

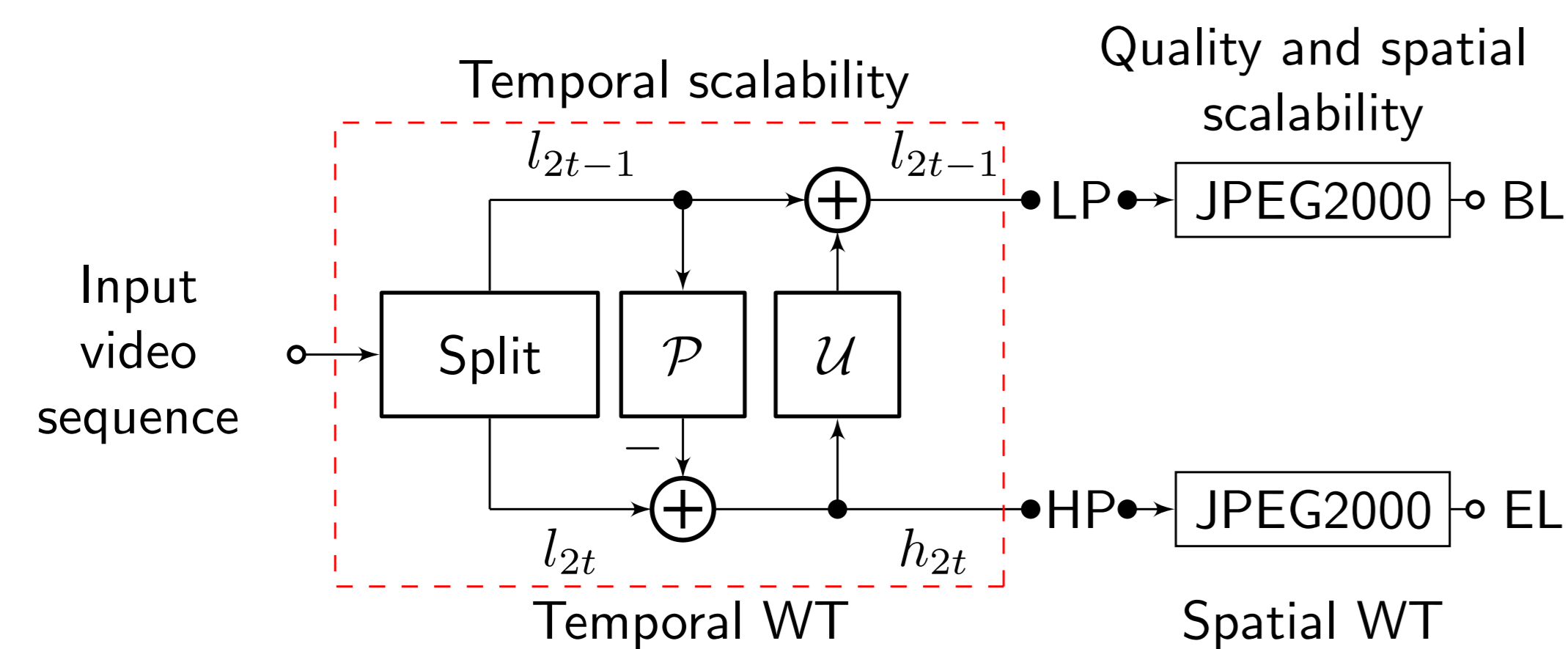
# Content Adaptive Wavelet Lifting for Scalable Lossless Video Coding

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## 1. Introduction

- **Task:** Professional applications often require lossless compression
- **Challenge:** Lossless compression leads to high bit rates
- **Solution:** Scalable lossless video coding based on transmitting a base layer (BL) with coarser quality and one or more enhancement layers (ELs), comprising the residual video data
- **Approach:** 3-D subband coding based on Wavelet Transforms (WT) [1]



