



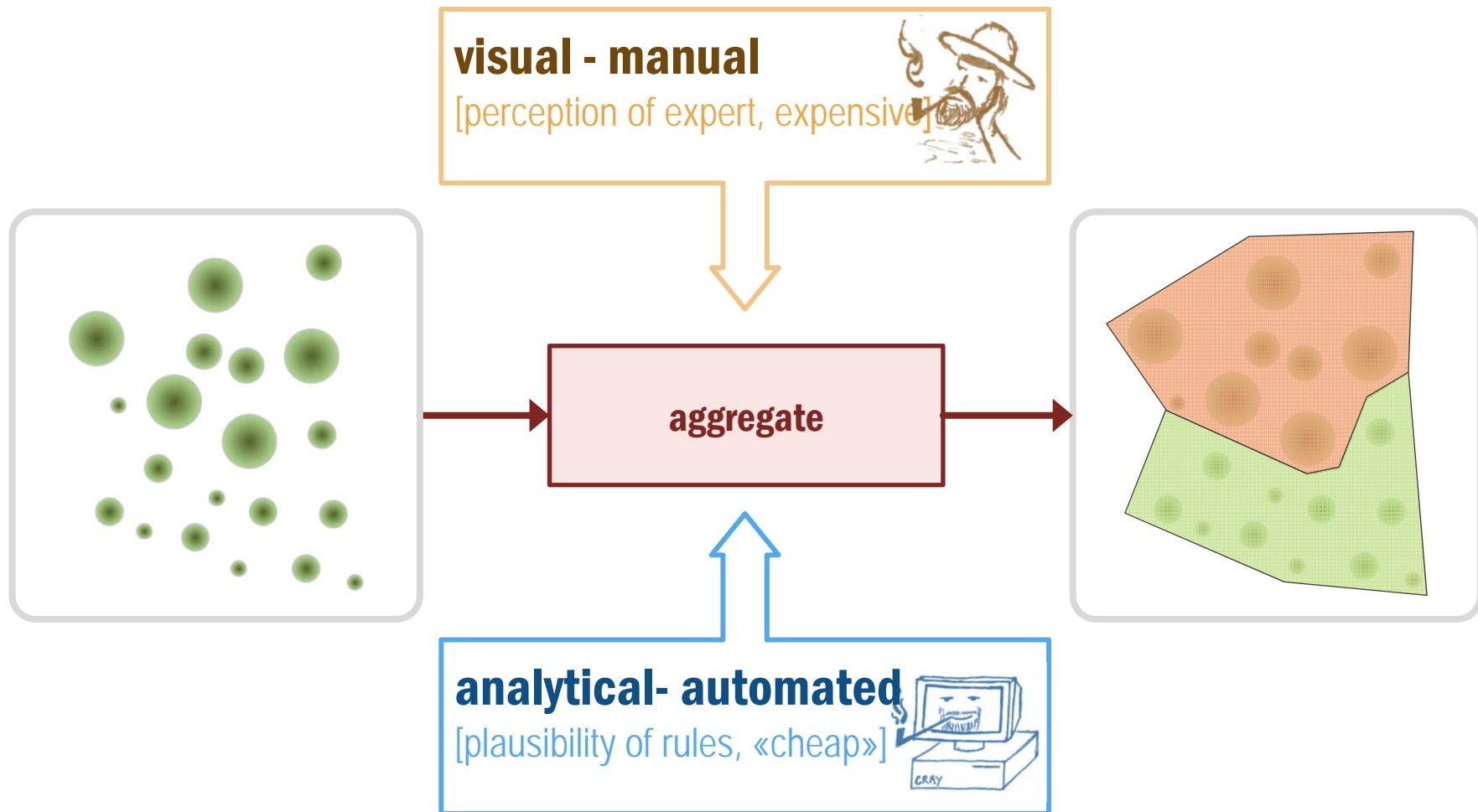
A p-median model to automate stand delineation

