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# Shape-Adaptive Discrete Cosine Transform for Predictor Improvement in HEVC

Formangepasste diskrete Cosinus-Transformation zur  
Prädiktionsverbesserung im HEVC

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# Applications with High Fidelity Requirements

- Professional applications
  - Medical applications
  - Monitoring systems
  - Industrial manufacturing
  - Digital cinema



Warner Bros, *Matrix Reloaded*



[www.radiology-equipment.com](http://www.radiology-equipment.com), *CT Scanner*



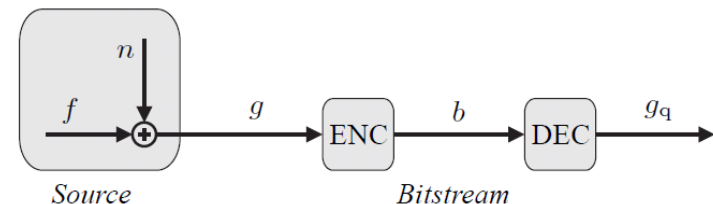
[www.tagesspiegel.de](http://www.tagesspiegel.de), *Videoüberwachung*



Hegewald & Peschke, *Videoextensometer*

# Standards for High Fidelity Compression

- Standards for professional applications
  - JPEG-LS, JPEG-2000, Motion JPEG
  - No inter-frame coding
  - Not optimal for video compression
- Standards for consumer applications
  - HEVC, H.264/AVC, MPEG-2
  - Inter-frame prediction available
  - Not optimized for high fidelity compression
- Noise within natural videos is considered as a critical issue for high fidelity compression



- Goal
  - Improve high fidelity inter-frame compression of noisy video sequences

# Outline

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- Motivation for in-loop denoising in high fidelity compression
- Shape-Adaptive DCT for reference frame filtering
- Coding results for medium to high quality settings
- Reference frame filtering for low bitrate compression
- Coding results for low to medium quality settings
- Conclusion and outlook



