# A small handful of OTB remote modules for deep learning

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## Summary

- What is new in OTBTF?
- OTB Prefetch
- OTB ONNX
- IRL: Qanats mapping with OTBTF

## What is new in **OTBTF**?

- A big, free, tutorial! ========>>
  - pyotb,
  - pystac,
  - planetary\_computer
  - keras
- New python stuff
  - otbtf.layers
  - otbtf.ops
- No-data support in TensorflowModelServe
- New « split » strategy in PatchesSelection





Spot 6/7 – Sentinel-2 fusion framework (soon to be released!)

## What is next in OTBTF

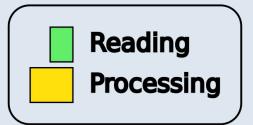
- Keras 3 support (currently: keras 2)
- Lighter docker images
- Packaging (binaries, pypi, ...)

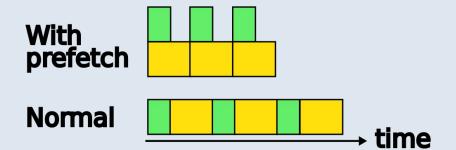
## otb-prefetch

- Pre-fetch the upstream pipeline, in an asynchronous fashion (thank you Bradley Lowekamp from ITK)
- One thread tries to guess the next requested region and populates the output buffer with it
- Available at :
  - https://github.com/remicres/otb-prefetch

## otb-prefetch

Principle







## otb-prefetch

Show me some code!

```
prefetch_example.py 13 164 B

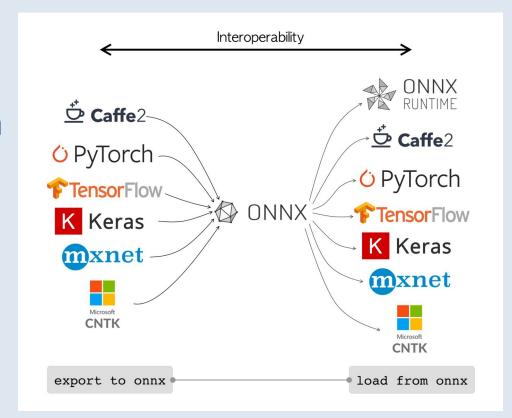
import pyotb

Normal
pyotb.BandMathX(img1, exp="im1", out="out.tif")

# With prefetch
pf = pyotb.Prefetch(img2)
pyotb.BandMathX(pf, exp="im1", out="/tmp/out.tif")
```

## otb-ONNX

- Run deep nets from many deep learning framework
- Relies on ONNX (Open Neural Network Exchange)
- A single OTB application
- Available at :
  - https://forgemia.inra.fr/ orfeo-toolbox/otbonnx



## otb-ONNX

 ONNXInference is nearly the same code as OTBTF's TensorflowModelServe, but using ONNX instead of TF

