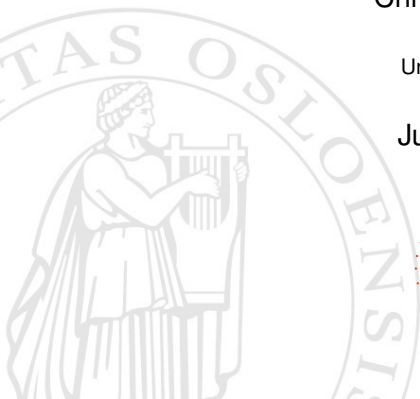


Robust glacier displacements using knowledge-based image matching

Bas Altena, Andreas Käab &
Christopher Nuth

University of Oslo

July 18, 2015



MULTITEMP
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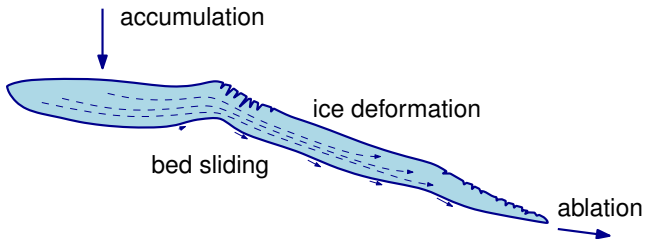
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Glacier velocity is related to:

- ❖ mass turn-over (*climate*)
- ❖ ice dynamics (*internal hydrology, topography*)



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Optical image matching potentials in Landsat archive:

- ✧ long time-series
- ✧ world wide coverage

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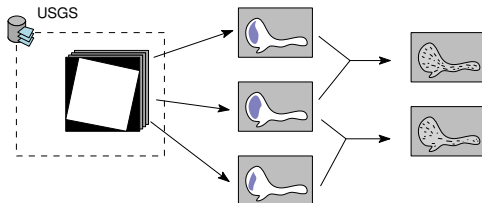
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❄ disadvantage during preprocessing:

manual selection of scenes

(*cloud free, high contrast, snow free, limited shadow*).

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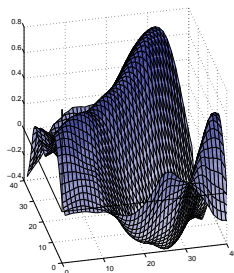
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✳ disadvantage during matching:

based on heuristics

(fixed template size, winner-takes-it-all)



Temporal analysis



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22 June 2000, 21 March 2001

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✳ disadvantage during post processing:

data driven

(stack statistics, manual editing)



Temporal analysis



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Not only the glacier is moving through time..

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Yanert glacier, winter 2001-2002

Chasing shadows, instead of glacier movement



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Make an effort to achieve a **robust** matching approach which is ignorant to speed-up or change in flow-regime.

Robustness is introduced when **redundancy** is present, hence multi-temporal analysis.



Our approach



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Use priors rooted from knowledge about glacial systems

- ✧ a feature needs **some similarity** in images
- ✧ if a feature is detectable it can be **tracked**
- ✧ there exists **orderly flow** in glaciers



Exploit cross-correlation



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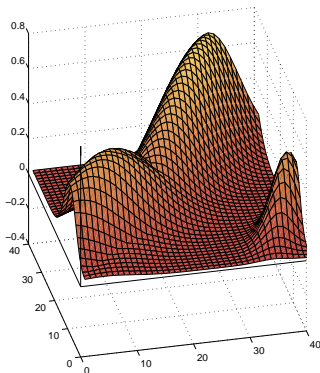
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- ❖ include multiple maxima in the analysis
- ❖ derive uncertainty of such estimates

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Match with three different template sizes:

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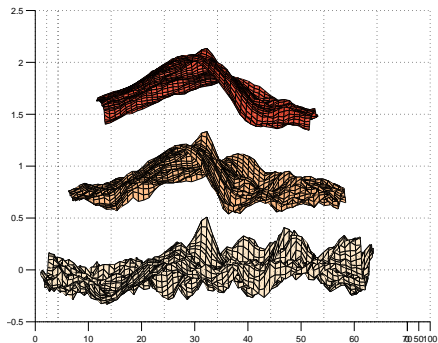
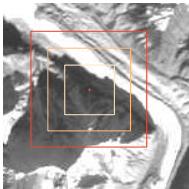
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(improves uniqueness, but reduces when deformed).



Utilize temporal domain



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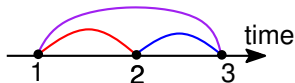
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Match all combinations of three images.



The resulting displacements should form a triangle.



