



# Hands-On Deep Learning for Computer Vision Projects

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# What's a project?

- **there is a problem**
- **the problem is relevant**
- **the goal is clear**
- **there is a ML approach**
- **there is a group** (= 2 people)

handwritten digit recognition

automatically scan checks

2 | 1 → 21

deep neural net

# What do we want in the end?



- **final presentation**
  - **what is the problem**
  - **why is the problem relevant**
  - **what is the goal**
  - **what is the approach**
  - **which experiments did you run (params, results)**
  - **what went well / what didn't**
  - **what's the state of the art**
  - **what can be done in the future**

# How to register



- pick 3 projects and rank them by preference
- send an email to [dlpractice@vision.in.tum.de](mailto:dlpractice@vision.in.tum.de)
- you can either form a group of 2 and send the group information. Or just send your preference and then we will form students into groups.
- please register before **Oct 31, 2016, 12 a.m.**

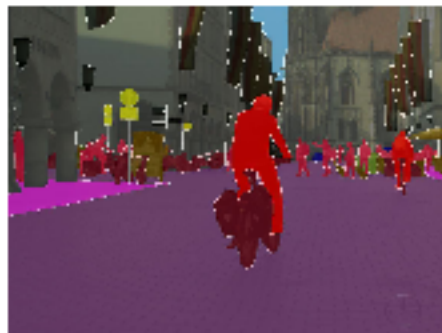
## Instance-based detection/segmentation

- Implementation in TensorFlow
- **Goal:** detect and follow objects through a video  
No LSTM! Taking inspiration from Re-ID.



## Instance-based detection/segmentation

- Implementation in TensorFlow
- **Goal:** detect and follow objects through a video  
No LSTM! Taking inspiration from Re-ID.
- There is room for **semantics!**

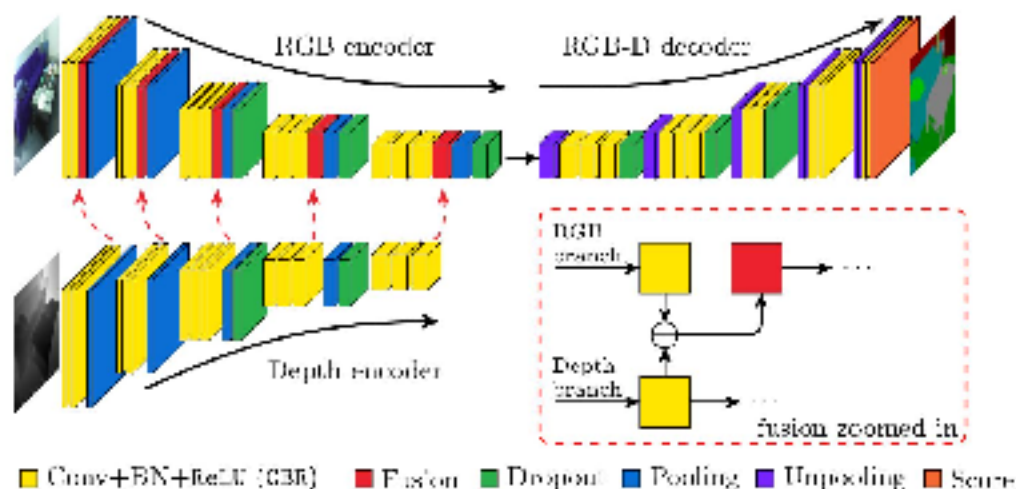


# Healthy competition



## Generalizing *FuseNet* to other applications and networks

- Implementation in TensorFlow
- Group 1:** Scene classification & segmentation
- Group 2:** Different network architectures