- By realizing  $\mathcal{P}$  as the warping operator  $\mathcal{W}$ , Motion Compensated Temporal Filtering (MCTF) is achieved [2]:

$$h_{2t} = l_{2t} - \lfloor \mathcal{W}_{2t-1 \rightarrow 2t}(l_{2t-1}) \rfloor$$

$$l_{2t-1} = l_{2t-1} + \lfloor \frac{1}{2} \mathcal{W}_{2t \rightarrow 2t-1}(h_{2t}) \rfloor$$

## 2. Content Adaptive Wavelet Lifting (CA-WL)

- **Idea:** Adaptive temporal scaling based on significant changes among subsequent frames
- **Stopping Criterion:**
  - Haar WTs can be represented with tree structures
  - With each node a basis vector  $\mathbf{b}_{i,t}$  and a wavelet coefficient vector  $\mathbf{c}_{i,t}$  is associated, which is the inner product of the signal  $\mathbf{s}$  with the basis  $\mathbf{b}_{i,t}$
  - If combined costs of child nodes exceed costs of parent node, i.e.

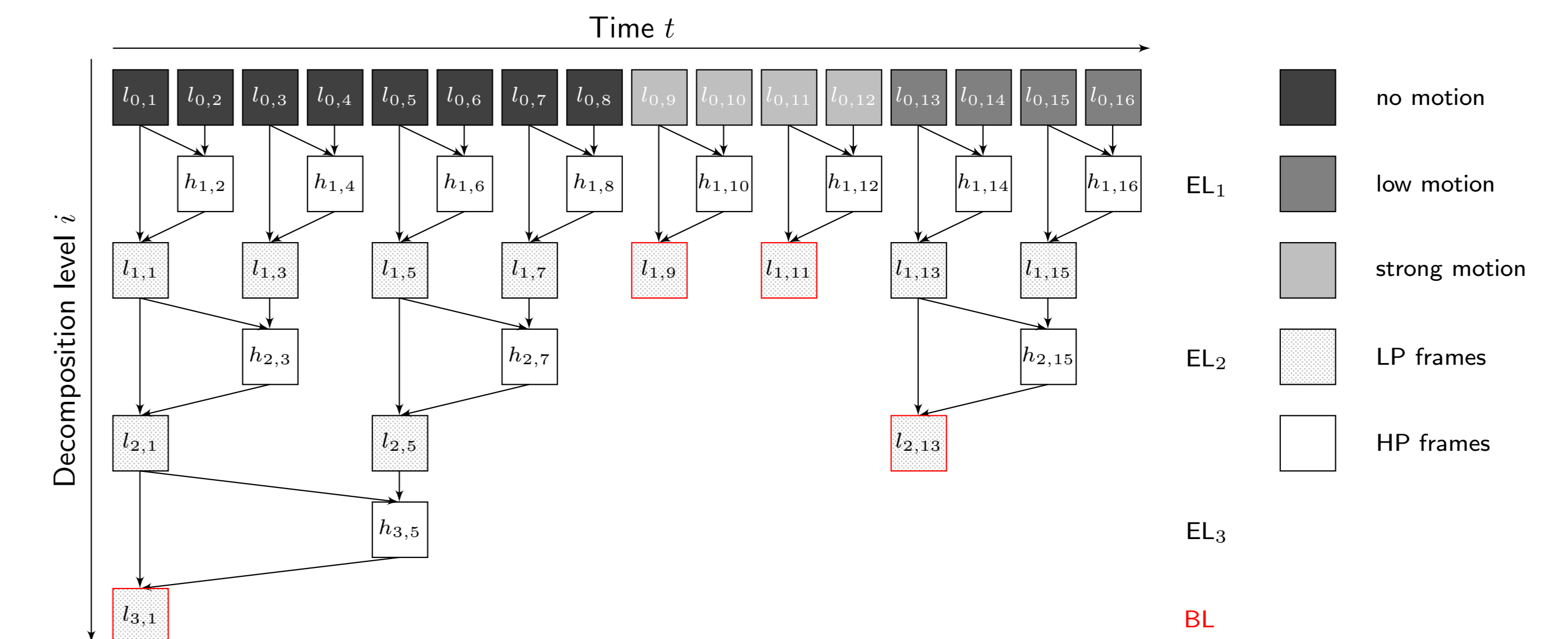
$$\mathcal{C}(\mathbf{s}, \mathbf{b}_{i,[2t-1,2t]}) \leq \mathcal{C}(\mathbf{s}, \mathbf{b}_{i+1,2t-1} \cup \mathbf{b}_{i+1,2t}),$$

the child nodes shall be pruned from the tree

- $\mathcal{C}(\cdot)$  describes a Lagrangian cost functional, which represents the coding costs:

$$\mathcal{C}(\mathbf{s}, \mathbf{b}) = D(\mathbf{s}, \mathbf{b}) + \lambda R(\mathbf{s}, \mathbf{b})$$