[www.radiology-equipment.com](http://www.radiology-equipment.com), *CT Scanner*



[www.tagesspiegel.de](http://www.tagesspiegel.de), *Videoüberwachung*

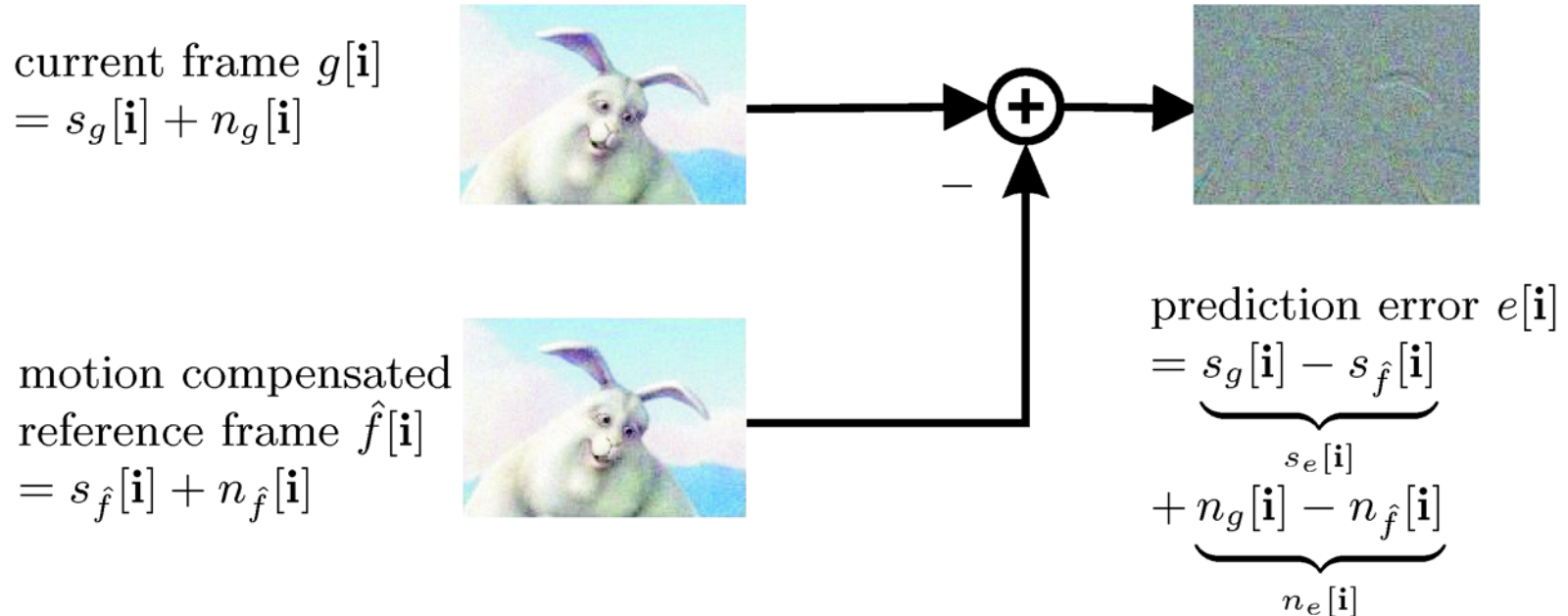


Hegewald & Peschke, *Videoextensometer*

# Prediction Error Signal

- **Problem**

- Prediction error signal has more noise than the current frame itself

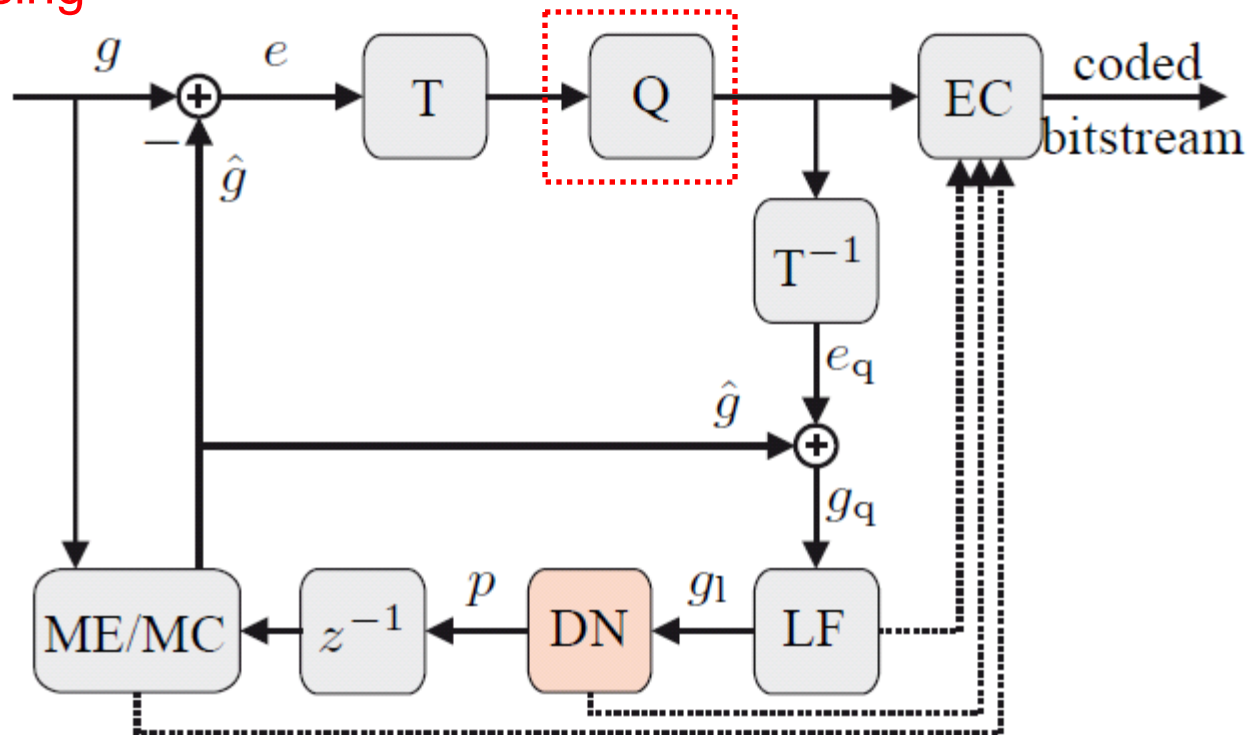


- **Solution**

- Remove noise from the predictor

