# Optical Flow Clustering for ROI Coding

Holger Meuel · Marco Munderloh · Matthias Reso · Jörn Ostermann

# **Problem and Goal**

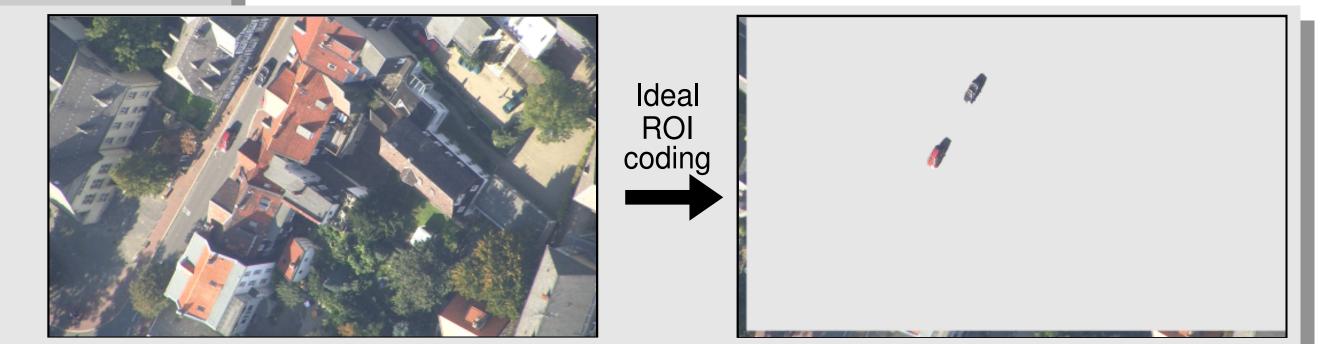
Goal: Transmission of HDTV video over narrow bandwidth channels

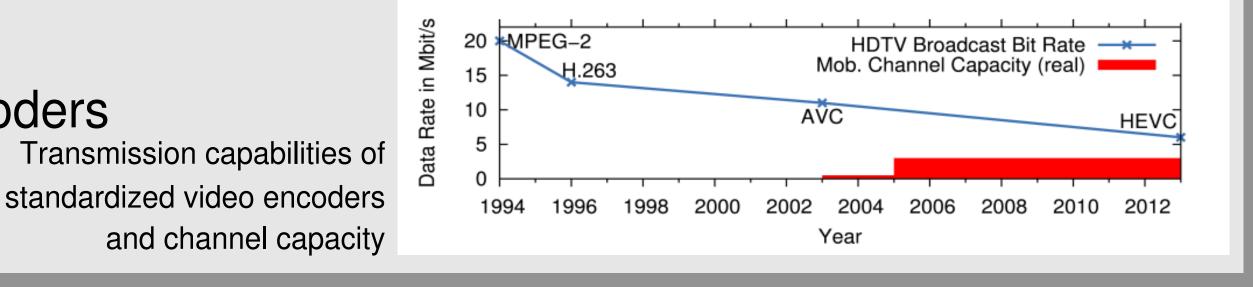
- ► 622 Mbit/s PCM data rate for HDTV video, >5 Mbit/s with standardized encoders
- Very small bandwidth channels
- Need for an encoder employing characteristics of airborne video

## **Region of Interest (ROI)-based Coding System**

#### **ROI Coding System for Planar Landscapes**

- Global Motion Estimation/Compensation (GME/GMC) [1]
- New Area (NA) calculation based on GME parameters [1]
- Moving Object (MO) detector detects (local) motion not matching the global one (difference image-based) [1] Superpixel segmentation for MO shape information refinement [2] Transmission of NAs and MOs only (example right) [1, 2]





**Problem:** Planar landscape does not fit reality, thus lots of non-moving objects are wrongly detected as moving

Frame from an aerial surveillance video in HDTV resolution (750m flight height)

ROI areas to be transmitted for one HDTV frame (i.e. 5%).

Reference: [1] Meuel et al.: Low Bit Rate ROI Based Video Coding for HDTV Aerial Surveillance Video Sequences, CVPR–W 2011: WAVP Reference: [2] Meuel et al.: Superpixel-based Segmentation of Moving Objects for Low Bitrate ROI Coding Systems, AVSS 2013

# Mesh-based Motion Compensation and Moving Object Detection

Idea: Replace one global motion compensation (one plane) by several local motion compensations (many planes) [3]

### **Mesh-based Motion Estimation**

- KLT-based optical flow estimation
- Assumption: Smooth background motion vector field:
  - Cluster similar displacement vectors in optical flow (locally smooth change)
  - Largest cluster defined as background

