

# Convolutional LSTMs for Cloud-Robust Segmentation of Remote Sensing Imagery

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## When we think of satellite images we picture this



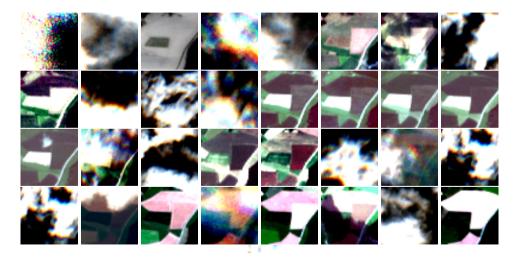


# Cloud coverage is very common





# Cloud coverage as spatiotemporal noise



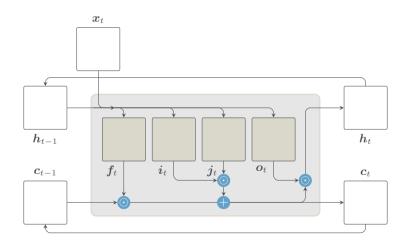


#### End-to-end trainable model for robust classification

cloudy images 
$$x \xrightarrow{\quad f(x) \quad}$$
 prediction  $y$ 

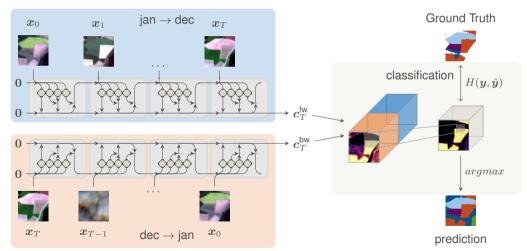


# Extracting features from noisy data with ConvRNNs





#### Employ ConvRNNs for Vegetation Land Cover Classification directly





## It worked very well

Approach	Preprocessing	Accuracy	# Classes
Rußwurm & Körner (2018)	none	90	17
Rußwurm & Körner (2017)	atmospheric correction	74	18
Siachalou et a. (2015)	geometric correction, image registration	90	6
Hao et al. (2015)	image reprojection, atmospheric correction	89	6
Conrad et al. (2014)	segmentation, atmospheric correction	86	9
Förster et al. (2012)	phen. normalization, atmospheric correction	73	11
Barragan et al. (2011)	segmentation, atmospheric correction	79	13
Conrad et al. (2010)	segmentation, atmospheric correction	80	6



#### How did the ConvLSTM handle the clouds?



# **Experiments**

- Visualization of hidden states
  we found specific states dedicated for cloud masking.
- 2. Ablation experiment on different cloud coverages similar accuracies on different degrees of cloud coverage.



# Takeaways & Poster

- 1. ConvRNNs were very robust when considering noisy data
- 2. Would love to hear other's experiences on this



#### **Publications and Code**

Github + DockerHub



https://github.com/TUM-LMF/MTLCC https://github.com/TUM-LMF/MTLCC-pytorch

Rußwurm M., Körner M. (2018). Multi-Temporal Land Cover Classification with Sequential Recurrent Encoders. ISPRS International Journal of Geo-Information. https://arxiv.org/abs/1802.02080.