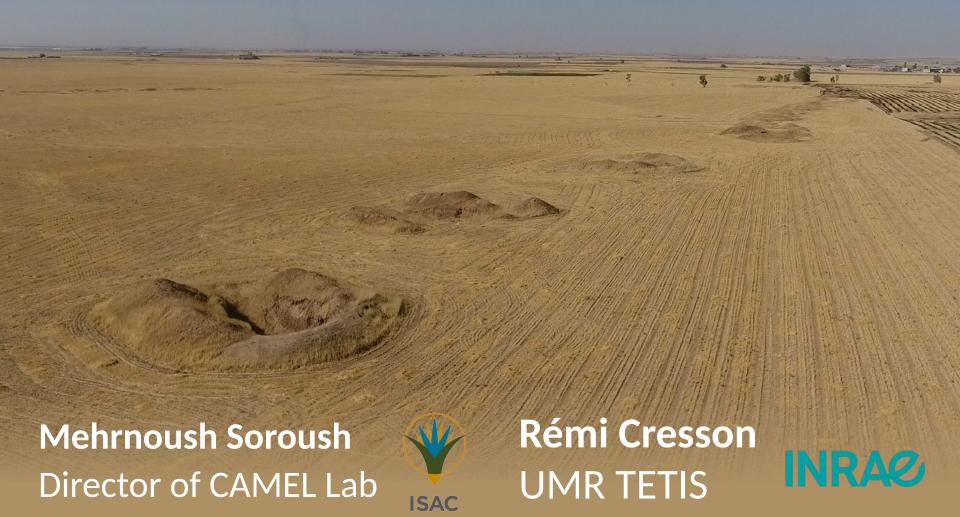


### What is next for otb-ONNX?

- Packaging!
  - Follow developments in future OTB releases
  - Docker images
  - Binary packages ? Pip packages ?

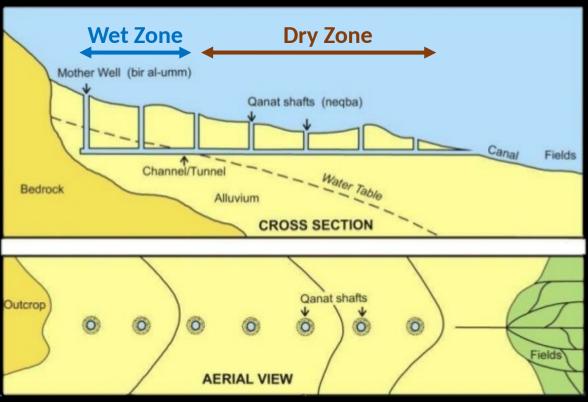
## Qanats mapping with OTBTF

How to virtually study abandoned subterranean qanat systems?





#### What is a qanat?



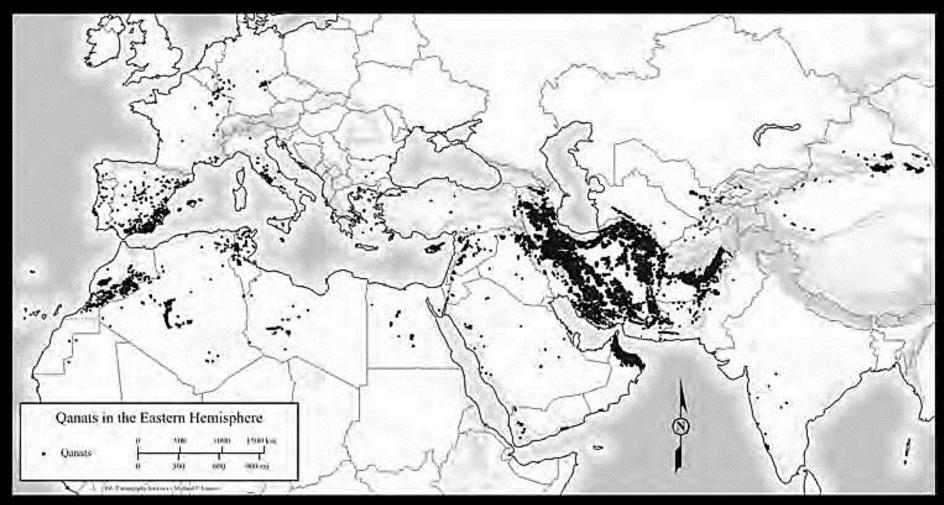
Schematic model of an Infiltration qanat, after Lightfoot 2009



#### The importance of Qanats

- Permanent Settlements in arid areas
- 2. Prioritizing Economic Potential over water access
- 3. Year-around agricultural production (subsequently systematic summer cropping)
- 4. Prioritizing capital and expertise over labor.