J.R. Breschan and H.R. Heinimann

ETH Zurich, Department of Environmental Systems Sciences, Switzerland

corresponding address: jochen.breschan@usys.ethz.ch

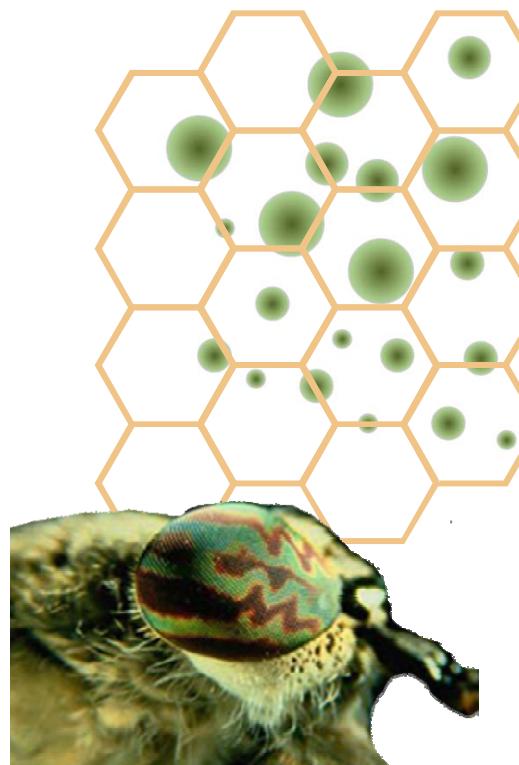
Stand delineation Problem



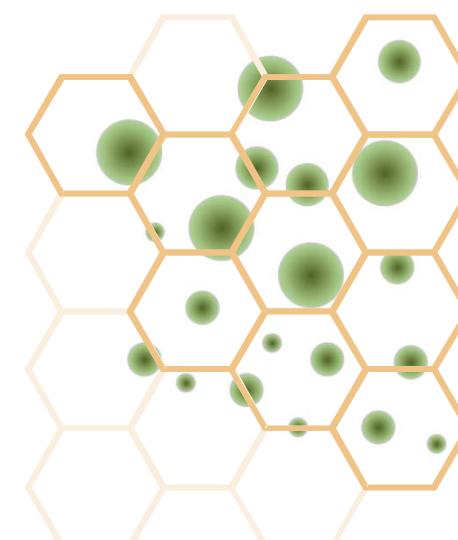
Problem representation

Hexagons...

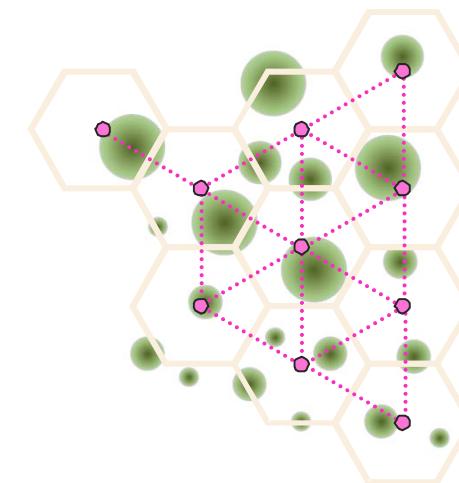
... share edges with all neighbors (compactness)



