





# M2CAL WORKFLOW CHALLENGE 2016 Fine tuning CNN with HMM smoothing

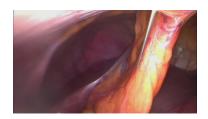
21th October 2016

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## M2CAI Workflow Dataset





Videos resolution is  $1920 \times 1080$ , shot at 25 frames per second at the IRCAD research center in Strasbourg, France.

- 27 training videos
- 15 test videos

#### M2CAI Workflow Dataset



#### 1 of 8 classes for each frames:

- TrocarPlacement
- Preparation
- CalotTriangleDissection
- ClippingCutting
- GallbladderDissection
- GallbladderPackaging
- CleaningCoagulation
- GallbladderRetraction

#### M2CAI Workflow Goal and Measure



Online prediction :  $P(y|x_i, x_{i-1}, x_{i-2}, ...)$ 

$$x_i := \text{frame } i, \text{ and } y := \text{classes}$$

Useful to:

- monitor surgeons
- trigger automatic actions

Measures : - Jaccard similarity coefficient :  $|A \cap B| = |A \cap B|$ 

$$J(A,B) = \frac{|A \cap B|}{|A \cup B|} = \frac{|A \cap B|}{|A| + |B| - |A \cap B|}$$

- Accuracy top1 : nb frames well classified / nb total frames

### Two fold



Training models to classify from images (frames)
Extract features from CNN Fine tuning CNN
Smoothing the predictions of our model
1. averaging 2. HMM

# 1. Extracting images



Train

Val

# 2. Training a frame classifier



Features extraction

# 2. Training a frame classifier



Fine tuning CNN

# 2. Training a frame classifier



Fine tuning CNN with Weldon

# 3. Smoothing the predictions



Avereging

# 3. Smoothing the predictions



HMM online

# 3. Smoothing the predictions



HMM offline

### Validation set



### Visualization



by classes

### Visualization



hmm A

### Visualization



hmm mus

# Conclusion



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