

# Change Detection

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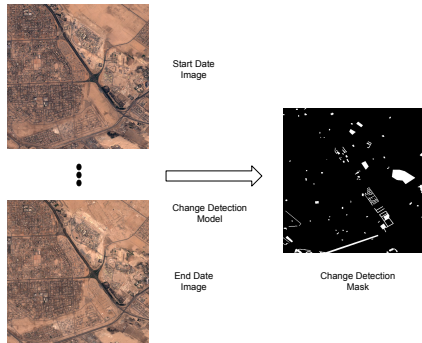
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# Problem Statement

1. Detect pixel wise change.
2. Input: Multiple dates' images of same location.
3. Output: Change mask between start and end dates.



# Problem Statement

## Challenges

1. How to handle multiple dates as input?
2. Unsupervised model, if data scarcity?
3. Supervised model, if data abundance?
4. Evaluation criteria for change.

# Background

1. Recurrent Neural Networks
2. Long-Short Term Memory
3. 3D Convolution

# Background

## Recurrent Neural Networks

1. Perform same task for every element of a sequence.
2. Output depends on previous elements.
3. RNNs can be seen as a neural network having "memory".

$$h_t = \tanh(Wx_t + Uh_{t-1}), \quad (1)$$

where  $W$  and  $U$  are weights,  $h$  is the hidden vector and  $x_t$  is the input at time  $t$ .

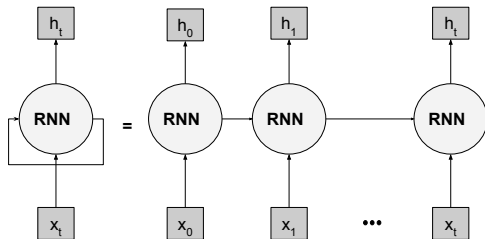


Figure: RNN unrolled in time.

# Background

## Sequential Networks: Long-Short Term Memory

1. RNNs have vanishing and exploding gradients problem.
2. LSTM resolves above problems.
3. Computes when to forget and when to remember.

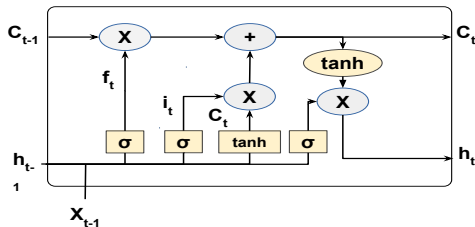


Figure: LSTM Cell.

# 3D Convolution

1. 4D data, height, width, time/depth, and channel
2. 3D kernel, 3D convolve operation
3. Convolve along height, width and time/depth
4. Used in video tasks and 3d medical images

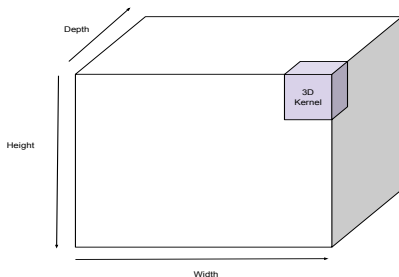


Figure: LSTM Cell.



# Dataset and Experiments

## Dataset

1. *ONERA* dataset.
2. 24 locations through out world.
3. Image pairs, two dates.
4. 14 location for training, 10 for testing.
5. 13 bands, sentinel data.
6. Change mask, but everything reprojected.

# Dataset and Experiments

## Unsupervised Change Detection

# Dataset and Experiments

Supervised Change Detection: 3D CNN

# Results and Conclusions

## Model Convergence

# Results and Conclusions

## Example Outputs

## Results and Conclusions

Thank you!  
Questions?