



THE OHIO STATE UNIVERSITY

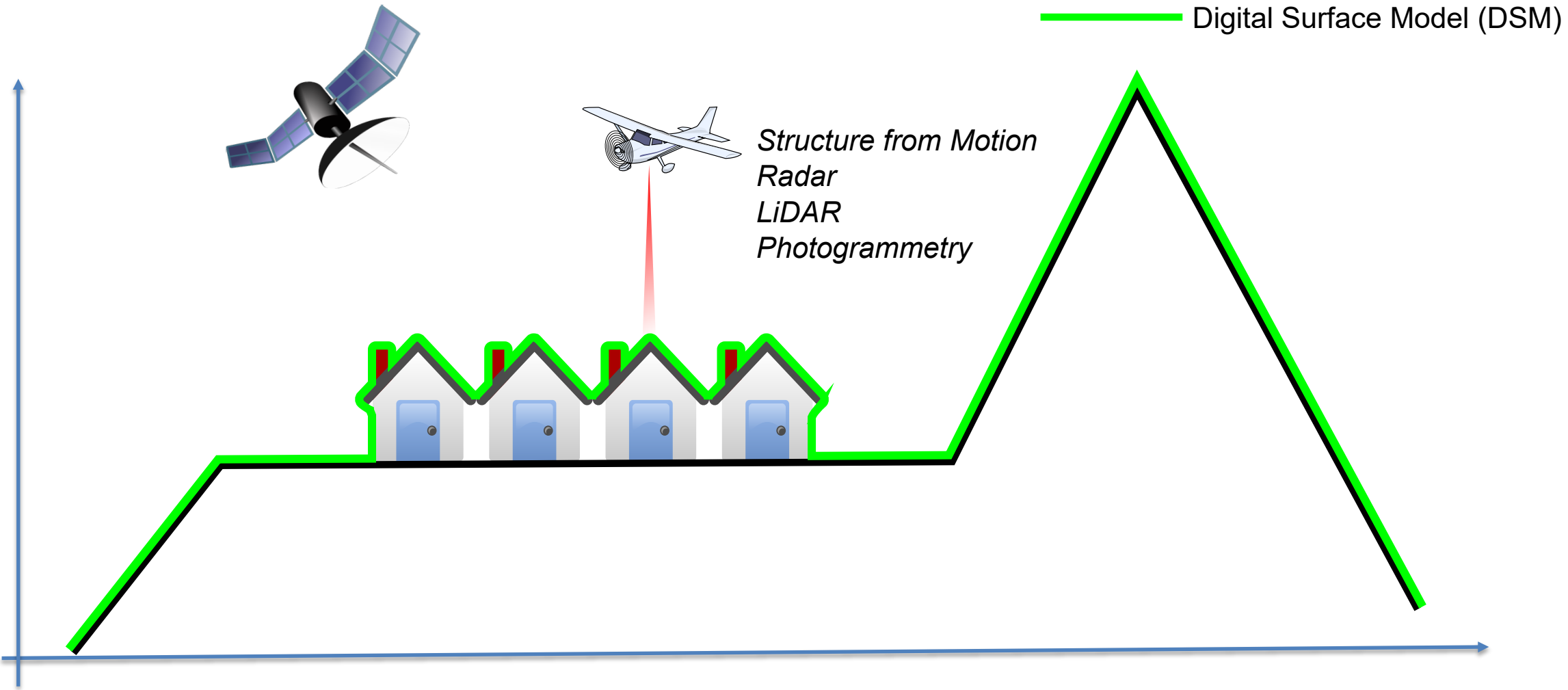
COLLEGE OF ENGINEERING

Large-scale DSM Registration via Motion Averaging

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May 16, 2024

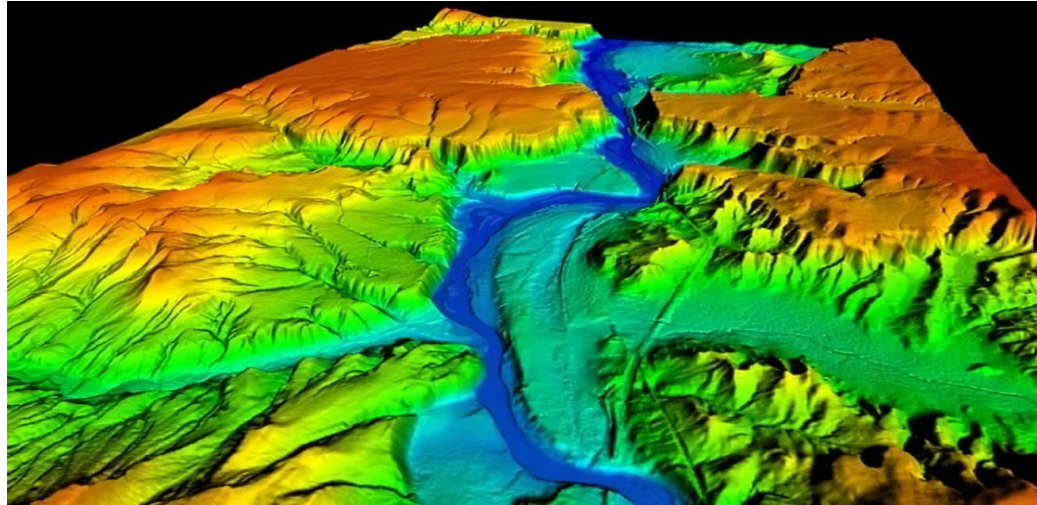
Digital Surface Model (DSM)



Orthophoto | City Models | Digital Terrain Models | Vectorized Building footprints ...

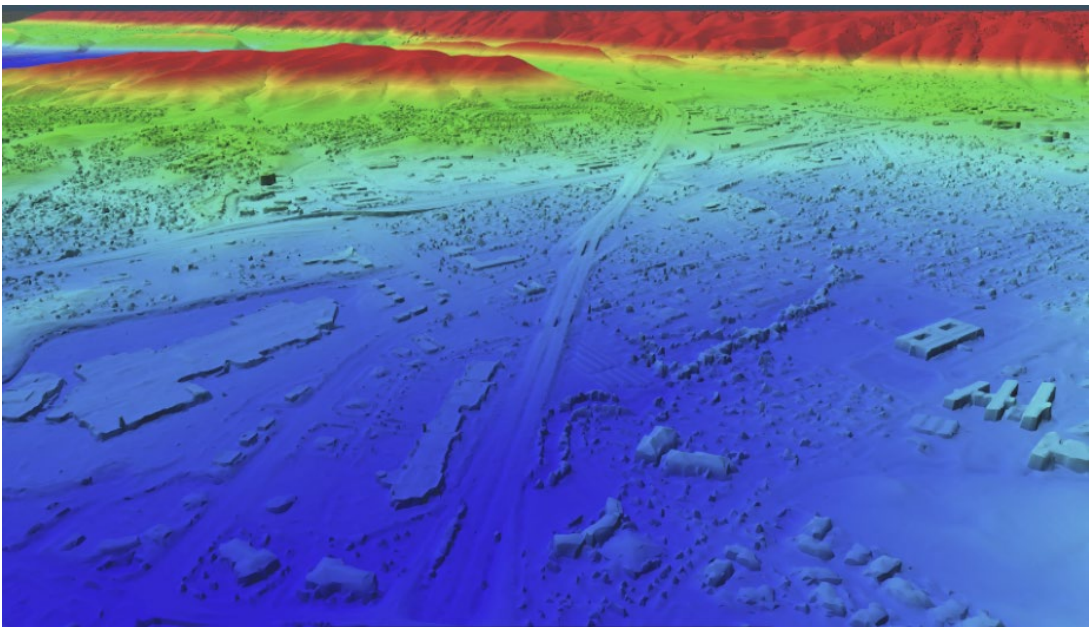
Global-scale mapping

- SRTM DEM
- ASTER DEM
- NASA DEM
- ALOS 3D



~ 30 m spatial resolution
+/- 90 m vertical accuracy

- Maxar 3D Foundation
- Airbus WorldDEM
- ZY-3, GF etc.
-



~ 5-0.5 m spatial resolution
+/- 3-10 m vertical accuracy

Single-source V.S Multi-source

Images → Bundle Adjustment → DSM

V.S.