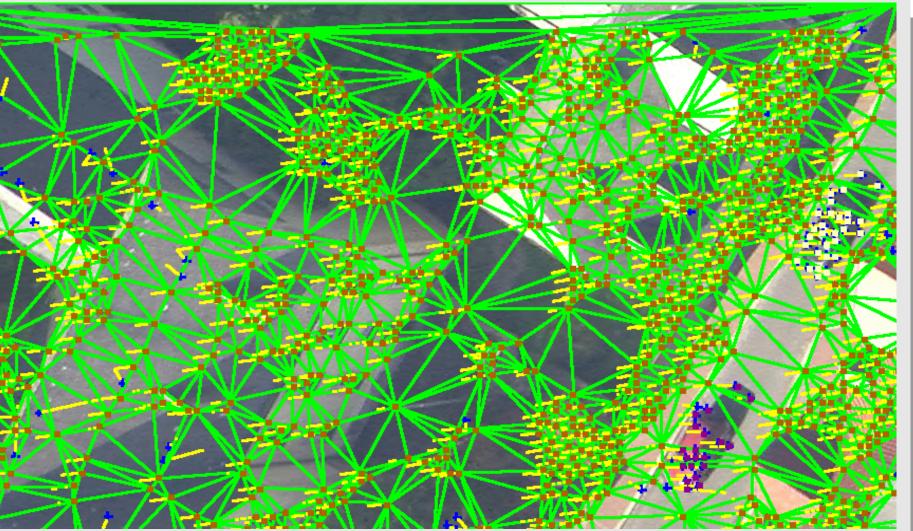
#### **Mesh-based Motion Compensation**

- Delaunay triangulation for mesh creation
- Individual affine transform for every mesh patch defined by triangle corners
- Better adaption to 3D landscape shapes

#### **Mesh-based Motion Detection**

- Moving Objects (MOs) = (local) discontinuities in the optical flow
- Difference image-based MO detection

Reference: [3] Munderloh et al.: Mesh-based Global Motion Compensation for Robust Mosaicking & Detection of Moving Objects in Aerial Surveillance, CVPR–W 2011: WAVP

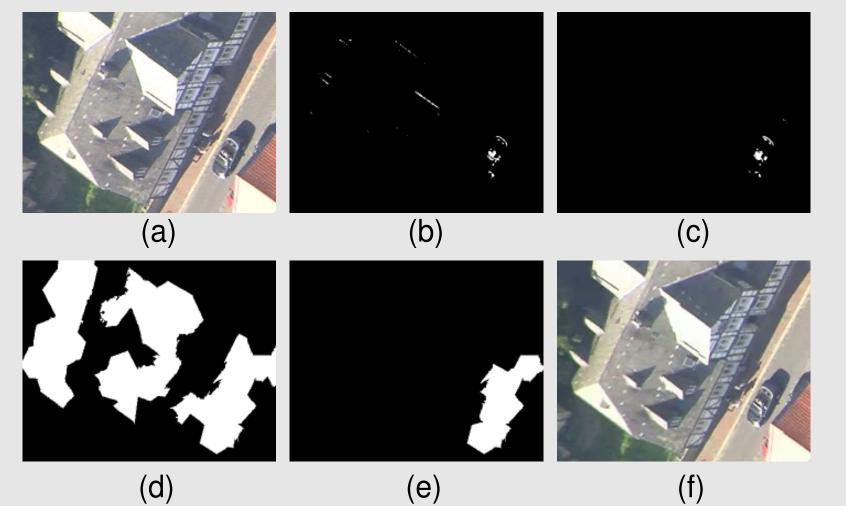


Mesh (green) between detected features (brown dots: background features, blue crosses: MO candidates incl. outlier, purple/white dots: two MOs after cluster filter), trajectories (yellow) in the motion comp. frame

# Superpixel–ROI Coding System with Mesh–based MO Detector

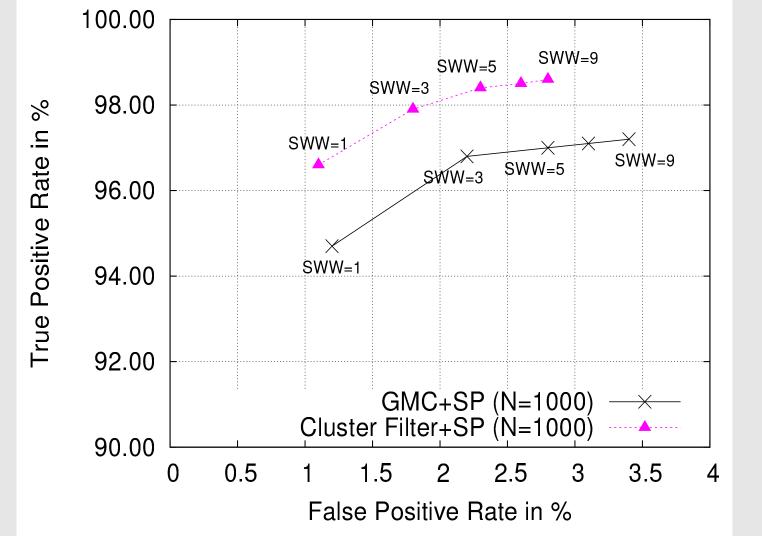
Decrease false positive (FP) rate by mesh-based MO detector & cluster filtering Increase true positive (TP) rate using (temp. consistent) superpixels