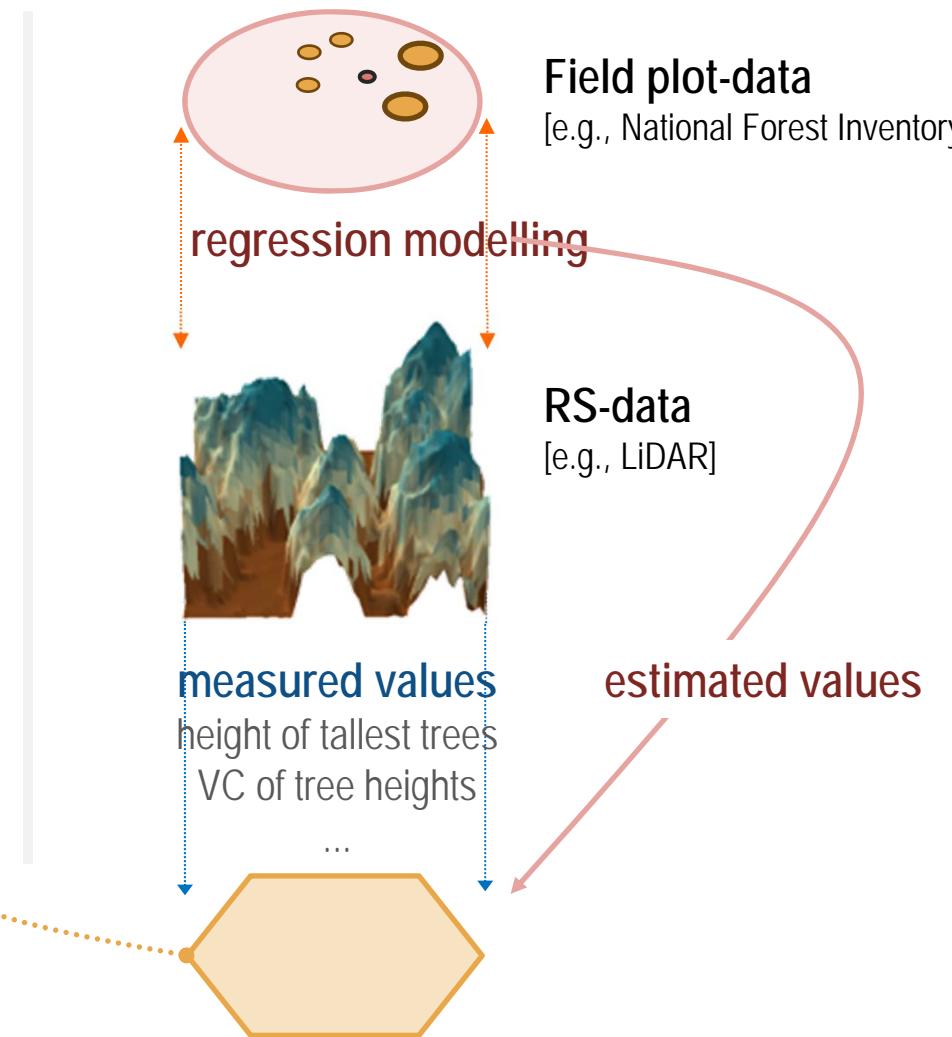
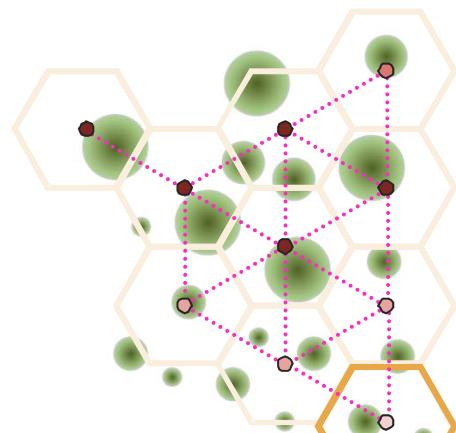
Restrict to forested area



Transfer to network



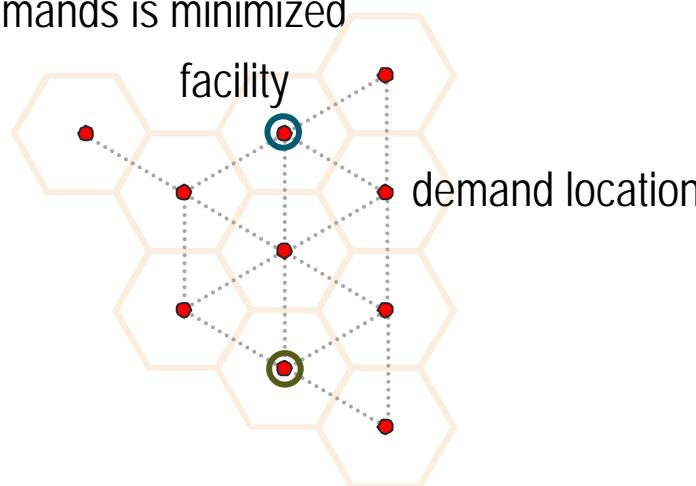
Estimation of forest parameters



Stand delineation via p-median optimization model

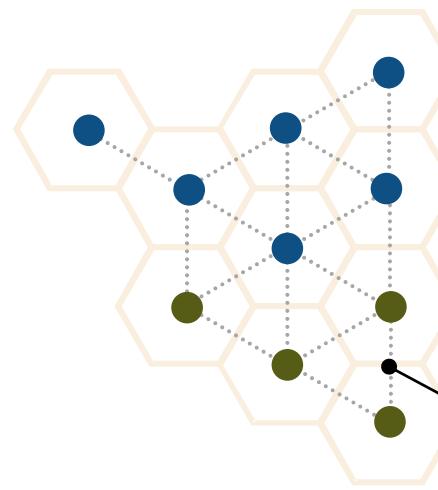
Original problem

Locate p (=2) facilities on network such that total distance for supply of demands is minimized