Individual-sourced DSMs → 3D Registration → DSMs

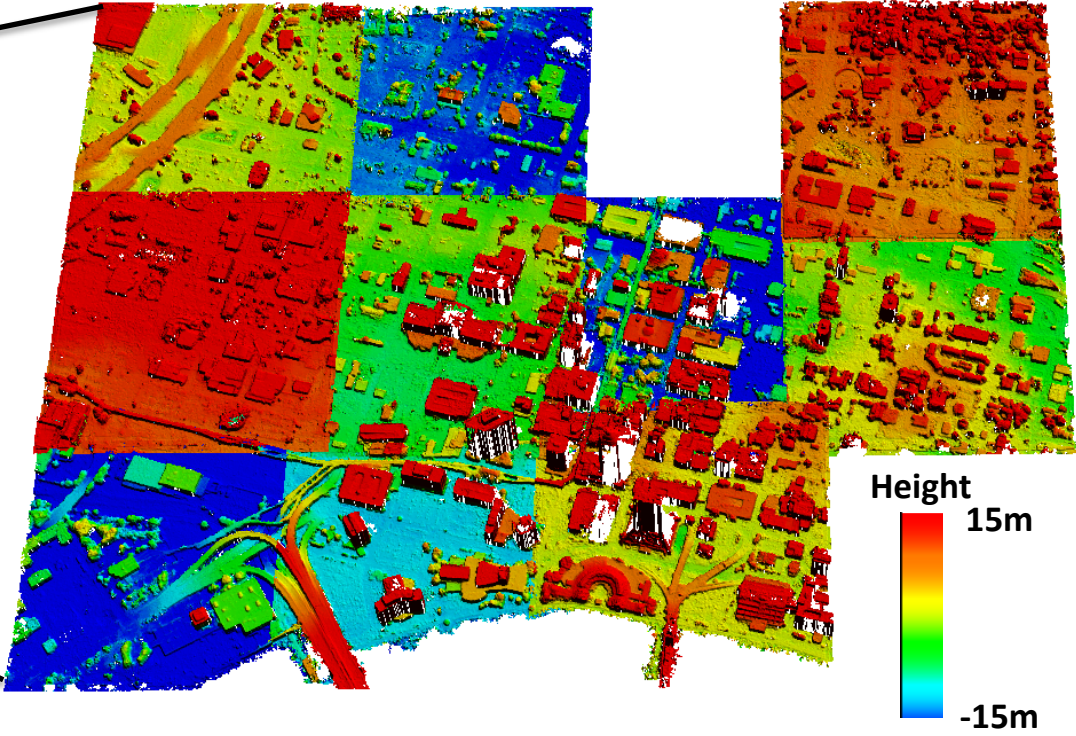
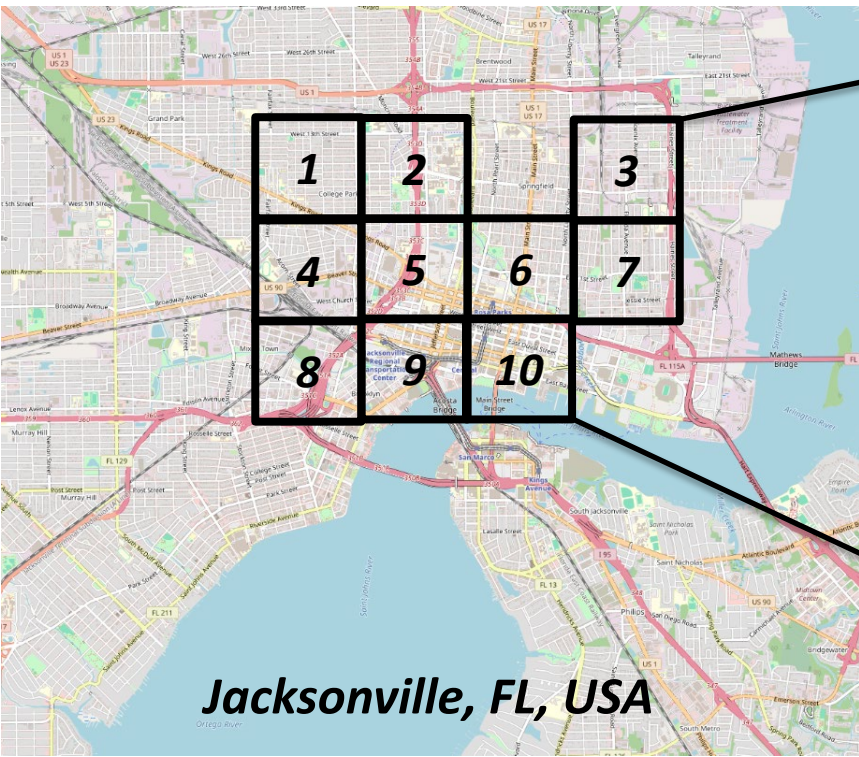


- **More sources mean better data availability**
- **Ability to incorporate sources beyond images**
- **Potentially more cost-effective.**

Problem

Biases exist on individually generated DSMs

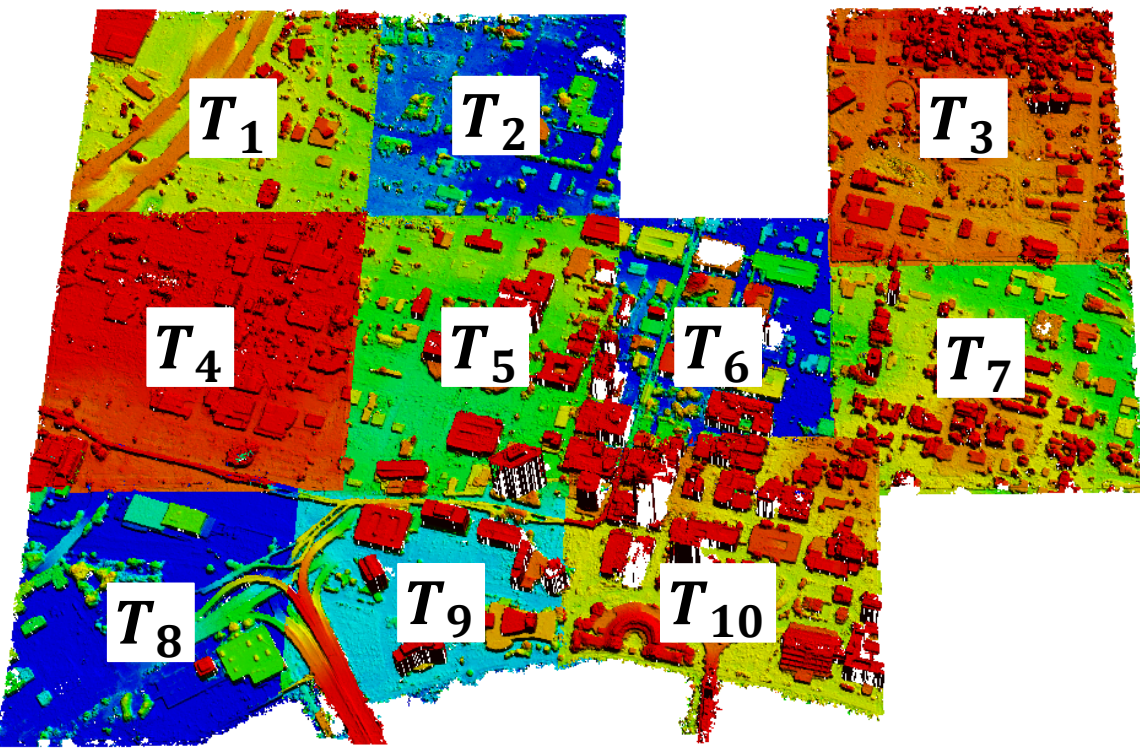
*Dataset: DFC 2019
Sensor: 26 WorldView2/3 images, LiDAR
Time span: Apr,2016 - Aug,2017*



