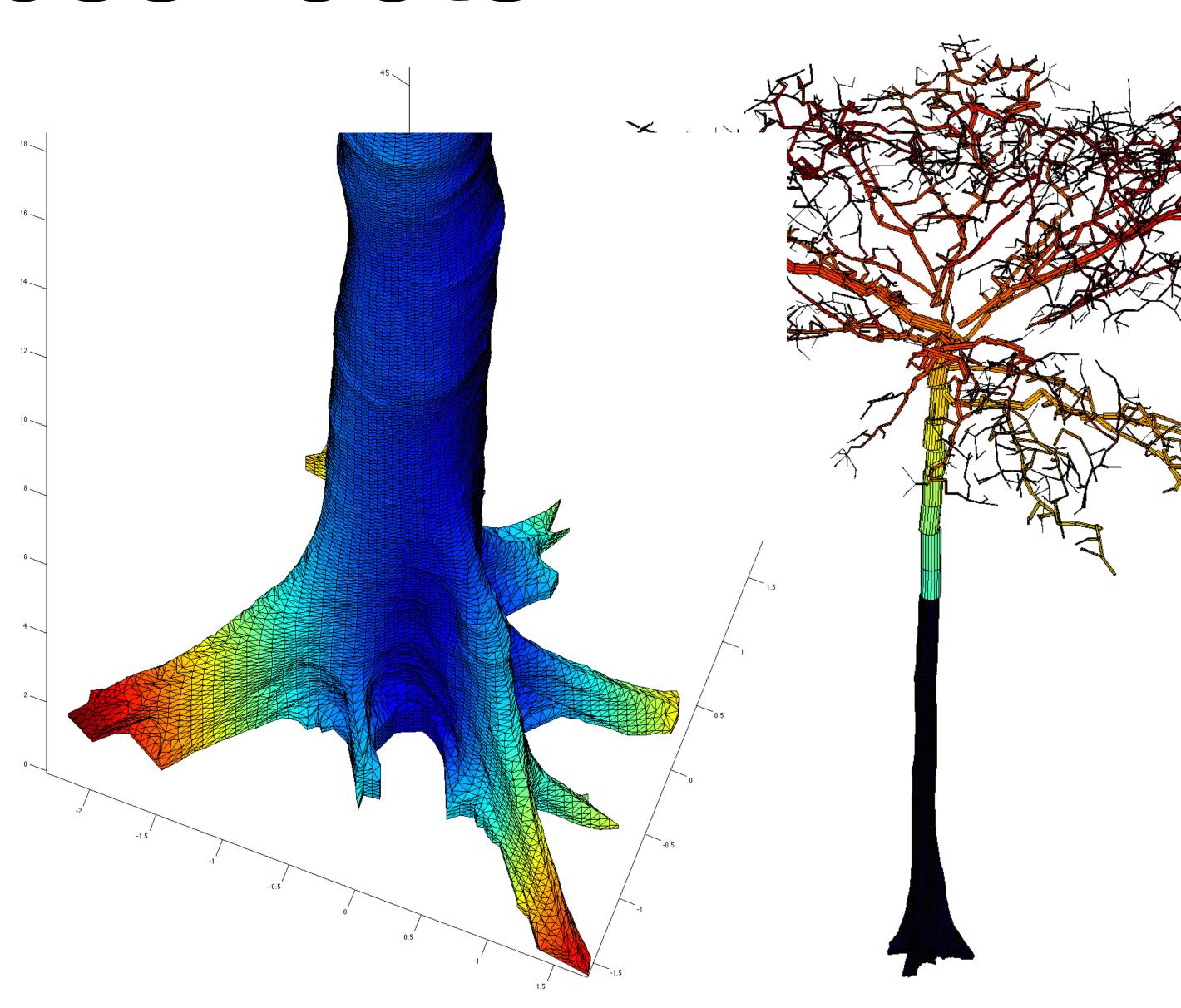
#### Change detection and quantification

- Nondestructive TLS measurements can be repeated in time
- QSM can detect and quantify the changes
- Kaasalainen et al. (2014). Change Detection of Tree Biomass with Terrestrial Laser Scanning and Quantitative Structure Modelling. Remote Sensing, 6, 3906-3922.