By-product

Assign closest facility to each demand location

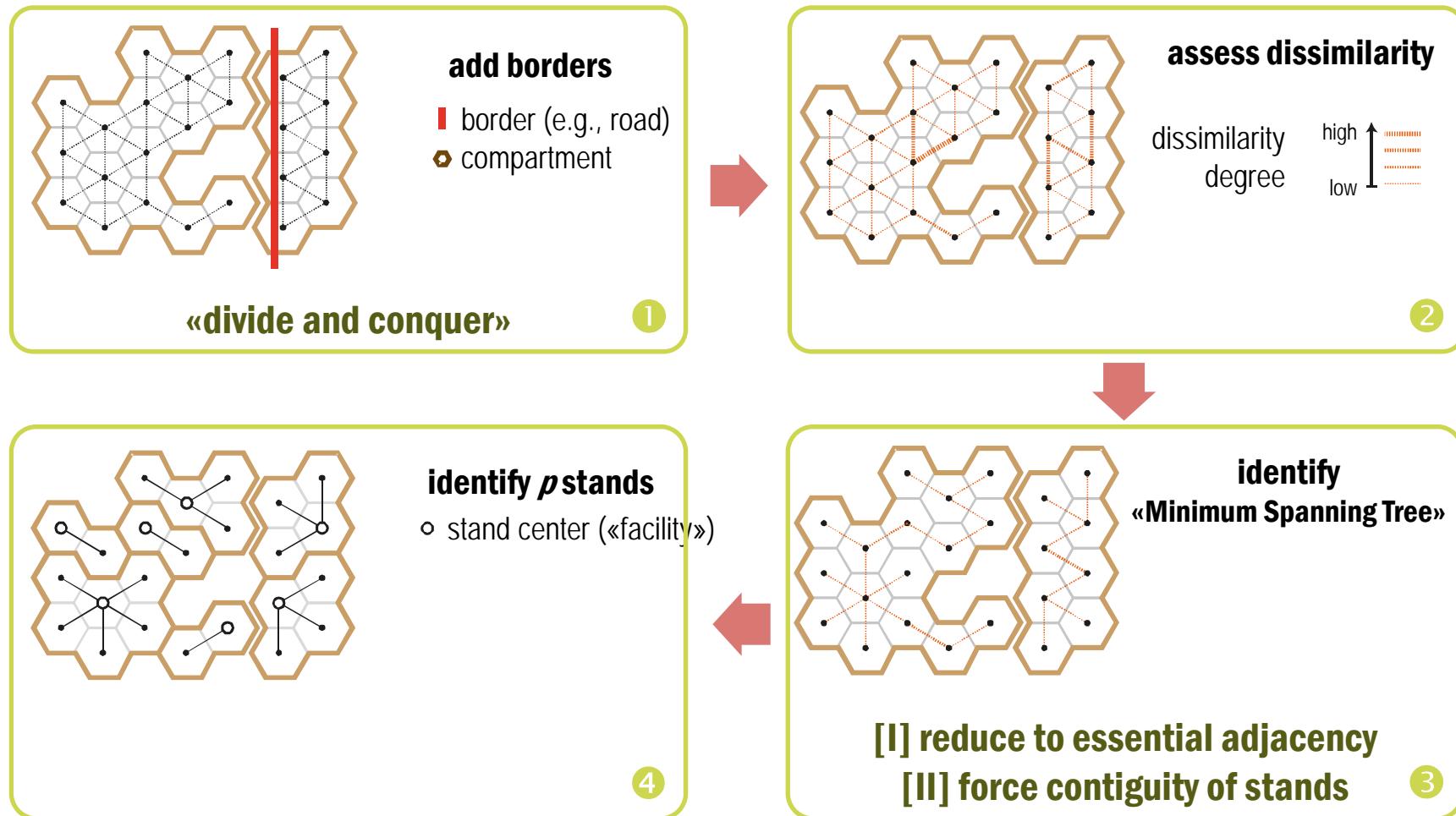


Interface for stand delineation

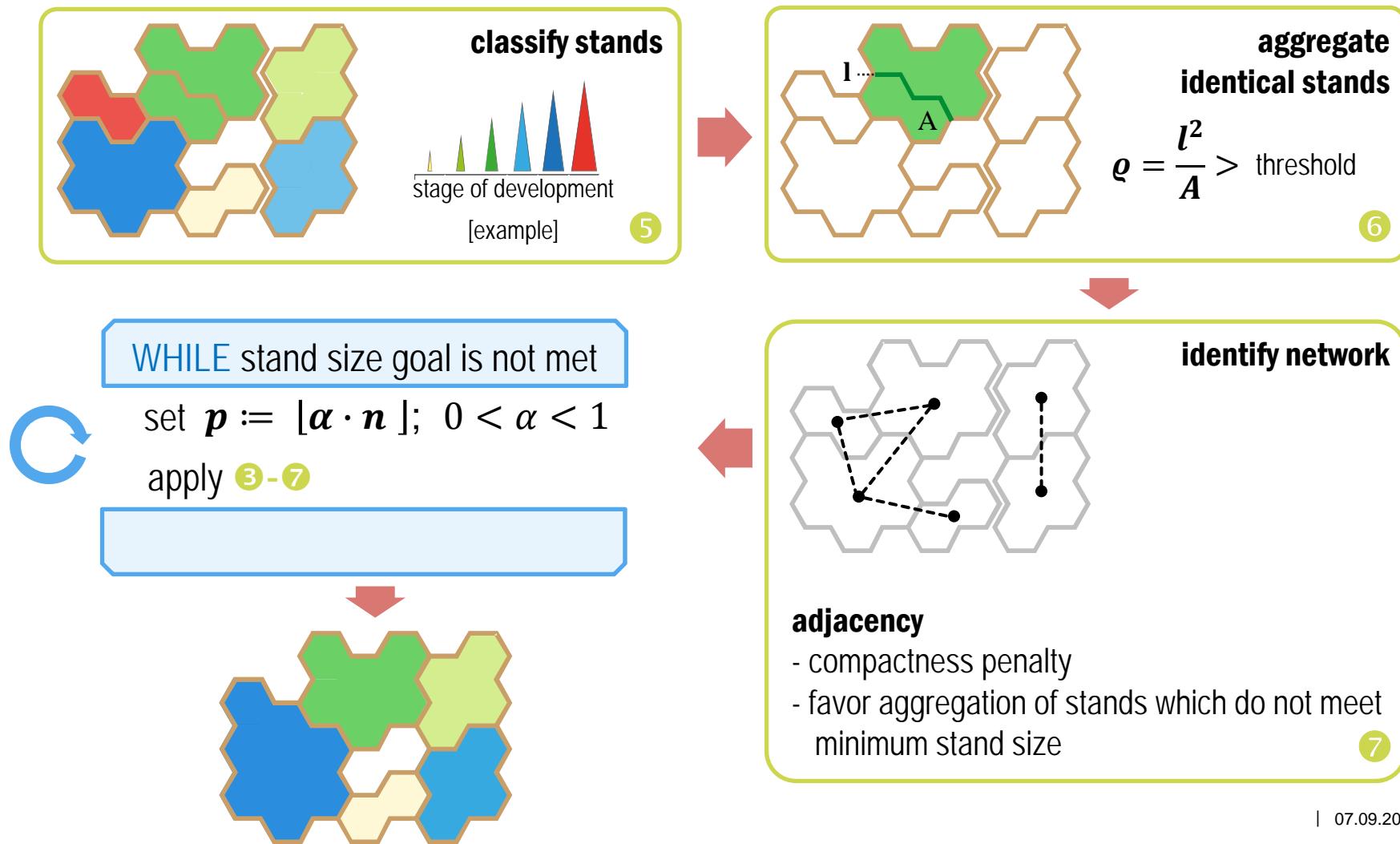
demand location	↔ hexagon
facility	↔ stand center
p	↔ #stands

weight edges by dissimilarity in forest parameter values

Work flow – solve for p stands

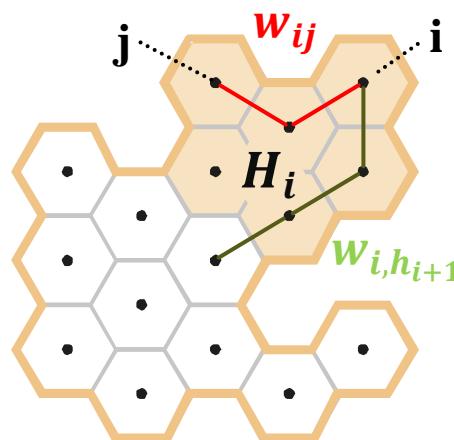


Work flow – solve for «stand size» goal



p-median optimization model

Variables, parameters, sets



name	type	description
x_{ij}	VAR / binary	1 , hexagon i assigned to stand center j 0 , else
f_i	VAR / binary	1 , hexagon i not assigned to stand center $j \in E$ 0 , else
H_i	set	set of H closest stand centers j of hexagon i
w_{ij}	PARAM / real	shortest distance from i to j , weighted by dissim
n	PARAM / integer	number of hexagons
p	PARAM / integer	number of stands