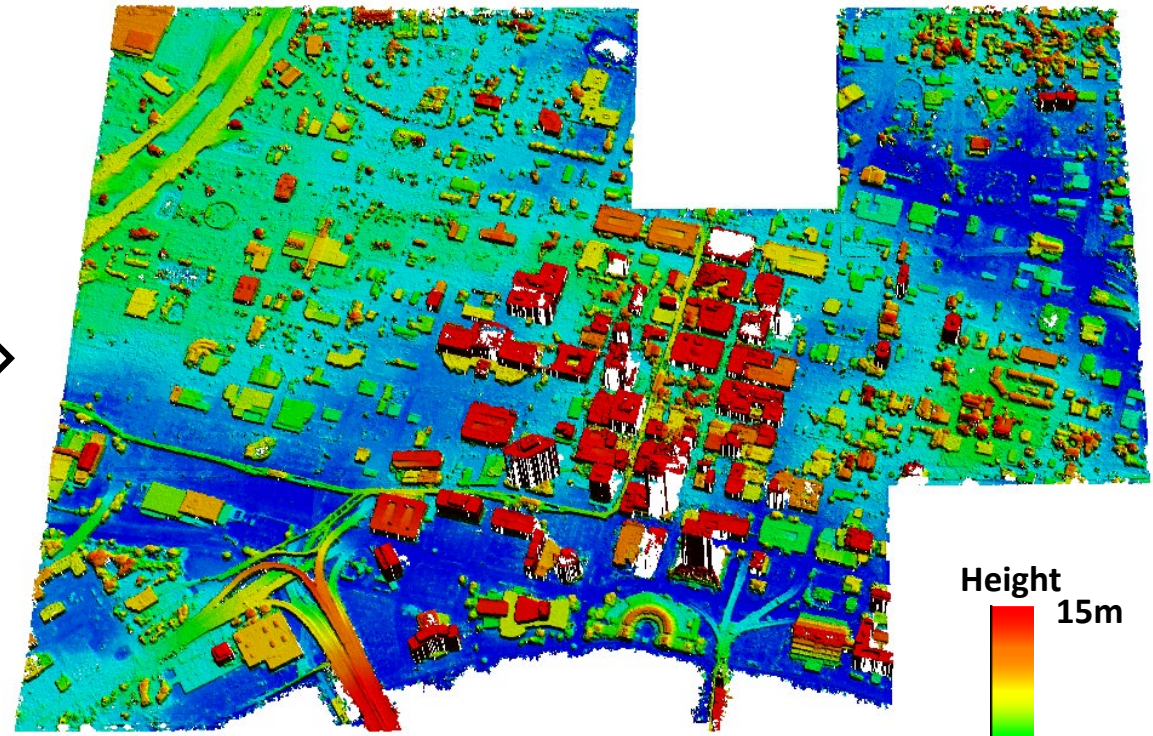
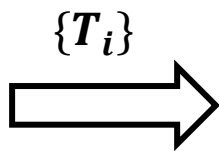
Multiple noisy DSM scans

Core of this work

Estimate the global transformation $\{T_i\}$ to remove the systematic errors of given DSMs



Multiple noisy DSM scans

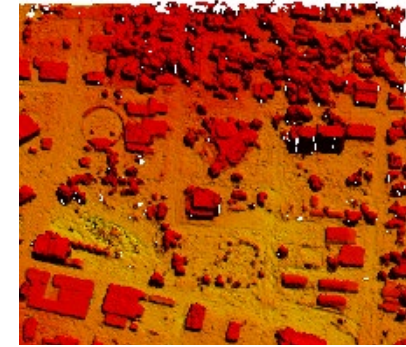


Multiple registered DSM scans

Challenges

1. Large computation & memory consumption

height: ~10,000 px



#points: ~ 100 million

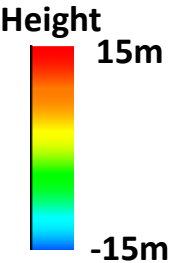
width: ~10,000 px

2. Some area are flat and featureless

Featureless area leads to ill-posed problem.



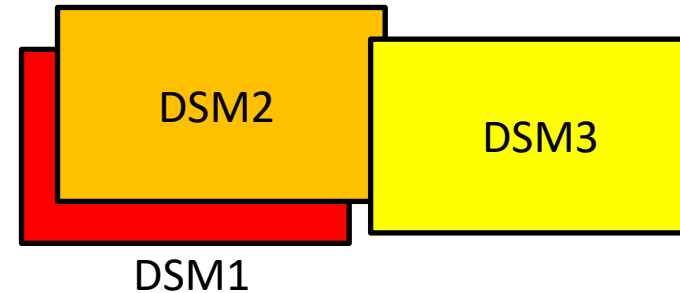
Satellite texture



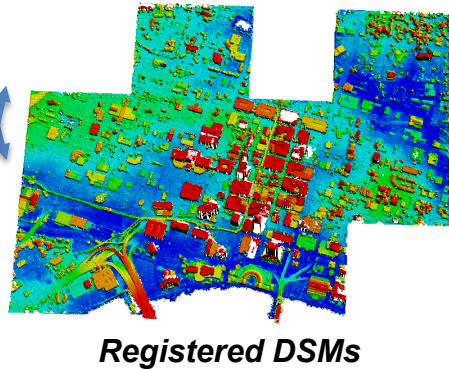
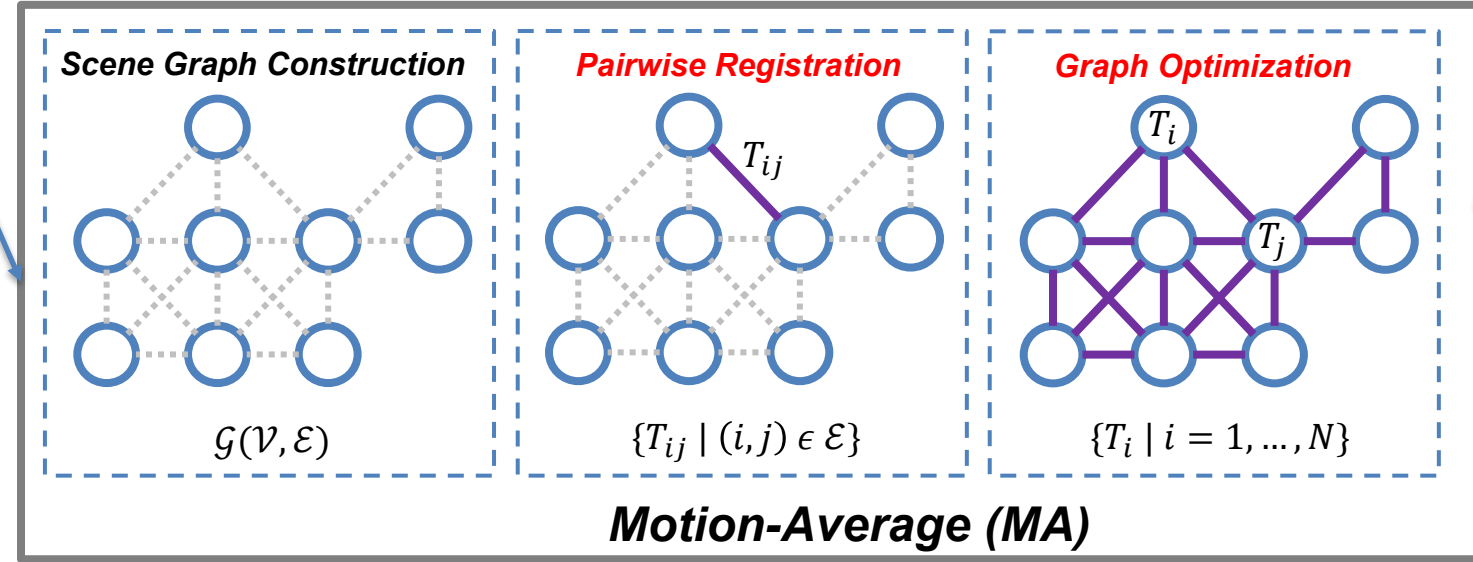
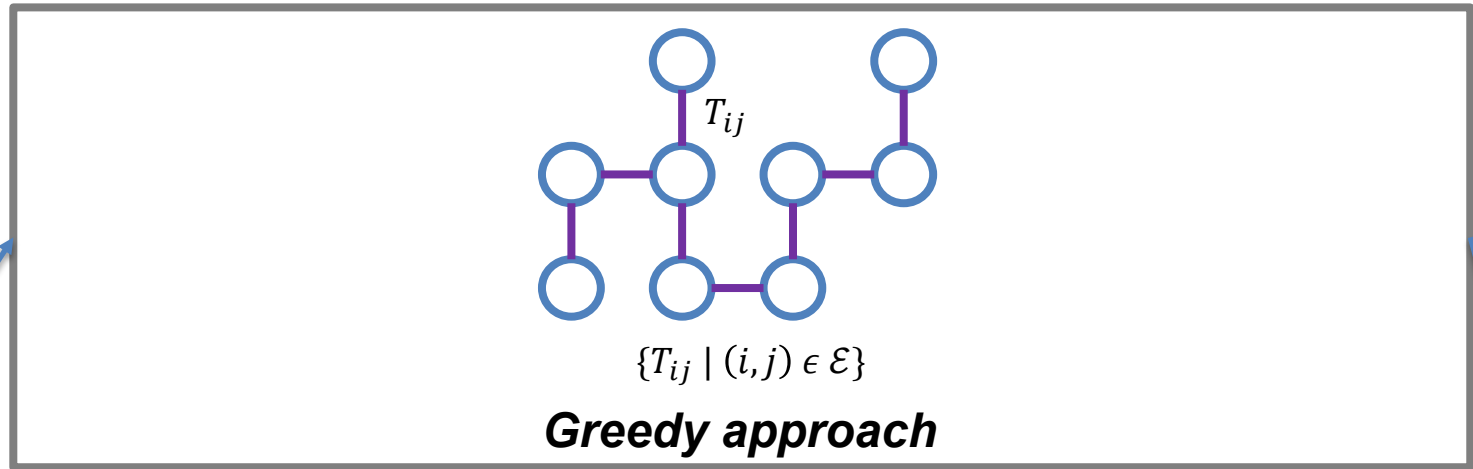
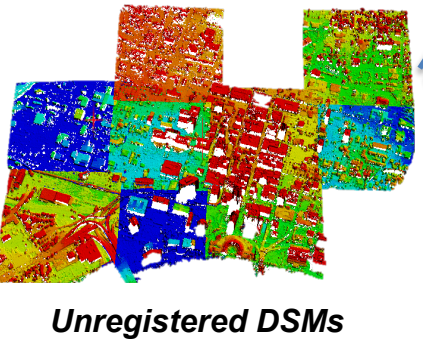
DSM