- Superpixel segmentation to improve MO spatial detection gaps
- "Temporally Consistent Superpixels" (TCS) [4] to fill MO temporal detection gaps (Sliding Window)

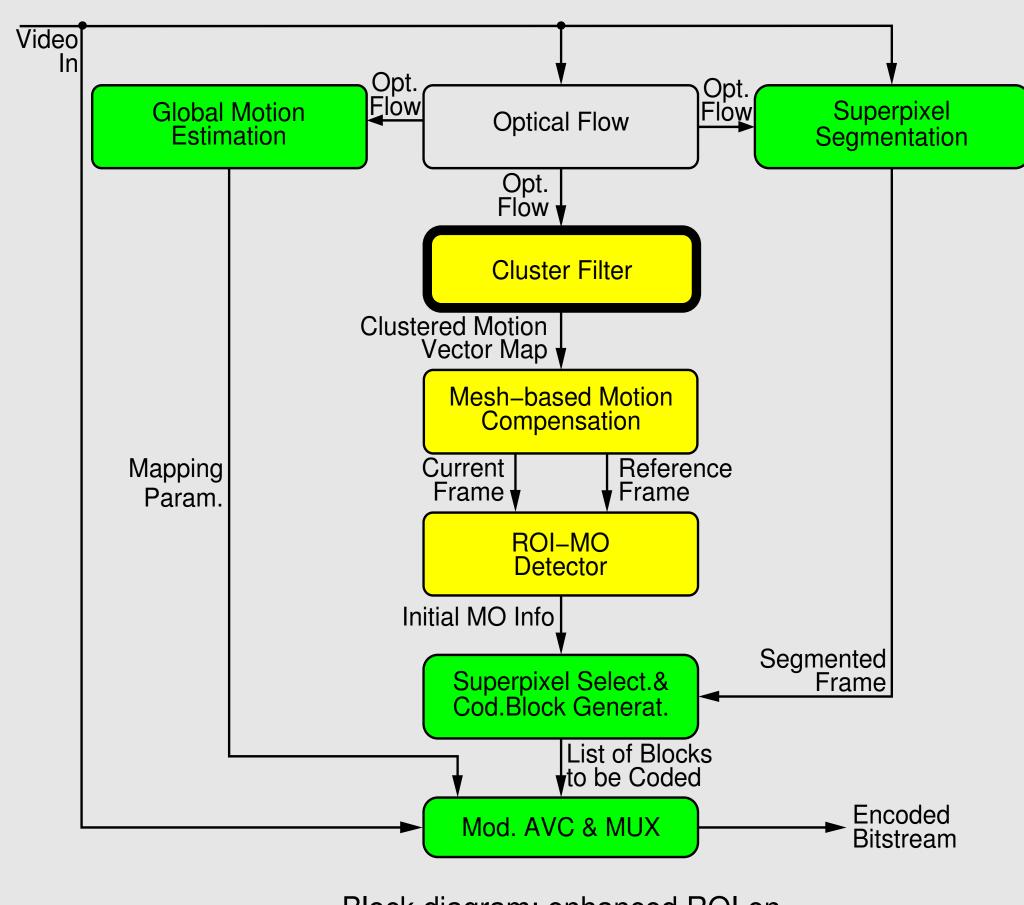


MOs of diff.-image- (b) and mesh-based-MO detector (c) and after superpixel enlargement (d, e). Original in (a), decoded result in (f).

Reference: [4] Reso et al.: Temporally Consistent Superpixels, ICCV 2013



ROC curve of diff.-image- and mesh-based-MO detector (SWW=Sliding Window Width)



Block diagram: enhanced ROI encoder for planar aerial sequences



**Optical Flow Cluster Filter Supported ROI-based Coding System for Airborne Video Sequences** 

- (Fully automatic) Aerial HDTV video coding with <2 Mbit/s</p>
- Encode only New Areas (NA) & Moving Objects (MOs) from aerial video sequences
- Mesh-based local motion compensation for MO detection
- Superpixels to increase TP rate by context-aware MO area enlargement
- Cluster filter to decrease FP rate of MO detections (up to 18 %)
- Data rate savings up to 24 % for moving object areas (4 % overall) compared to global motion compensation-based MO detector system



Picture Coding Symposium 2013 Dec. 8-11, 2013, San José, USA