### Worldwide Technology Diffusion

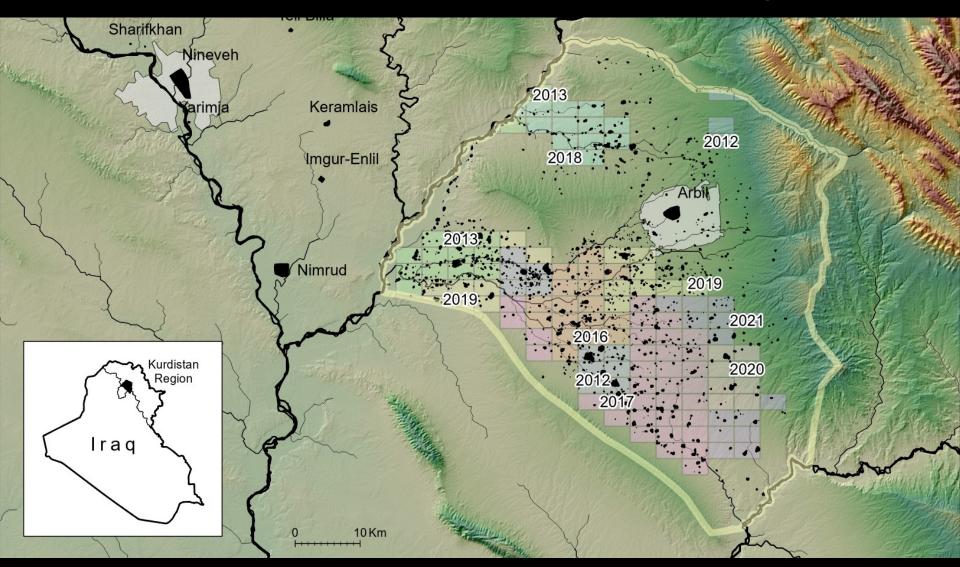


Distribution of qanats across the eastern hemisphere (after Lightfoot 2024)

## Qanat: Research Methods

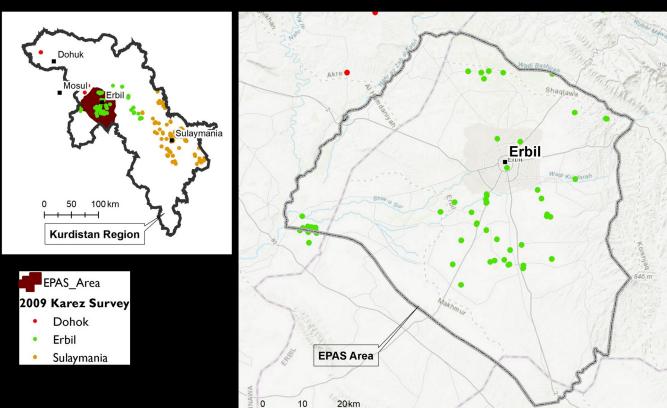
- Archaeological Remote Sensing
- Fieldwork & Geophysical Survey
- Archival Research
- Ethnography

#### Qanats the Kurdistan Governorate (Iraq)





# UNESCO sponsored survey of qanats 2005-2009



Data from Lightfoot 2009

#### Remote sensing in archeology



"Pioneers of the Sky" exhibit at the Institute for the Study of Ancient Cultures, University of Chicago