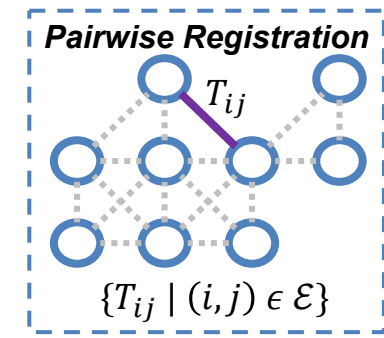
3. Varying degree of overlaps

Partial overlapping affects the registration accuracy, which need to be handled respectively



Registration of DSM 1&2 **Easy**
Registration of DSM 2&3 **Hard**

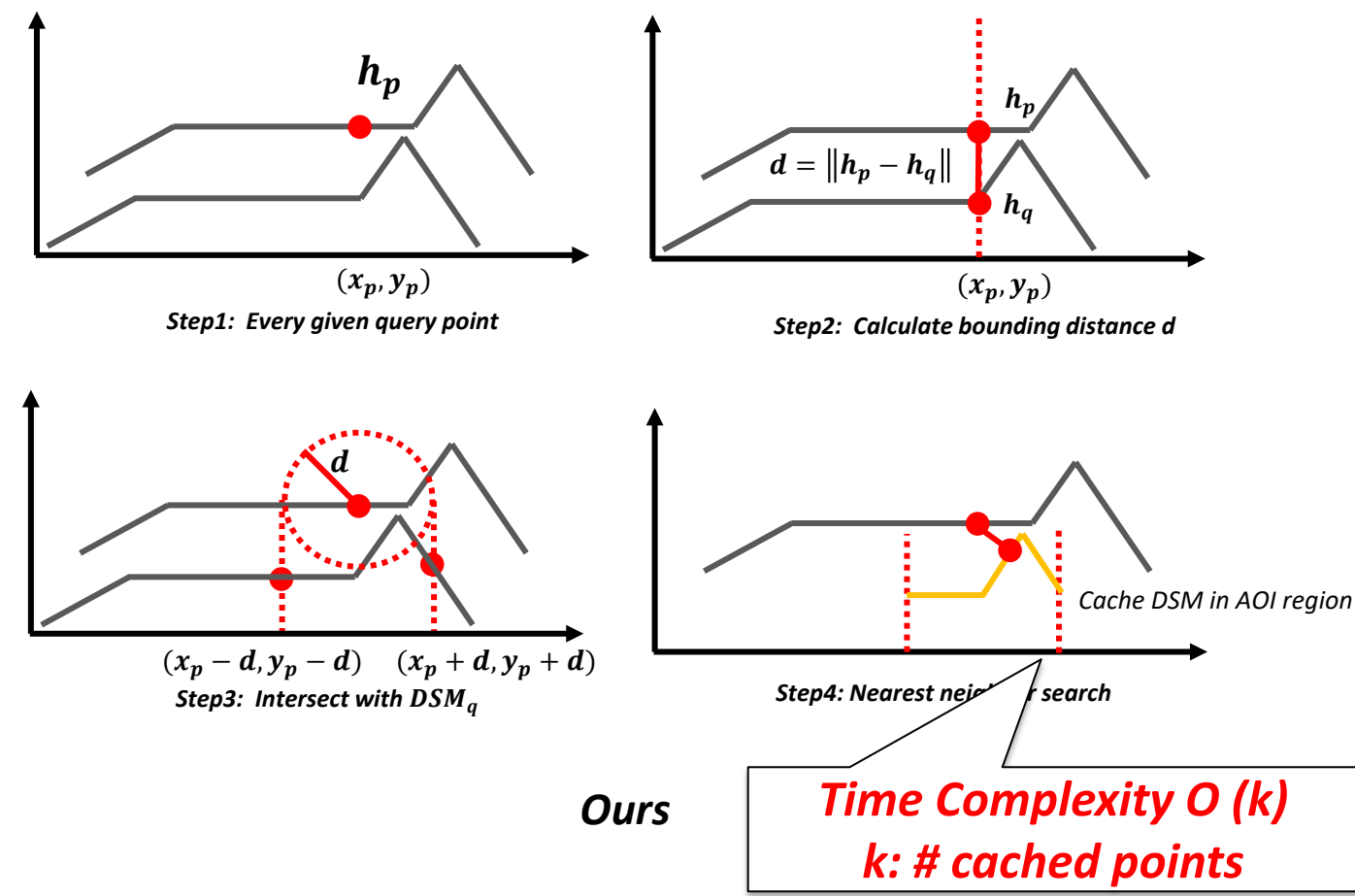
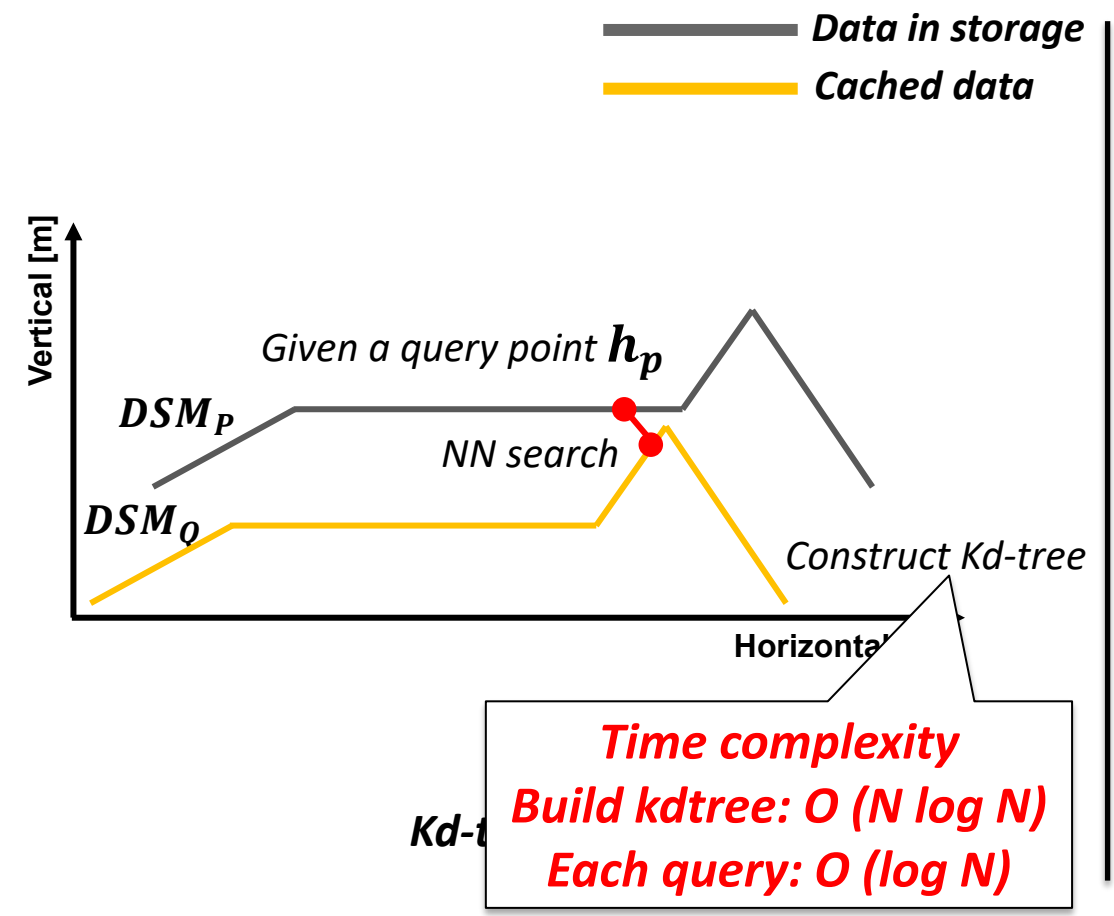