BEAMR-formulation of p-median problem [CHURCH 2008]

p-median optimization model

$$MIN \sum_{i=1}^n \sum_{j=1}^n \textcolor{red}{w_{ij}} \cdot x_{ij} + \sum_{i=1}^n \textcolor{green}{w_{i,hi+1}} \cdot f_i$$

minimize total dissimilarity

$$\text{s.t. } \sum_{j \in H_i} x_{ij} + f_i = 1 \quad \forall i = 1, \dots, n$$

assign hexagon to stand center

$$\sum_{j=1}^n x_{jj} = p$$

create p stand centers

$$x_{ij} \leq x_{jj} \quad \forall i = 1, \dots, n \\ \text{and } j \in H_i, i \neq j$$

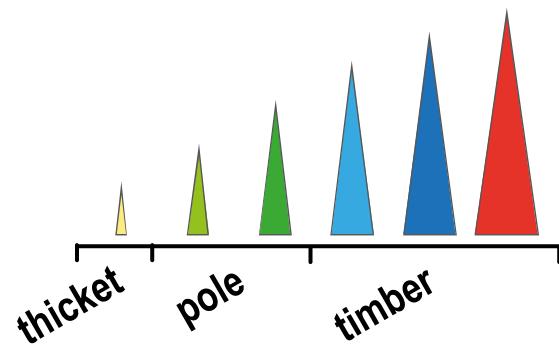
i can only be assigned to j
when j is a stand center

Results - Test areas

	Swiss Plateau Winterthur, 500-580 m ASL	Swiss Alps Klosters, 1500-1650 m ASL
hexagons	size [m ²] count [-] overall area [ha]	200 776 15.52
obstacles	none	roads, waterways
forest parameters	height of dominant trees	height of dominant trees VC of tree heights
classification	stage of development	stage of development single- or multi-layered
RS-data	LiDAR (0.5x0.5m)	LiDAR (0.5x0.5m)

Classification

stage of development
[based on dominant tree height]

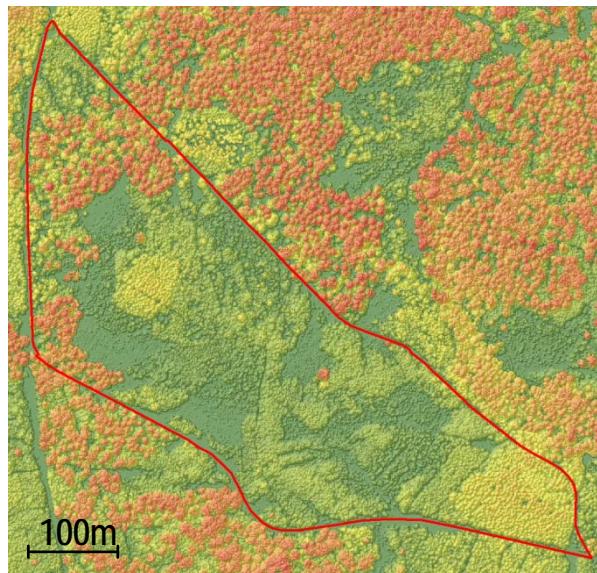


vertical structure
[based on VC of tree heights]