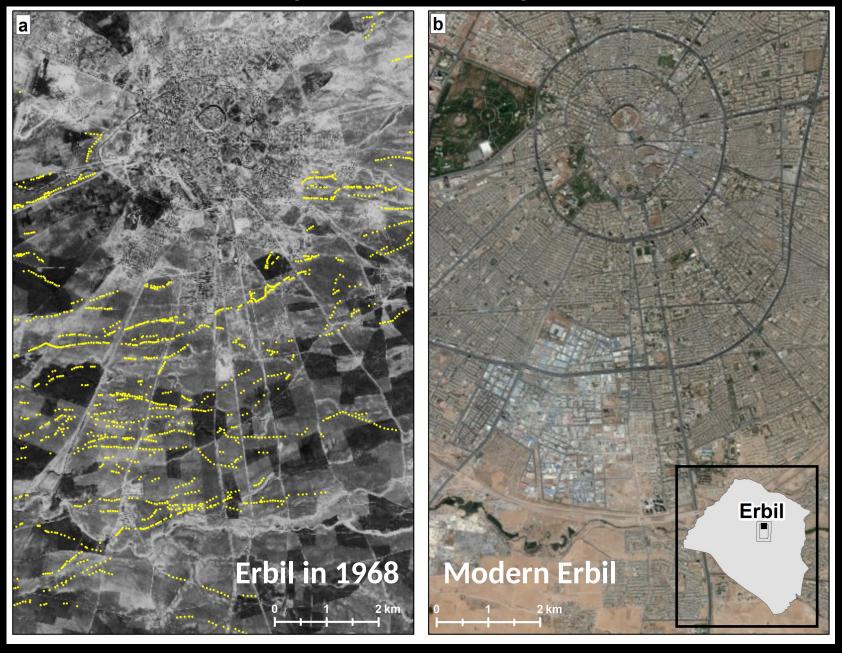
#### Project Corona: America's 1<sup>st</sup> photo reconnaissance satellite

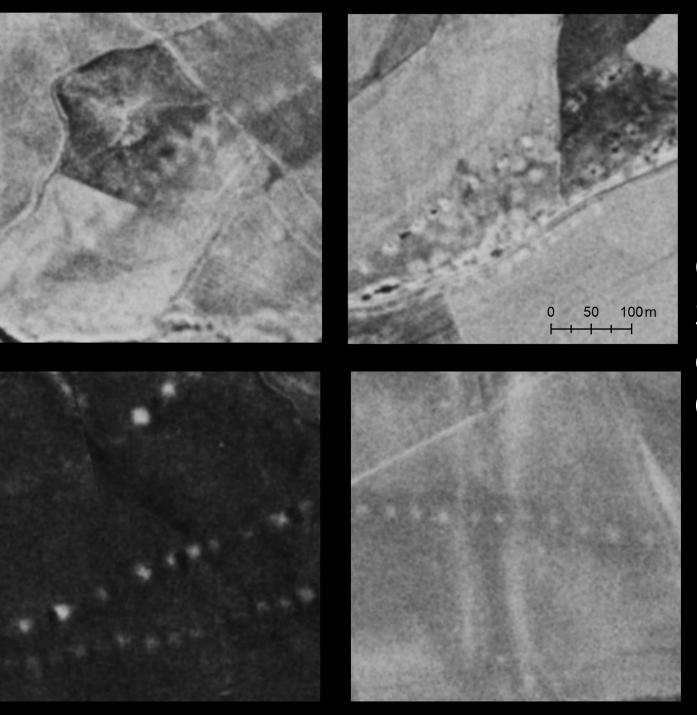
- Launch in feb 1959 to spy USSR weapons
- +860,000 images between 1960-1972
- Declassified in 1995



