# COGS260 Image Recognition Instructor: Prof. Zhuowen Tu

A spatiotemporal model with visual attention for video classification

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## Outline

Motivation

Proposed model

Experiment

Conclusion

### Motivation

#### Video classification

- Semantic understanding of sequential visual input is important for robots in localization and object detection.
- ▶ Eg, search for a cat in a living room, instead of in a gym.



Source: Harvey M., Five video classification methods

## Motivation

#### Rotation and scale

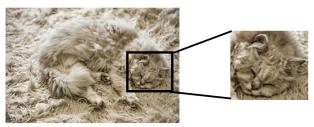
- Existing benchmark contains videos of daily scenes.
- Objects in real world could be rotated and scaled.



## Motivation

#### Visual attention

Attention mechanism reduces complexity and avoids cluttering. This makes it easier to deal with rotated and scaled images.

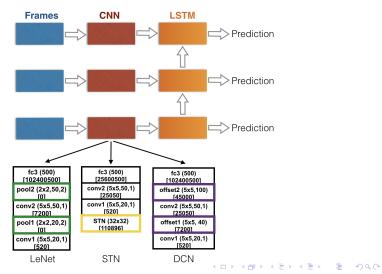


Source: cs231n, Stanford

## Proposed model

#### Architecture

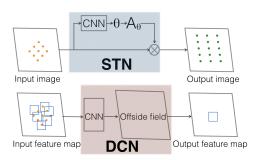
- The proposed model concatenates CNN to RNN.
- ► The CNN stage is augmented with attention modules.



# Proposed model

#### Attention modules

- ► Spatial transformer network learns a global affine transformation.
- Deformable convolutional networks learns offsets locally and densely.



# **Experiment**

**Dataset** 

Moving MNIST is augmented with rotation and scaling (Demo).

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# **Experiment**

### Quantitative analysis

DCN-LSTM consistently performs the best in all cases.

TABLE I: Comparison of cross entropy loss and test accuracy for the proposed model and baseline.

Moving MNIST	LeNet-LSTM	STN-LSTM	DCN-LSTM
Normal	1.39, 98.2%	1.95, 89.3%	1.27, 99.7%
Rotation	1.32, 99.3%	1.96, 89.7%	1.15,99.8%
Scaling	1.51, 97.5%	1.96,89.8%	1.23,99.2%
Rotation+Scaling	1.64, 95.8%	2.04, 88.2%	1.23,99.2%

# **Experiment**

Qualitative analysis

▶ STN could not attend to each digit individually.



# Conclusion

#### Key insights

- ▶ DCN-LSTM achieves high accuracy compared to baseline.
- Attention modules are useful to deal with rotation and scale changes.
- ► STN-LSTM does not perform well due to global transformation.
- How to train the entire model end to end remains a future work.