# Inter-Frame Encoder with In-Loop Denoising

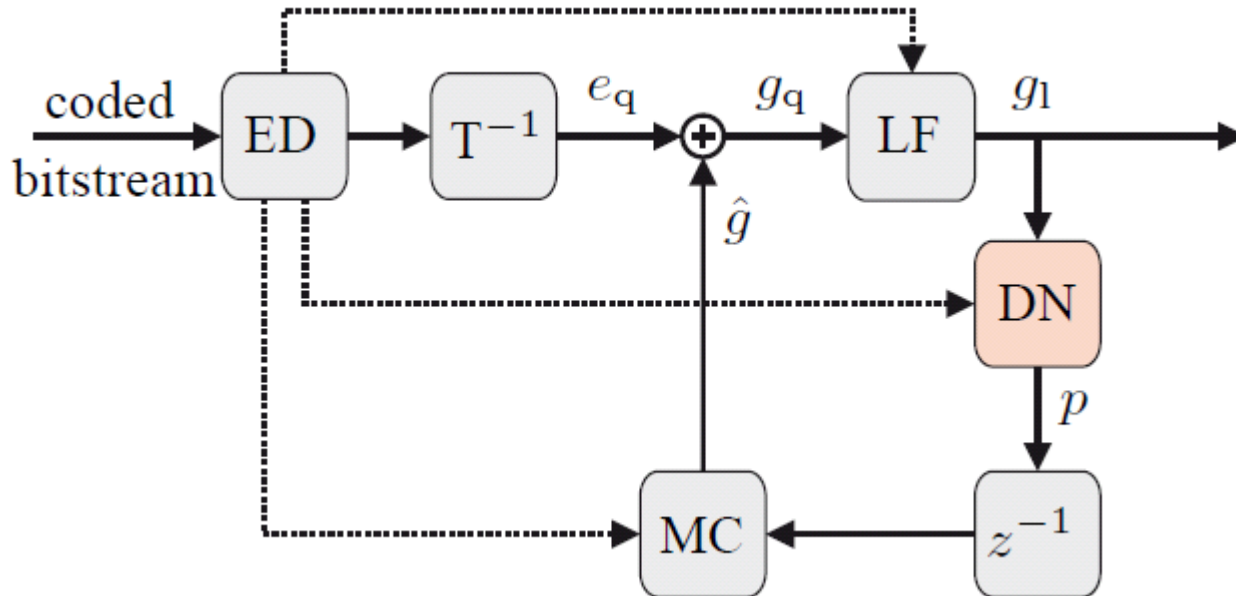
- Simplified block diagram of a lossy inter-frame encoder **with in-loop denoising**



E. Wige, G. Yammine, P. Amon, A. Hutter, A. Kaup, "Analysis of in-loop denoising in lossy transform coding", PCS 2010

# Inter-Frame Decoder with In-Loop Denoising

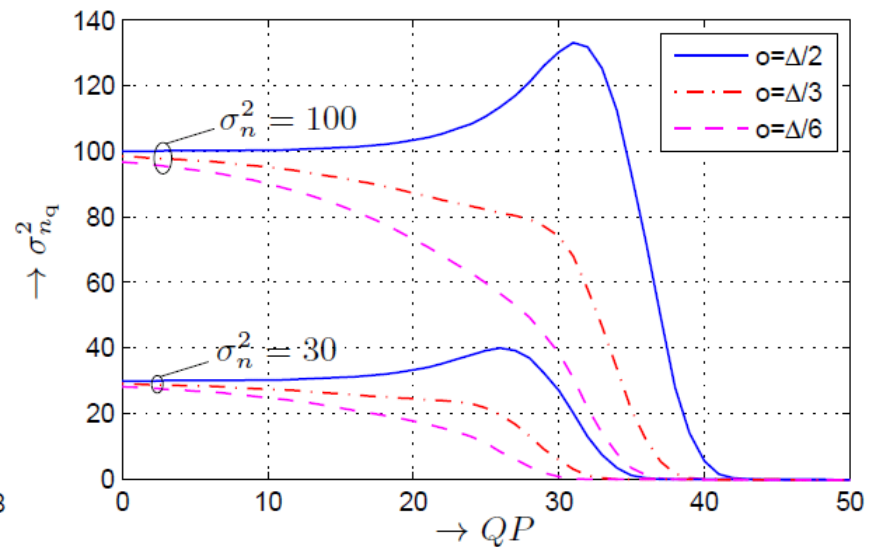
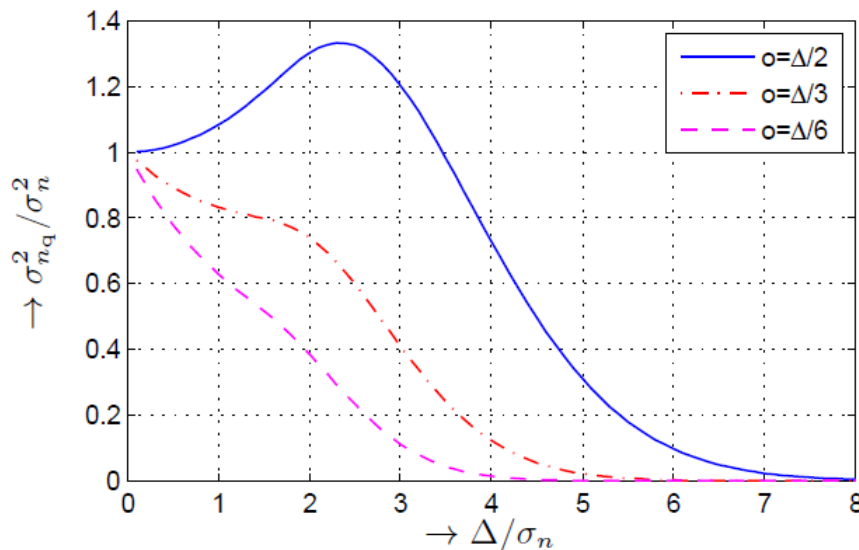
- Simplified block diagram of an inter-frame decoder **with in-loop denoising**