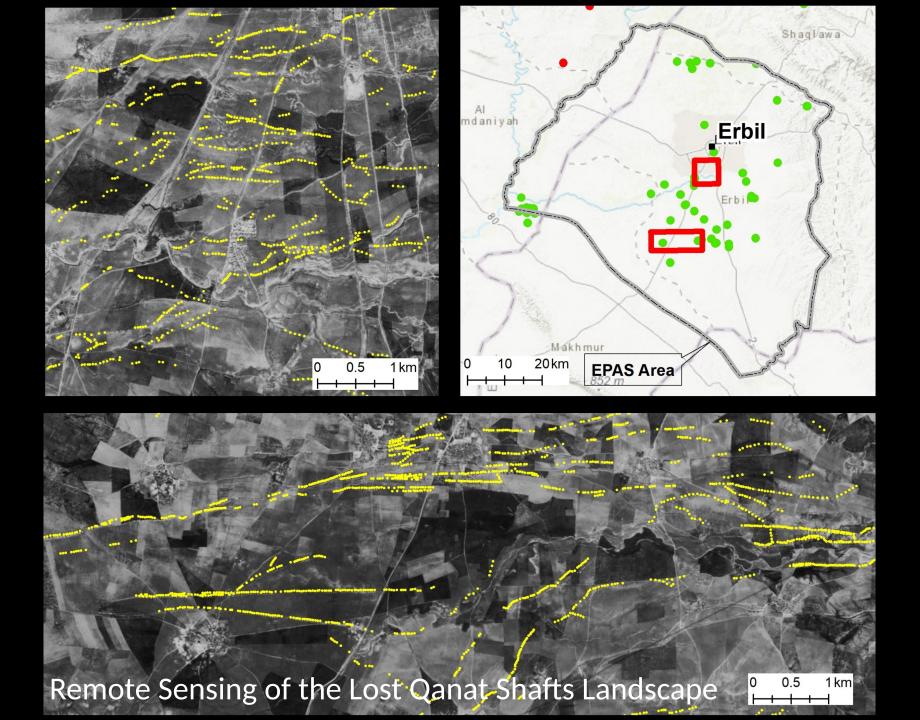
Capsule, or "bucket", captured by an Air Force C-119 (CAMEL)