Methodology

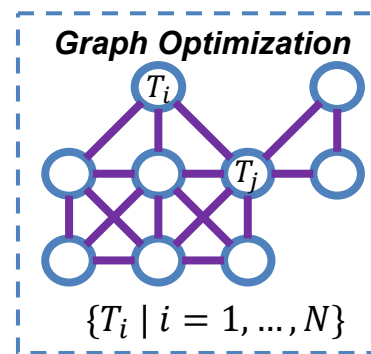
1. Pairwise DSM registration : DSM-ICP

Most resource consuming part is correspondence search. We proposed a fast and exact nearest neighboring search method using the grid structure of DSM.



Methodology

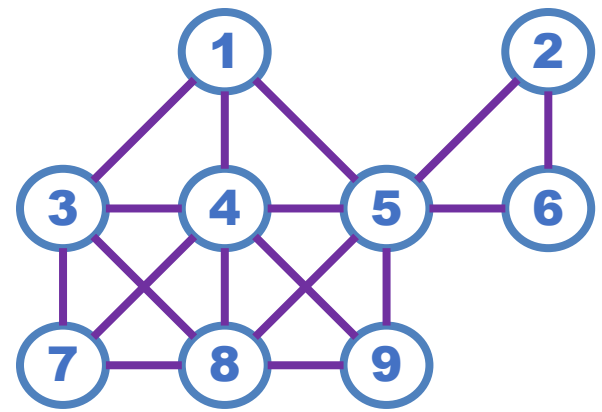
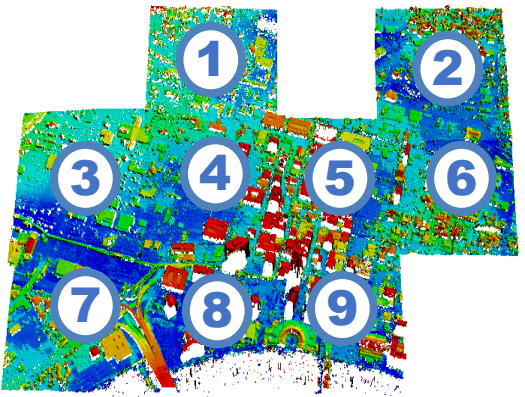
2. Multiview registration: Motion average



Errors are distributed across the graph

Observation: pairwise transformation $\{T_{ij}\}$

Optimizable variable: global transformation $\{T_i\}$



$$\min_{\{T_i\}} \sum w_{ij} \|T_{ij} - T_i^{-1} \cdot T_j\|_F^2$$

$$w_{ij} = s_{ij} * r_{ij}$$

Overlap ratio

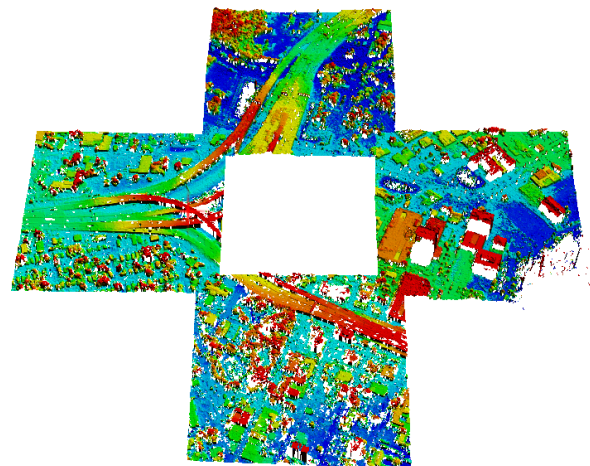
Pairwise registration quality

$$r_{ij} = \frac{e^{-err_{ij}}}{\sum_{(i,j)} e^{-err_{ij}}}, err_{ij} \text{ is pairwise registration error}$$

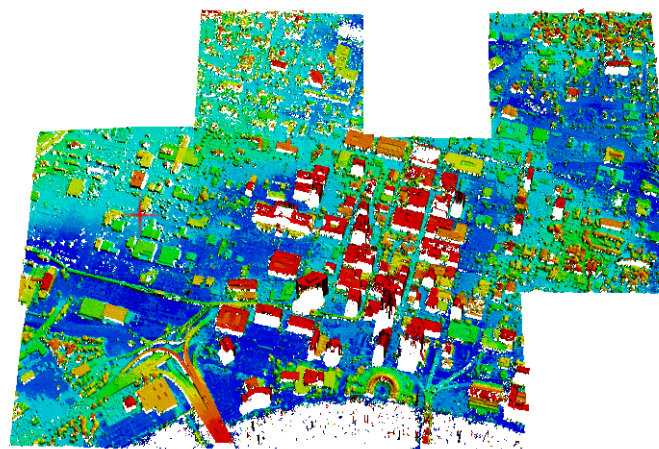
Ours

Experiment

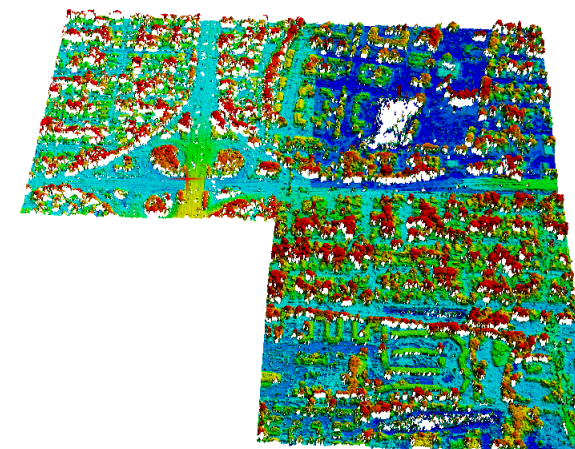
Dataset: DFC 2019 [1]
Ground truth: airborne
LiDAR
Metric: RMSE



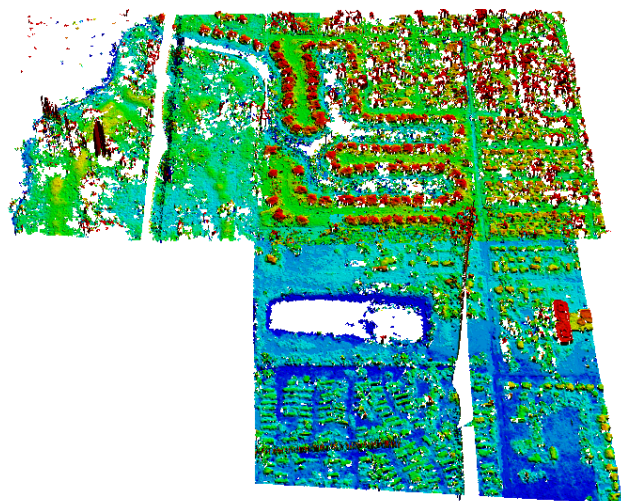
Jacksonville Area1 (4 DSMs, 4.5 KM²)



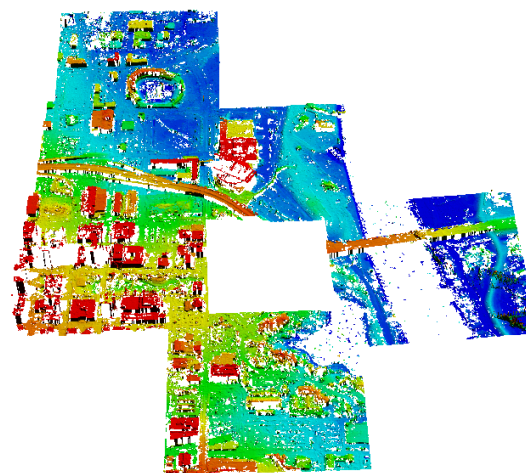
Jacksonville Area2 (9 DSMs, , 6 KM²)