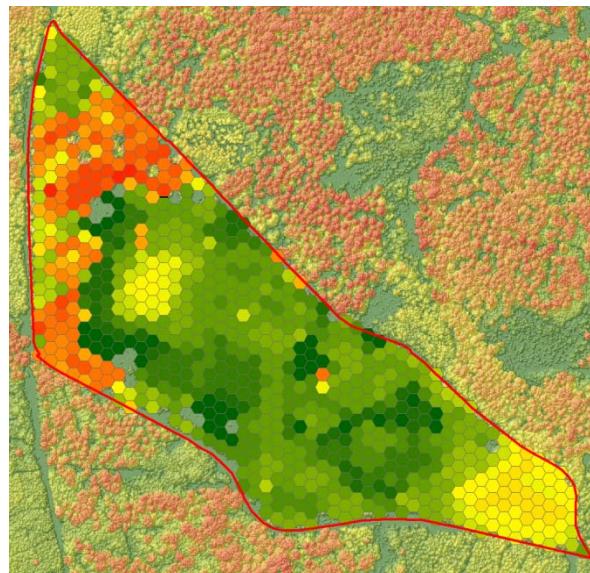
- single-layered
- multi-layered

Results - SWISS PLATEAU

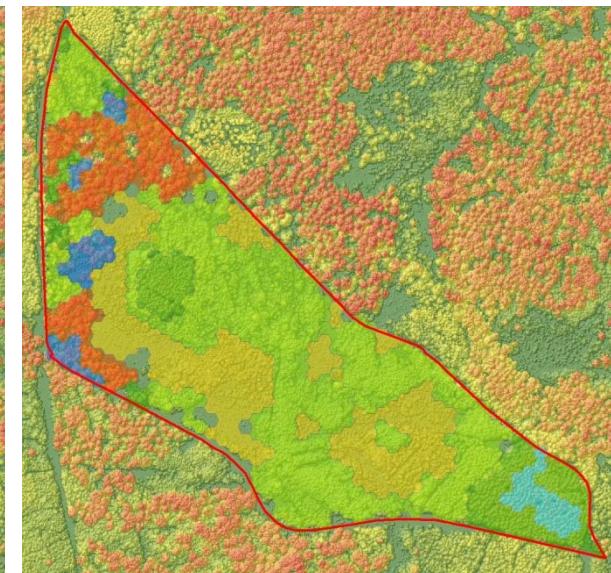
Canopy Height Model



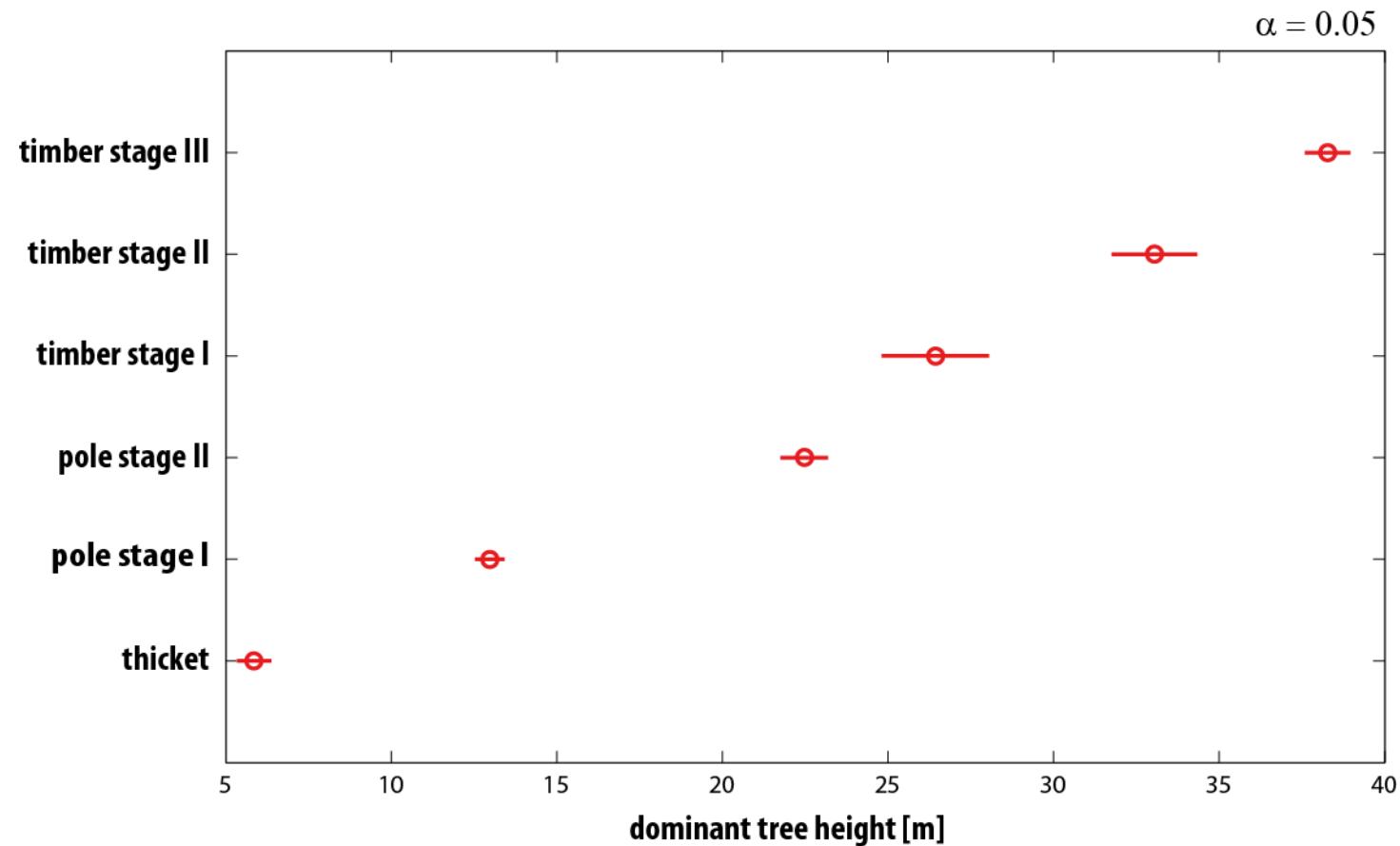
Hexagon dataset
[dominant tree height]