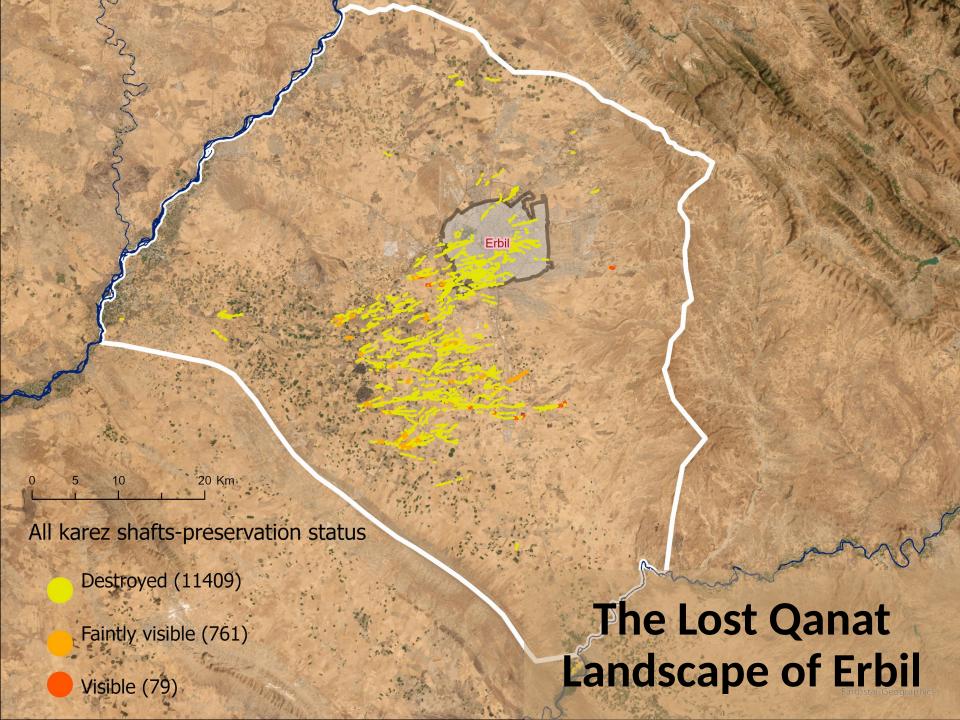
## The lost qanat landscape of Erbil



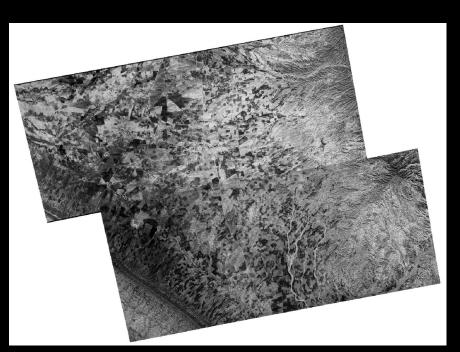


Qanat Signature on Corona Imagery





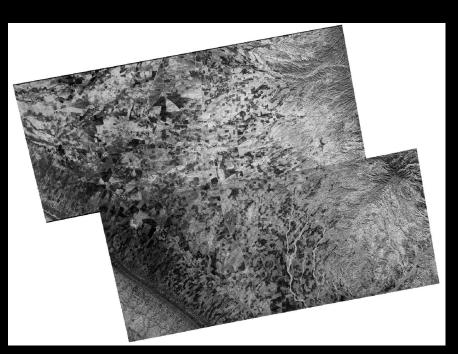
#### Data





Left: CORONA images (Geotiff, 8 bits, mono-channel), Right: qanats locations (point cloud, vector data)

#### Data





Left: CORONA images (Geotiff, 8 bits, mono-channel), Right: qanats locations (point cloud, vector data)

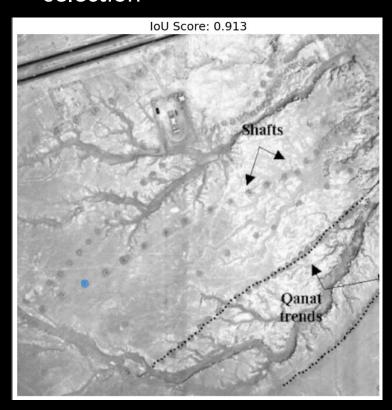
How to create training patches for convolutional neural networks?

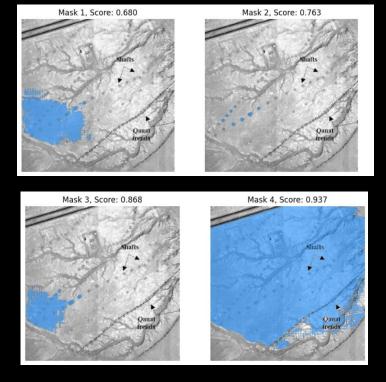
### Software



#### First approach: facebook SAM2

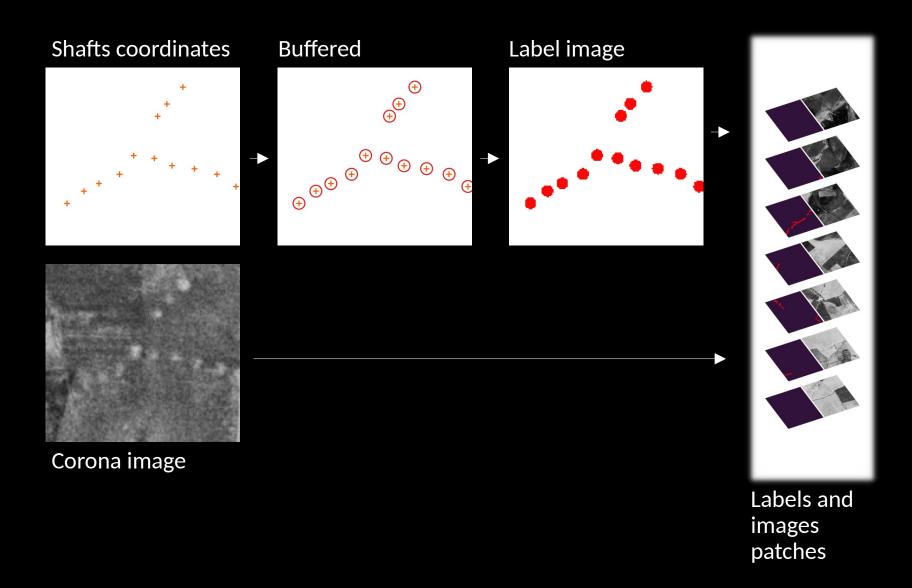
- Solves promptable visual segmentation in images
- e.g. « I am looking for small circular structures, that most of the time are structured in linear pattern » + shaft centers selection