C. Hazirbas, L. Ma, C. Domokos, D. Cremers, *In Asian Conference on Computer Vision (ACCV)*, 2016



## Video-based virtual localization (extension of PoseNet)

- Implementation in TensorFlow
- Group 1:** using CNN
- Group 2:** using LSTM



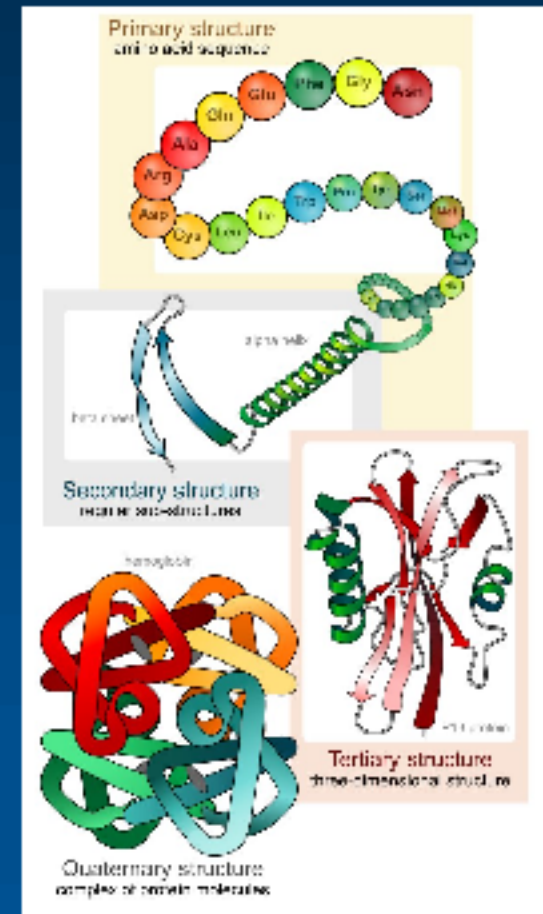
Two different views of the same city street scene. The left image is a wide view of the street, and the right image is a closer view of the street. The images are used to demonstrate the virtual localization process.



<http://mleng.com.ac.uk/projects/relocalisation/>  
Alex Kendall, Matthew Grimes and Roberto Cipolla "PoseNet: A Convolutional Network for Real-Time 6-DOF Camera Relocalization."

# Introduction: Proteins

- “Building blocks of life”
- Structure and function important for life sciences
- Protein structure:
  - **Primary structure:** 1D sequence of amino acids
  - **Secondary structure:** local folding
  - **Tertiary structure:** global 3D shape
- Representation can also be 2D
- Working with these 1D, 2D, 3D representations is mutually beneficial for other fields (sequences, images, shapes...)



# Projects

# Foundations of Deep Learning

Several sub-projects such as:

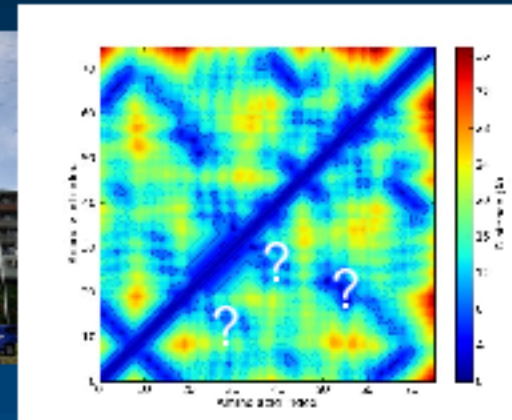
- Denoising of protein scoring matrices
  - 1D convolutional network
- Positive/unlabeled (PU) learning for virtual screening
  - Multilayer perceptron
  - Interesting cost function and setting
  - Dealing with data imbalance
- Great to get started, and to get intuition of data distributions and problem-tailored solutions

# Improving Results of Different Networks

- The art of pushing the quality
- State-of-the-art methods
  - Deep architectures
  - All-convolutional networks
  - Residual learning
  - Densely connected convolutional networks
  - Advanced cost functions
  - And more
- Applications:
  - Super-resolution of cryo–electron microscopy (3D ConvNets)
  - Virtual screening (multi-input)
  - ...