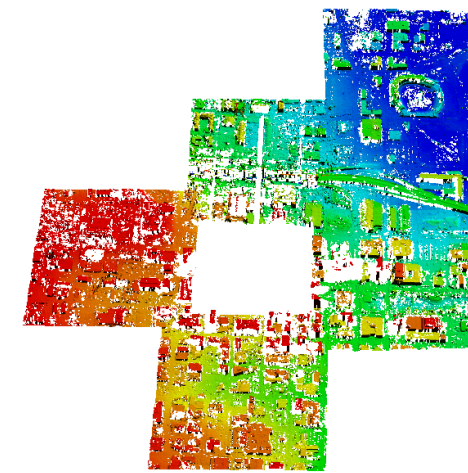
Jacksonville Area3 (3 DSMs, 2 KM²)



Omaha Area1 (3 DSMs , 2 KM²)



Omaha Area2 (6 DSMs , 6 KM²)



Omaha Area3 (6 DSMs , 6 KM²)

[1] <https://iee-dataport.org/open-access/data-fusion-contest-2019-dfc2019>

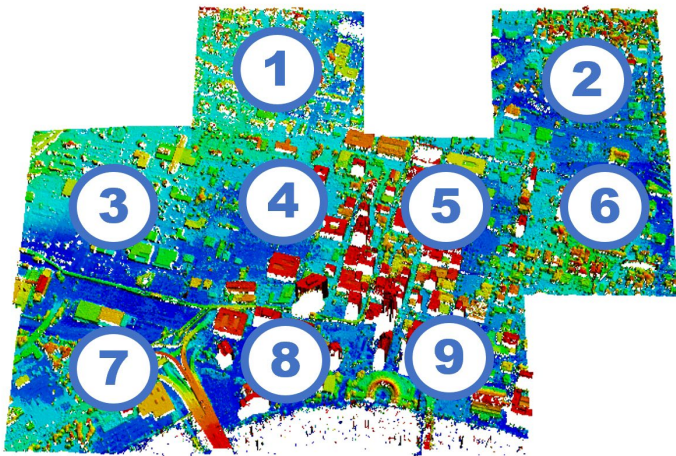
Experiment

Accuracy of multiple registration

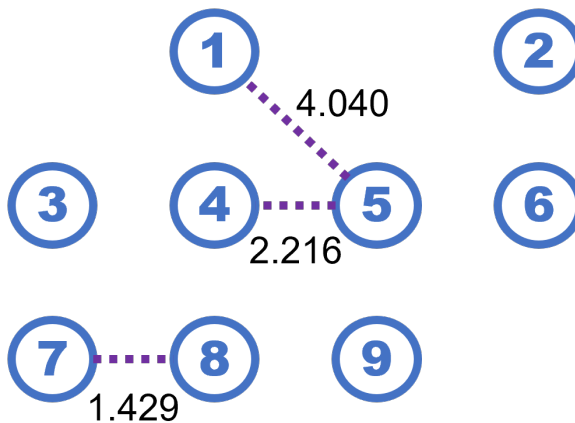
<i>Method</i>	<i>RMSE [m]</i>					
	<i>JAX1</i>	<i>JAX2</i>	<i>JAX3</i>	<i>OMA1</i>	<i>OMA2</i>	<i>OMA3</i>
<i>Greedy</i>	2.305	2.166	2.756	2.065	1.461	1.667
<i>M-A</i>	2.302	2.129	2.756	2.065	1.451	1.539

Experiment

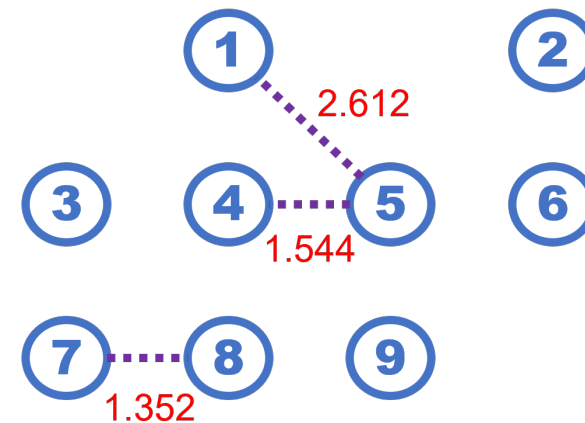
Accuracy of multiple registration



Jacksonville Area2

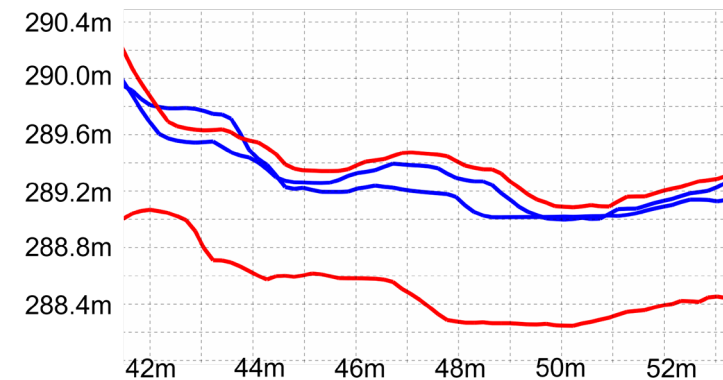
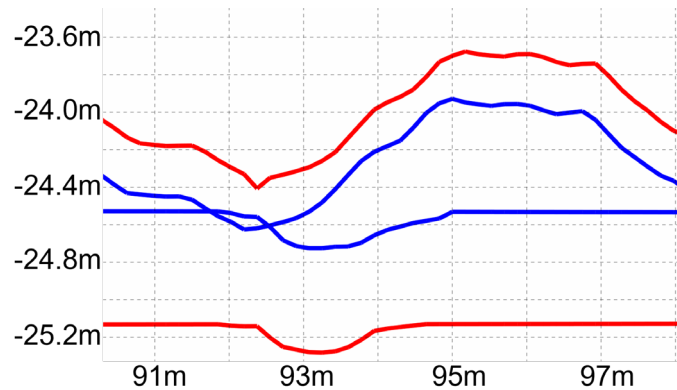