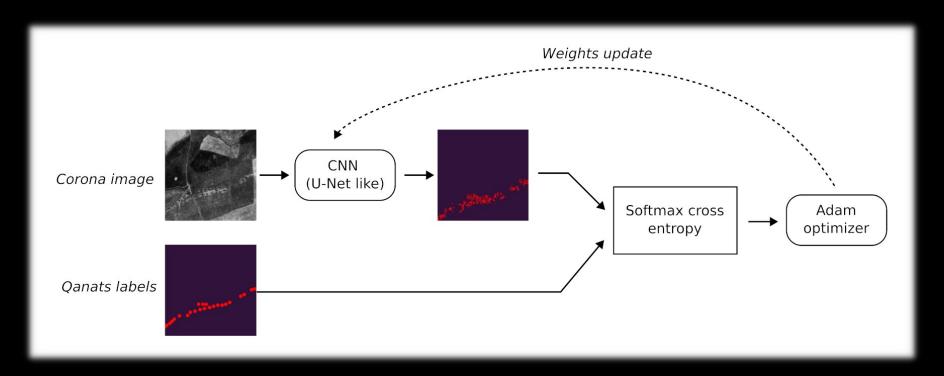


SAM2 led to poor shafts segmentation results

### Second approach: GIS



### Model training

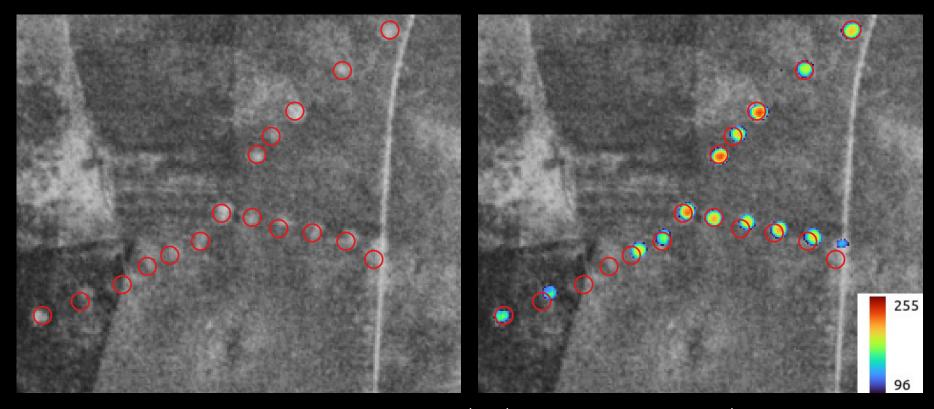


Train/Valid/Test proportion 80%/10%/10% (total 2478 samples)

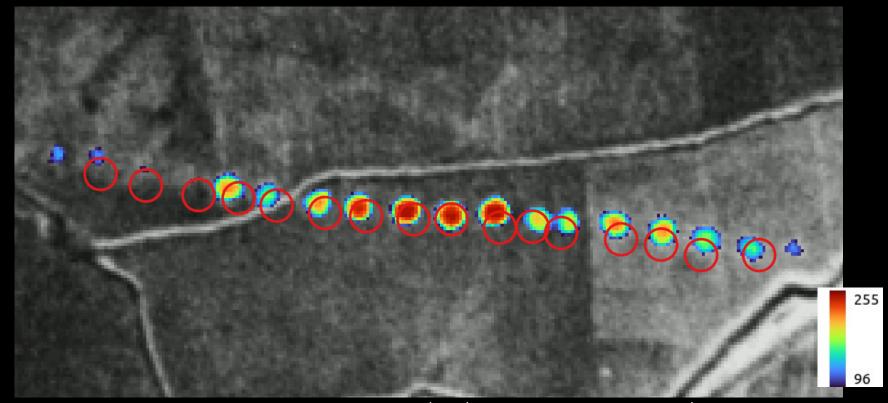
#### **Evaluation**

- Processing time: 1 hour, single GPU NVIDIA V100
- Metrics (test dataset)
  - Precision: 65.7%
  - Recall: 26.4%
  - F-Score: 37.7%