Utilize temporal domain



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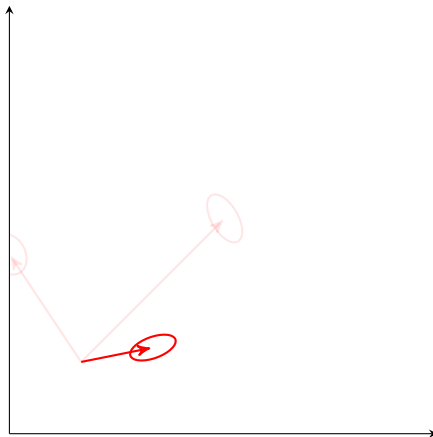
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Probabilistic testing



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Because for all displacements (\underline{y}),
the dispersion is known (\mathbf{Q}_{yy}),
and the displacements over time are vector additions (\mathbf{A}),
we can use least squares adjustment:

$$\hat{\underline{e}} = \underline{y} - \underbrace{\mathbf{A} \cdot (\mathbf{A}^T \cdot \mathbf{Q}_{yy}^{-1} \cdot \mathbf{A})^{-1} \cdot \mathbf{A}^T \cdot \mathbf{Q}_{yy}^{-1} \cdot \underline{y}}_{\hat{x}}$$

and probabilistic model testing:

$$T = \hat{\underline{e}}^T \cdot \mathbf{Q}_{yy}^{-1} \cdot \hat{\underline{e}}$$

Which is χ^2 distributed, and used to assess alternative hypothesis.




Exploit knowledge of glacier flow



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Problem:

Features need to be present in all imagery: 

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Recovery of rejected displacements through relaxation labelling.

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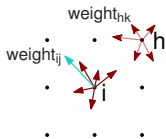
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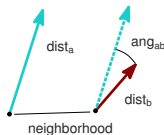
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Neighborhood support



Compatibility function

An iterative updating scheme redistributes confidence to displacement estimates.

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Automatic querying of image database,
using scene specific facies- and cloud-maps:

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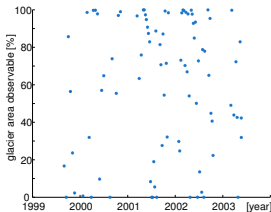
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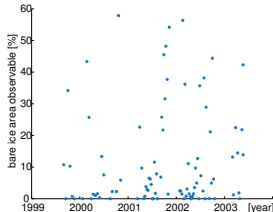
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Cloud-free



Snow-free

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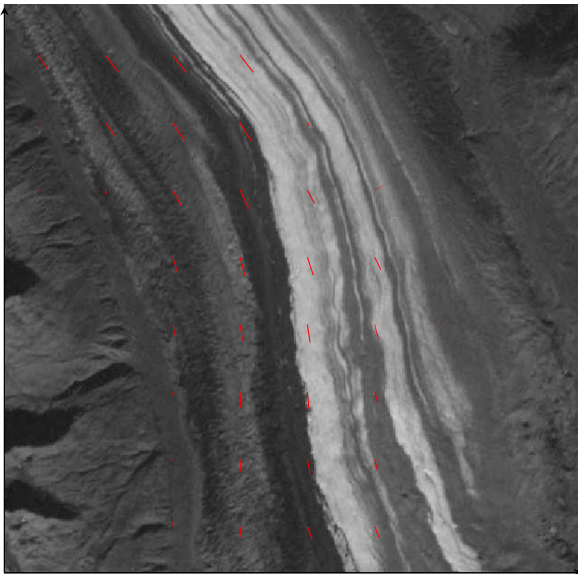
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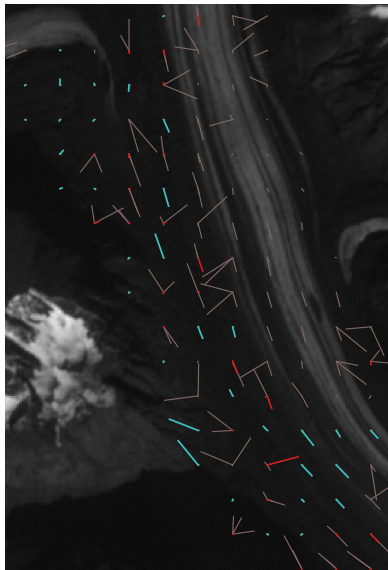
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6948000
6947500
6947000
6946500
6946000
6945500
6945000
6944500
6944000
6943500



- fixed estimate
- recovered estimate
- candidate

546000 546500 547000 547500 548000 548500 549000



Achievements



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- ✦ Potential of scalability, by automated scene selection
- ✦ Progress in robustness, through adaptive template size
- ✦ Enhanced interpretation, through precision estimate
- ✦ Increased toolbox, by introducing time domain



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An approach from data driven to priors from glacial knowledge seems promising, but improvements are needed, such as,

- ❄ Merge best of both worlds:
combine relaxation labelling and probabilistic testing
- ❄ Extend to more imagery, to detect shadow chasing