Pairwise accuracy (RMSE [m]) of greedy's results



Our result

— **Ours**
— **Greedy method**

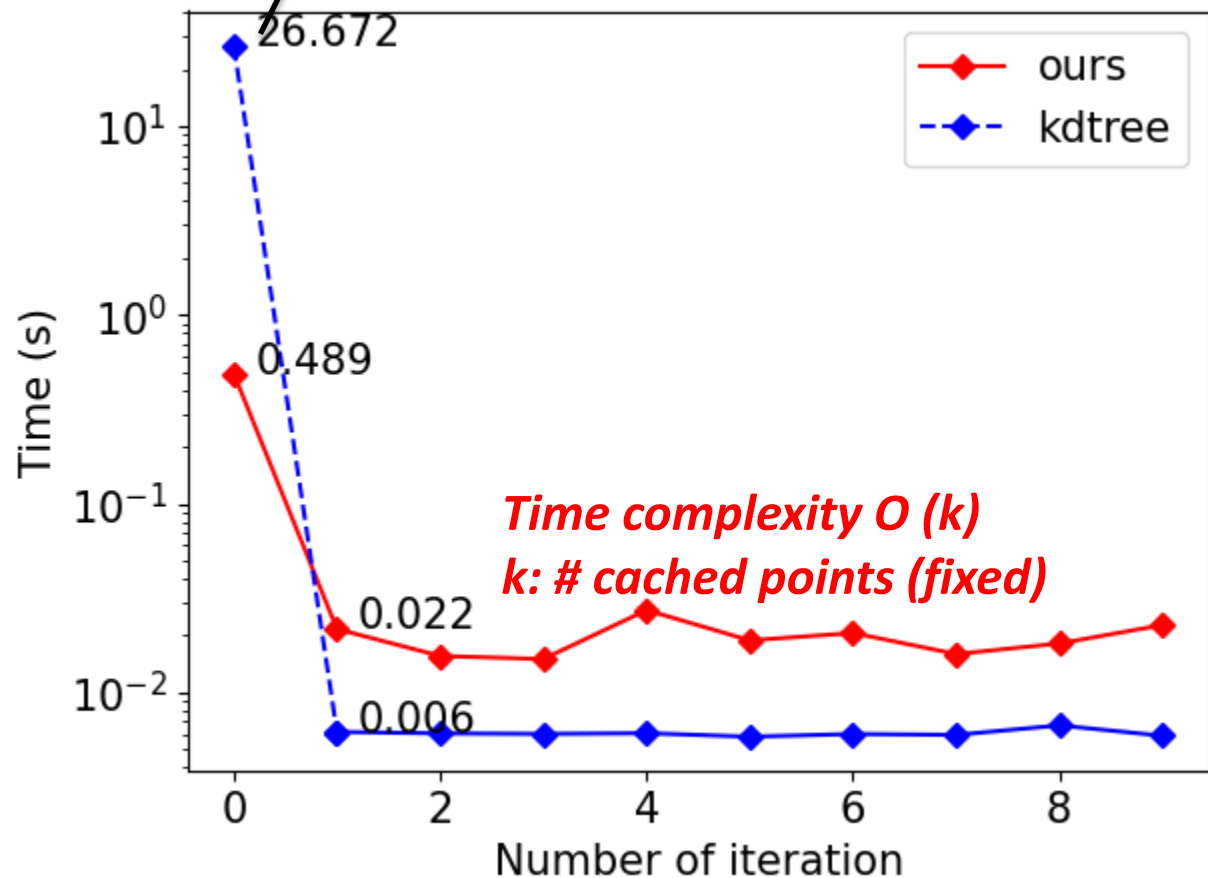


Profile in Jacksonville area2

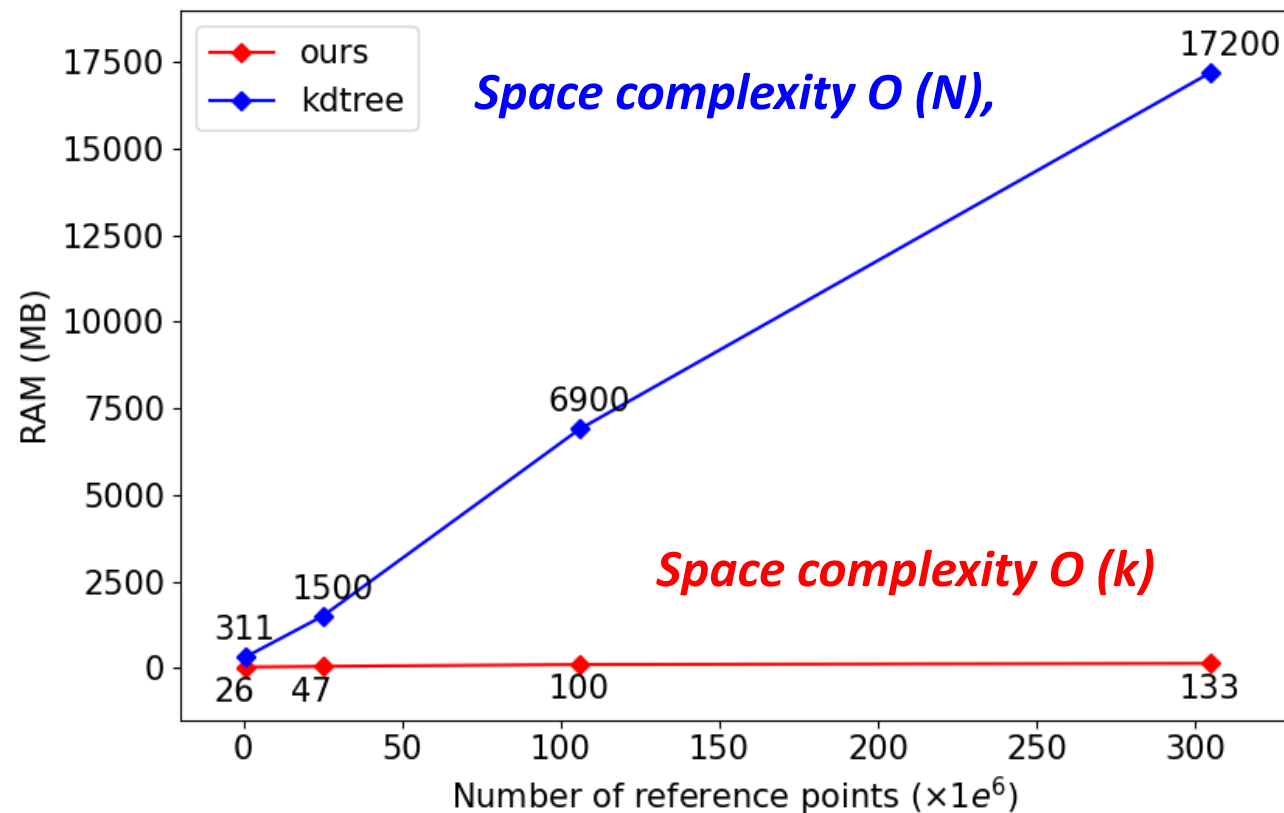
Experiment

Time consumption of pairwise registration

#iter=0, time of constructing Kd-tree
#iter=1,2,3..., time of NN query



Memory consumption of pairwise registration



106 million points

Experiment

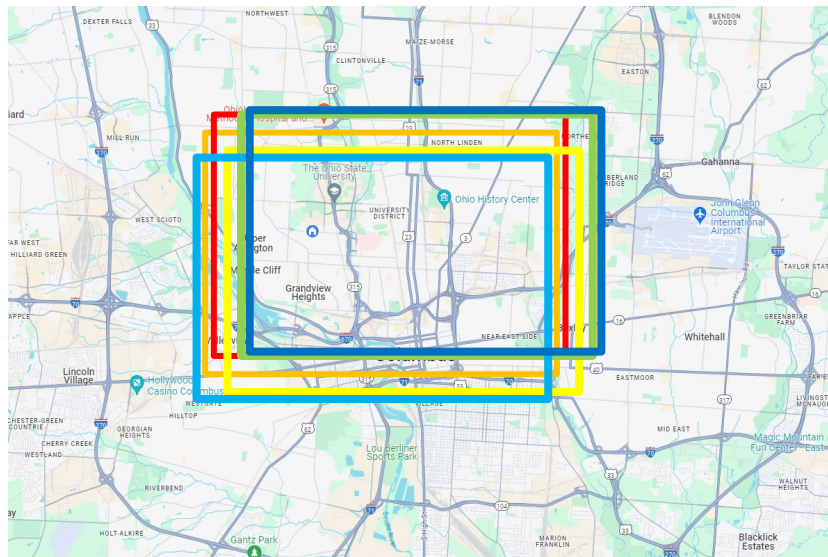
Wide area DSM (132 individual DSMs)