- Rate  $R(\mathbf{s}, \mathbf{b})$  is composed of the required rate for lossless coding of the LP and HP frames and, in case of MC, the file size of the motion vectors
- Distortion  $D(\mathbf{s}, \mathbf{b})$  is calculated by the MSE of the corresponding wavelet coefficients compared to the original signal according to [3]



- **Handling of the Overhead:**

- Realized by transmitting a vector  $\mathbf{v}$ , whose length equals the number of input frames:

$$\begin{aligned} \text{Initialize } \mathbf{v} : & (0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0) \\ \mathbf{v} \text{ after level } i=1 : & (1, 0, 1, 0, 1, 0, 1, 0, 1, 0, 1, 0, 1, 0, 1, 0) \\ \mathbf{v} \text{ after level } i=2 : & (2, 0, 0, 0, 2, 0, 0, 0, 1, 0, 1, 0, 2, 0, 0, 0) \\ \mathbf{v} \text{ after level } i=3 : & (3, 0, 0, 0, 0, 0, 0, 0, 1, 0, 1, 0, 2, 0, 0, 0) \end{aligned}$$

- Non-zero entries correspond to the number of applied decomposition levels  $i$
- Distance  $d$  to the corresponding HP frame is given by  $d=2^{i-1}$
- Encoded using multiple-context adaptive arithmetic coding [4]