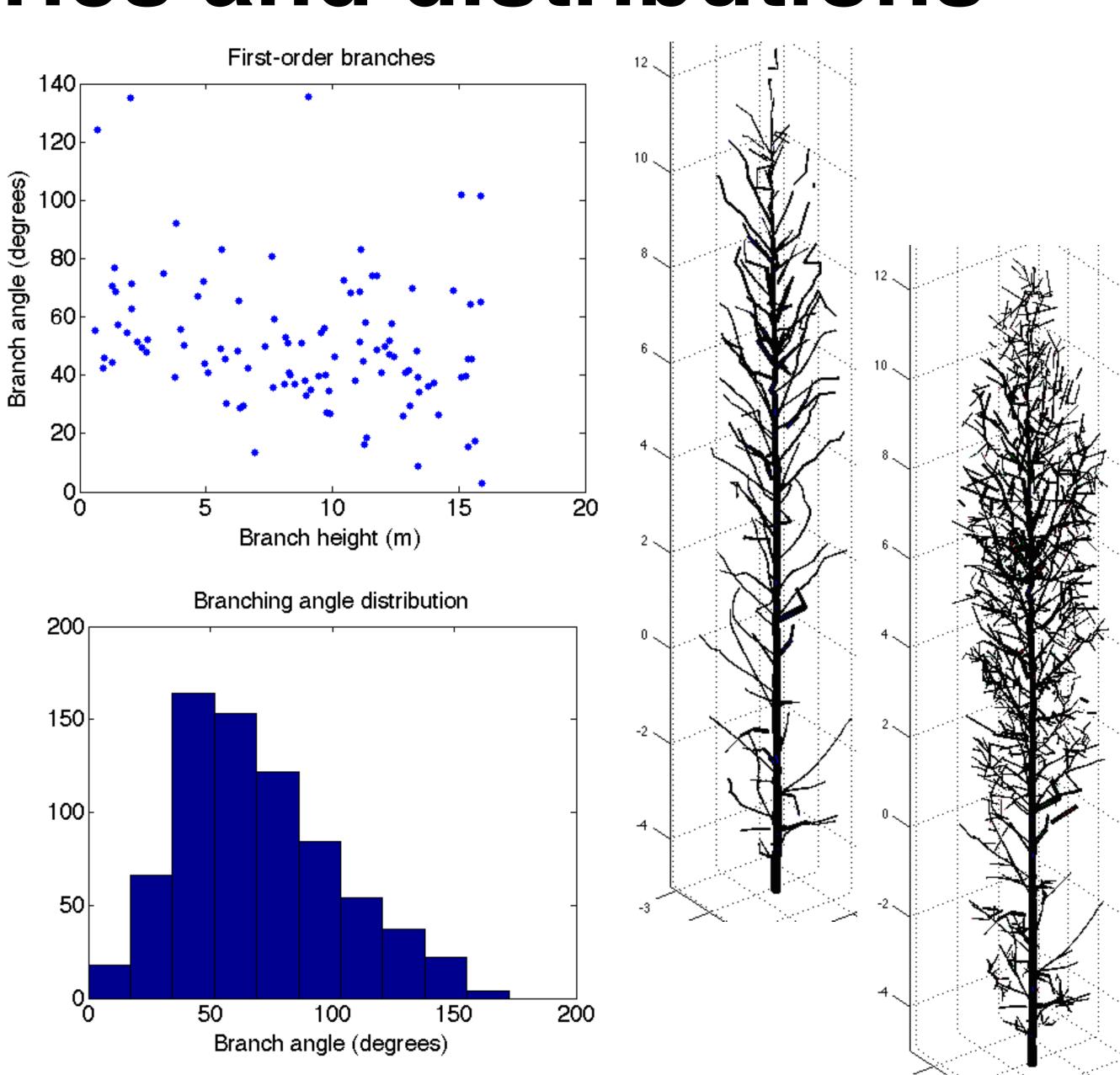
#### Buttress roots

- Hybrid QSMs for large trees with complicated buttress roots
- Triangulation based on crosssection boundary curves
- · Bauwens et al. Work in progress.