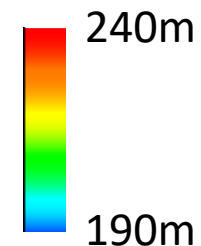
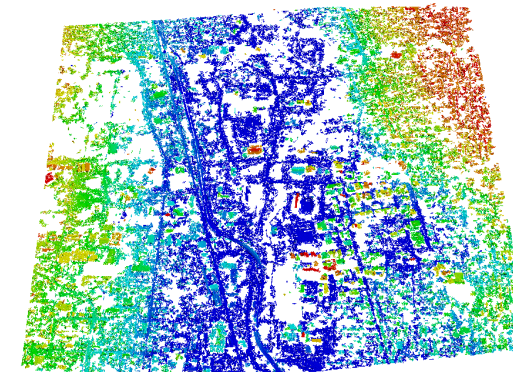
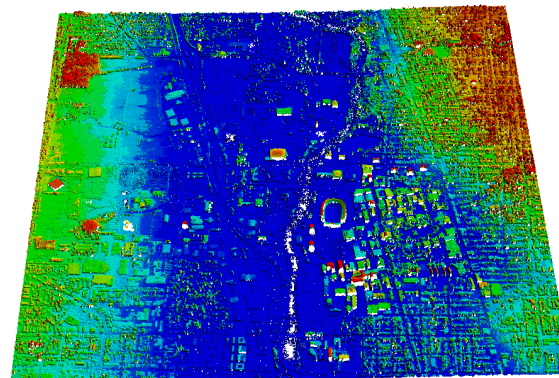
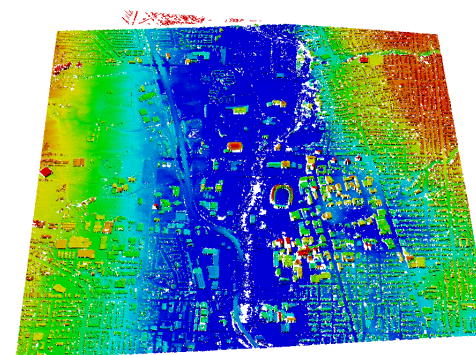
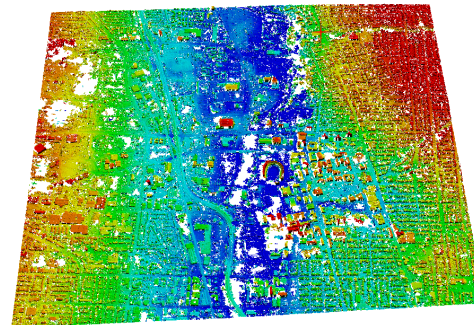
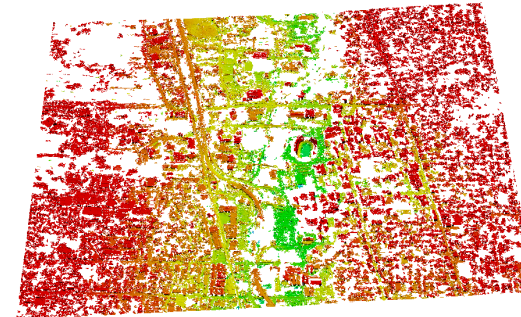
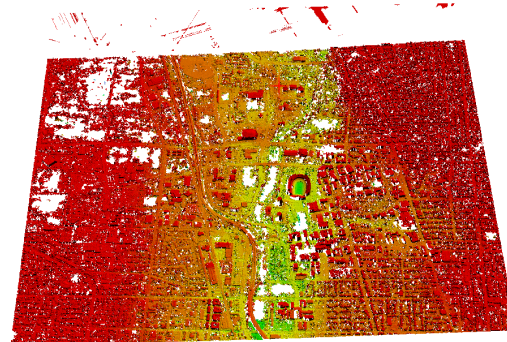
Santa Cruz, Argentina, 4974 KM²

Experiment

Wide area DSM (66 individual DSMs, including LiDAR DSM and Drone DSMs)



15 KM²
Columbus, OH, USA

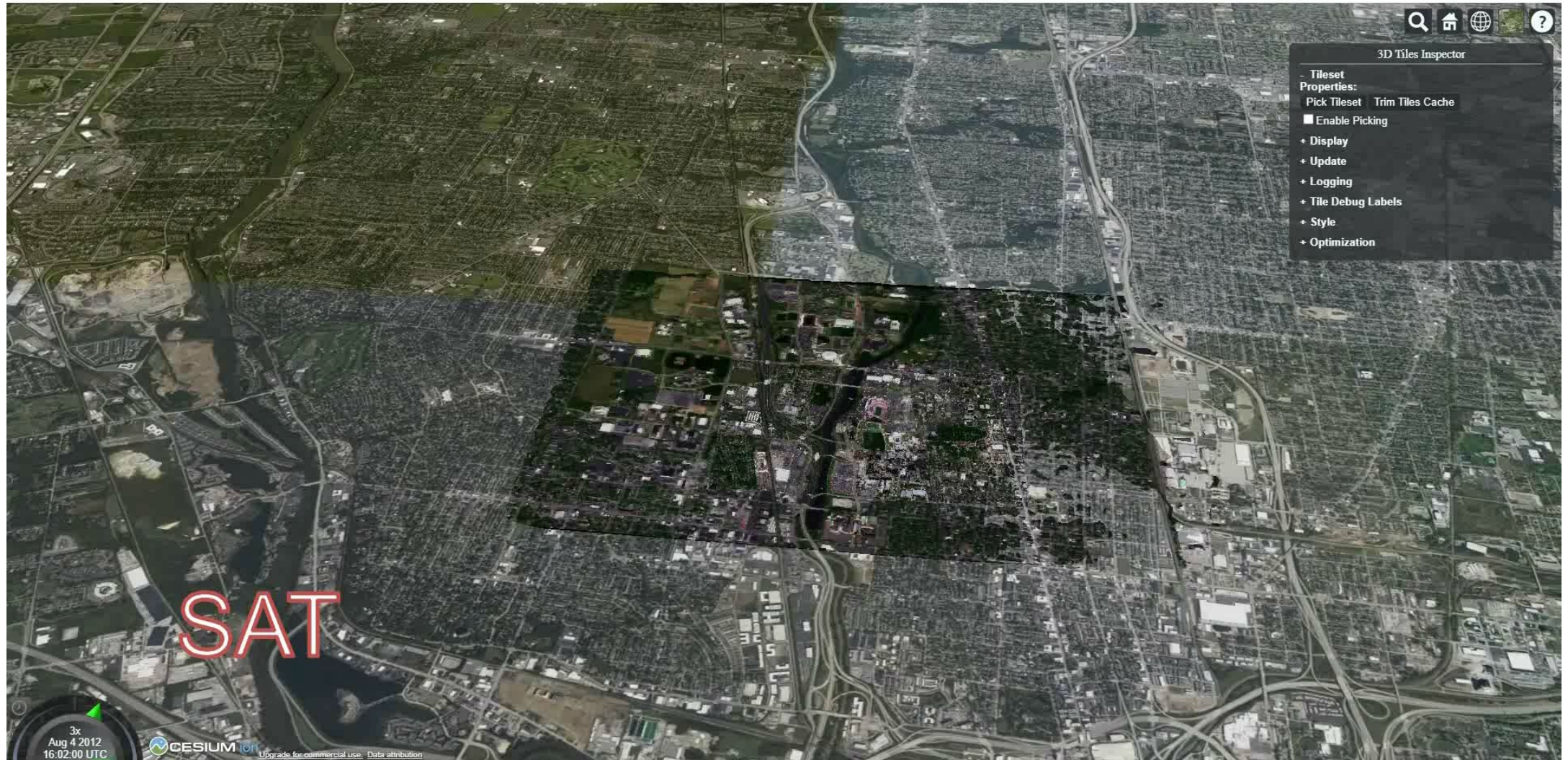


Experiment

Multi-source DSM

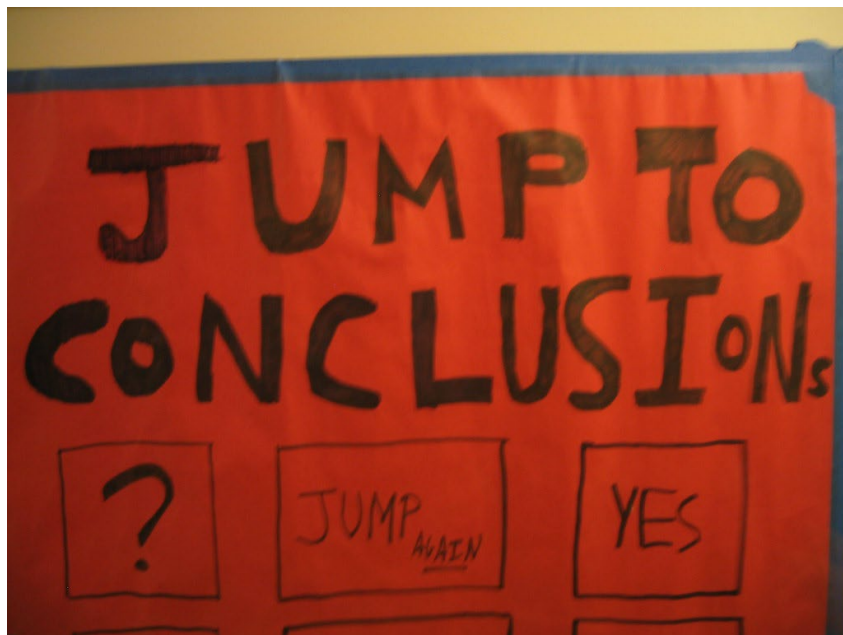


QinLab
Geospatial Data Analytics



Columbus, OH, USA

Conclusions



- The use of the grid-structure is in good favor of large-scale DSM registration
- The motion average method is extremely effective in reducing systematic biases over multiple DSMs.