## 3. Experimental Results

- **Simulation Setup (8 bpp):**

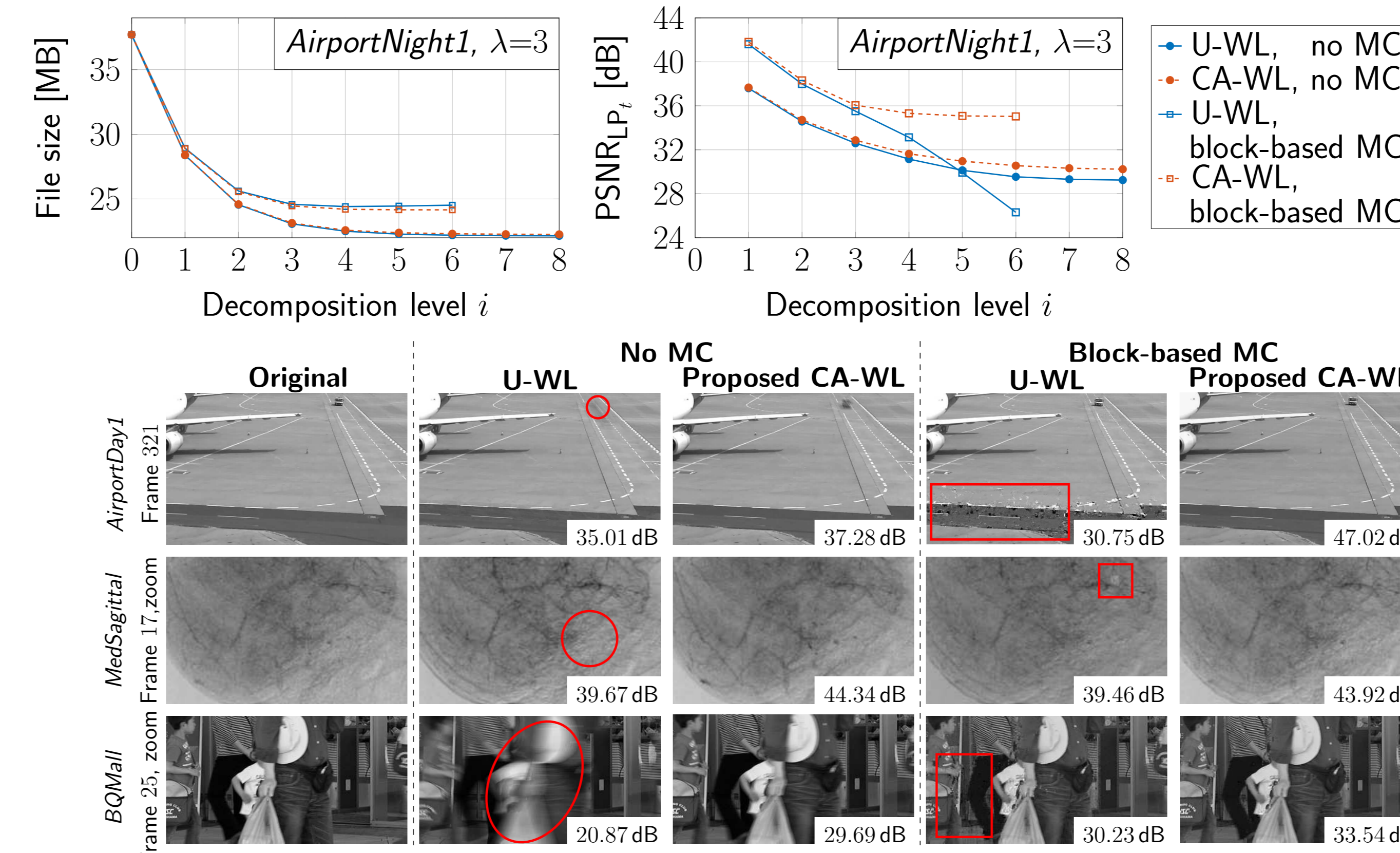
		Spatial resolution	Number of frames
Surv	AirportNight1	688 × 352	500
	AirportNight2	688 × 432	500
	AirportNight3	688 × 372	500
	AirportDay1	688 × 432	500
Med	MedFrontal	512 × 512	29
	MedSagittal	512 × 512	29
HEVC	ClassC	832 × 480	300
	ClassD	416 × 240	300

- **Coding parameters:**

- LP and HP frames are encoded by JPEG2000 [5]
- Block-based MC with block size equals 8
- Search range equals 8 and is doubled for every decomposition level until a maximum size of 64
- Motion vectors are encoded using the QccPack library [6]

Differences of our proposed CA-WL compared to the uniform WL (U-WL) with and without block-based MC.

	$\lambda$	Surv	Med	HEVC	Total average
No MC	1	4.12	5.28	15.45	<b>8.88</b>
	3	1.64	1.91	8.86	<b>5.30</b>
	5	0.97	1.16	6.31	<b>3.67</b>
	7	0.65	1.16	6.18	<b>3.50</b>
	1	5.99	0.09	10.36	<b>6.56</b>
	3	0.80	-0.96	4.15	<b>2.18</b>
	5	0.23	-1.29	2.44	<b>1.08</b>
Block-based MC	7	0.16	-1.29	1.66	<b>0.67</b>
	1	9.30	15.56	10.57	<b>10.98</b>
	3	8.17	13.89	10.43	<b>10.28</b>
	5	7.42	13.89	9.38	<b>9.47</b>
	7	7.27	13.89	8.68	<b>9.02</b>
	1	0.16	-5.58	4.44	<b>1.34</b>
	3	-0.52	-5.64	-0.18	<b>-1.06</b>
5	-0.69	-5.64	-0.66	<b>-1.38</b>	
7	-0.80	-5.64	-0.94	<b>-1.57</b>	



## 4. Conclusion

- Temporal resolution controlled by recursive application of WT
- Visual quality of BL is degraded by strong motion of underlying video
- CA-WL locally adapts temporal scaling by evaluating a Lagrangian cost functional
- For  $\lambda=3$  and MC, PSNR<sub>LP<sub>i</sub></sub> of BL is increased by 10.28dB and rate is reduced by 1.06%

References:  
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