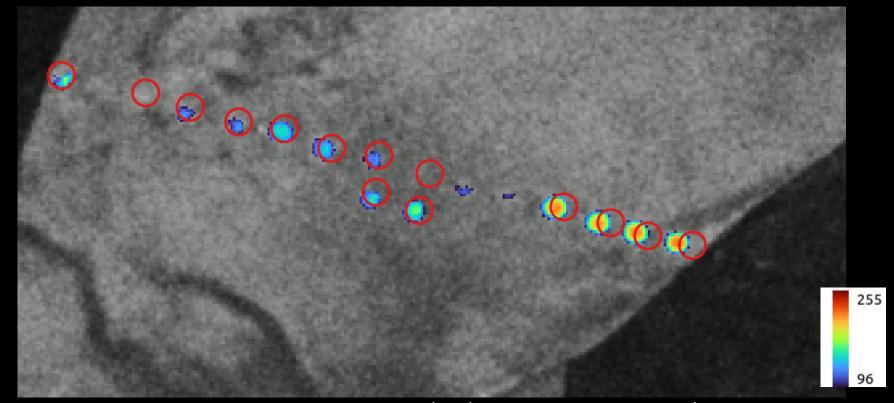
#### Results



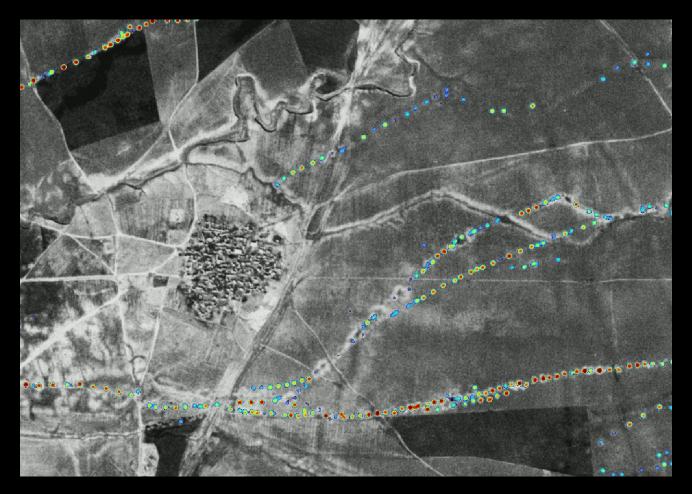
Corona image with buffered shafts locations (red) and inference results (shaft footprint pseudo-probability estimation)



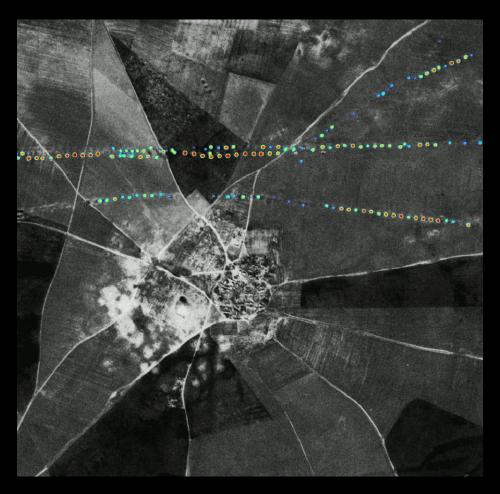
Corona image with buffered shafts locations (red) and inference results (shaft footprint pseudo-probability estimation)



Corona image with buffered shafts locations (red) and inference results (shaft footprint pseudo-probability estimation)



City of Qoritan, near Erbil, Irak



City of Surezha, near Erbil, Irak

#### Acknowledgements

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