Stands

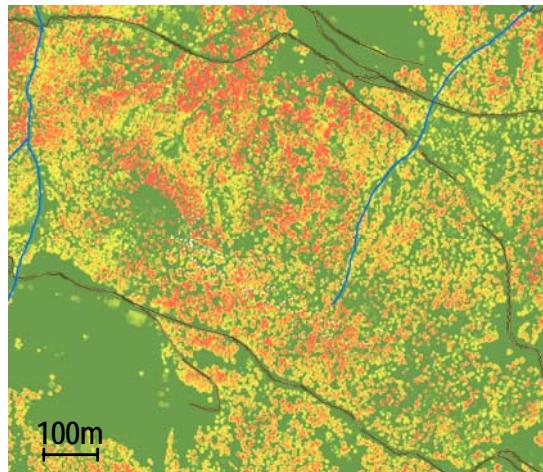


Classification quality [Tukey's Test]

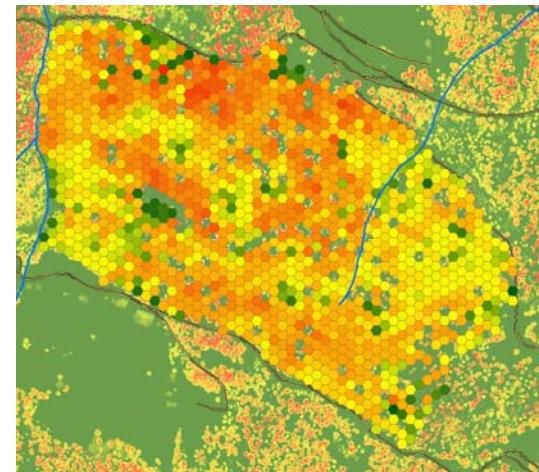


Results - SWISS ALPS

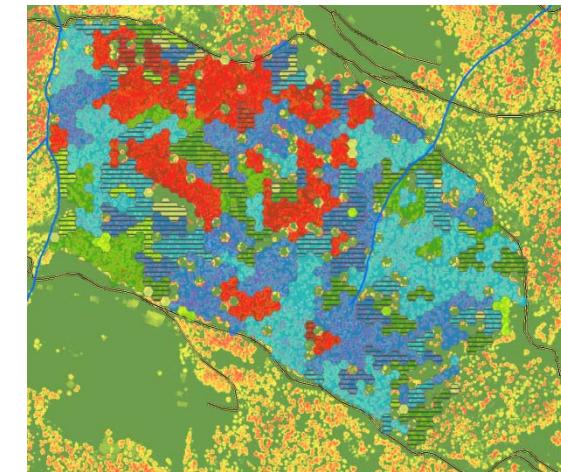
Canopy Height Model



Hexagon dataset
[dominant tree height]



Stands



1.5 min



1.0 min

Discussion and Outlook

ILP-approach for automated stand delineation

- produces **contiguous** stands that meet **minimum size requirement**
- **quality** assessment of stand map
- **fast** computation
- **adaptable** to local requirements
- **interface** to forest inventory

Outlook

- add **tree species information** to stand delineation
- **generalize forest parameter values** in hexagons prior to optimization