# Recognition of Protein Structural Motifs in 2D Data

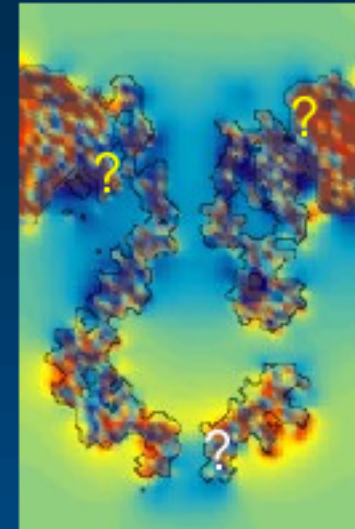
- 2D convolutional networks
- Classification, localization, weakly-supervised learning, PU learning



- Experience with array programming in NumPy (or Matlab or similar) is beneficial
- References:
  - <http://docs.scipy.org/doc/numpy/reference/arrays.indexing.html>
  - optional: Oquab et al. 2015: “Is object localization for free? – Weakly-supervised learning with convolutional neural networks”

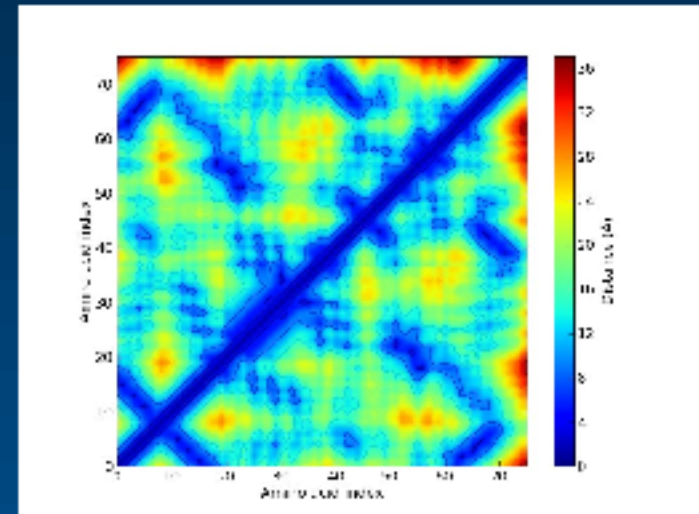
## Recognition of Protein Structural Motifs in 3D Data

- 3D convolutional networks
- Classification, localization, weakly-supervised learning, PU learning
- Big data!
- Experience with array programming in NumPy (or Matlab or similar) is beneficial
- References:
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  - optional: Oquab et al. 2015: “Is object localization for free? – Weakly-supervised learning with convolutional neural networks”



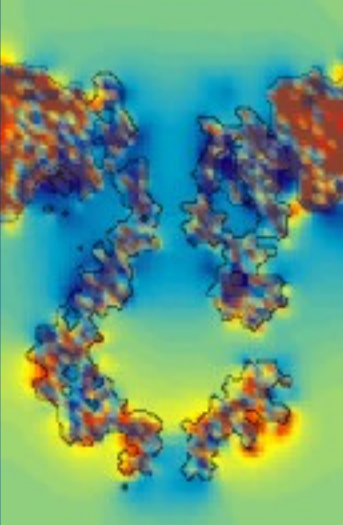
# Protein Function Prediction from **2D Data**

- **2D** convolutional networks
- Interesting output structure (class hierarchy)
- **Outlook: implementation of interesting biological features**
- **Interest in biology is beneficial**
- Experience with array programming in NumPy (or Matlab or similar) is beneficial
- References:
  - <http://docs.scipy.org/doc/numpy/reference/arrays.indexing.html>





# Protein Function Prediction from **3D Data**

- **3D** convolutional networks
  - Interesting output structure (class hierarchy)
  - **Challenging task, advanced deep learning**
- 
- **Requirements:**
    - Practical experience with deep learning
    - Good skills in NumPy (or Matlab or similar)
  - **References:**
    - <http://docs.scipy.org/doc/numpy/reference/arrays.indexing.html>

# The Future of Medical Imaging

- “Image in, diagnosis out”
- Challenge: overfitting
- 3D convolutional networks
- Data: primarily Diffusion MRI