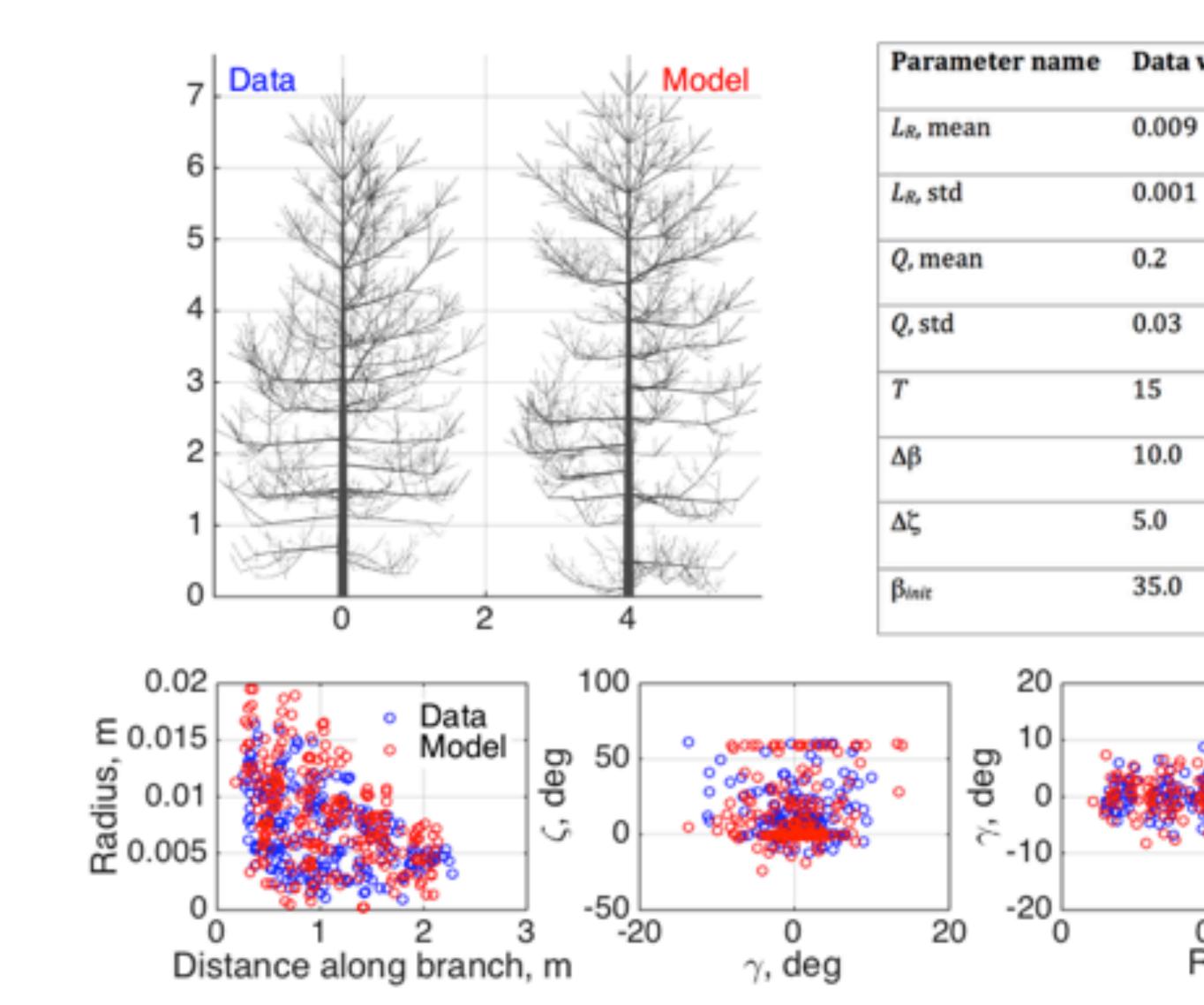
#### Tree structure metrics and distributions

- Easy extraction of topological and geometrical structural tree information
  - E.g. branching angle
- Determination of tree phenotype
- Species recognition



#### Functional structural tree models

- Stochastic Structure Models (SSM)
- FSTMs with randomness by considering some parameters as distributions
- FSTMs are optimised against statistical structural data from QSMs
  - Optimise model parameters so that structural distributions coincide
- Potapov et al. (2015). Data-based stochastic modelling of tree growth and structure formation. Silva Fennica, under review



### Other applications

- Mechanical response to wind forcing
- Forest fires and fuel structure modelling
- · QSMs as supports for eco-physiological data
  - · leaves, chlorophyl, etc
- · And surely some more...

## Summary

- TLS and QSMs offer a comprehensive way to model and measure trees
- Non-destructive, fast, cheap
- Many applications
- New approach
  - accurate and comprehensive models for each tree
  - instead of traditional statistical approach or models for particular attribute