- Denoising is performed **after** displaying the decoded frames

# Theoretical Analysis of In-Loop Quantization

- Noise is generally decreasing for increasing QPs
- Rounding offset parameter  $\circ$  has additional denoising capabilities
- Noise dominates at small quantization step sizes

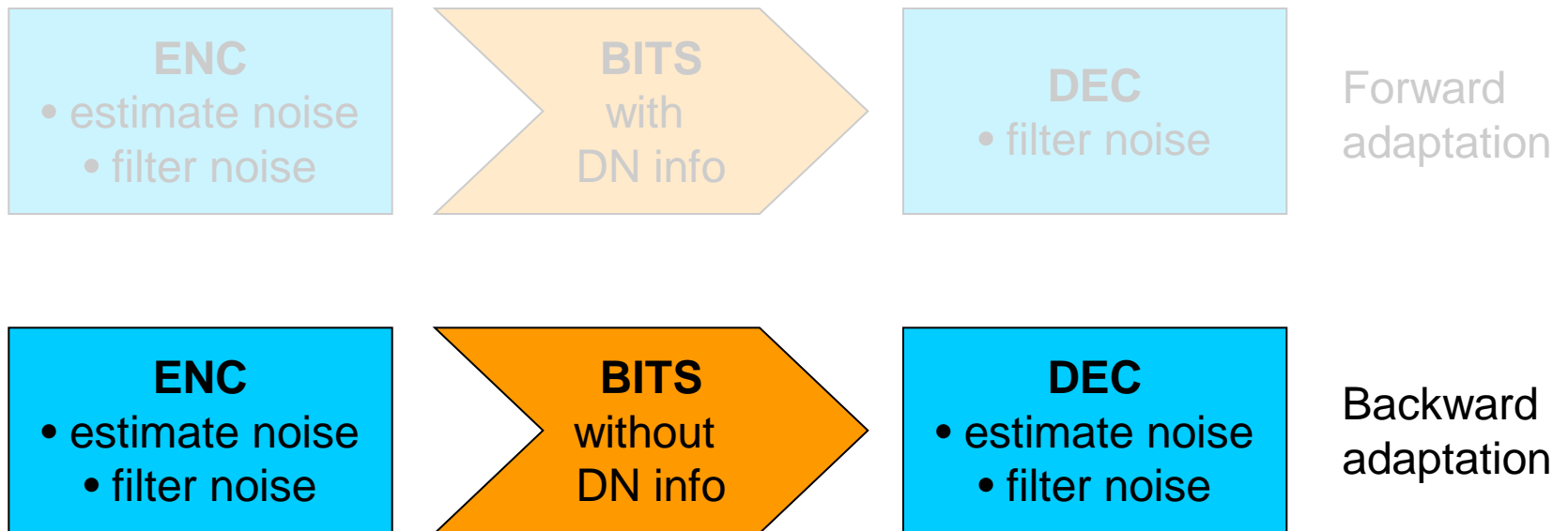


E. Wige, G. Yammine, P. Amon, A. Hutter, A. Kaup, "In-Loop Noise-Filtered Prediction for High Efficiency Video Coding", submitted to Transactions on Circuit and Systems for Video Technology



# Realization of In-Loop Denoising

- If noise is unknown it has to be estimated
- Two ways to implement a codec with in-loop denoising



# Mode Adaptive Noise Modeling

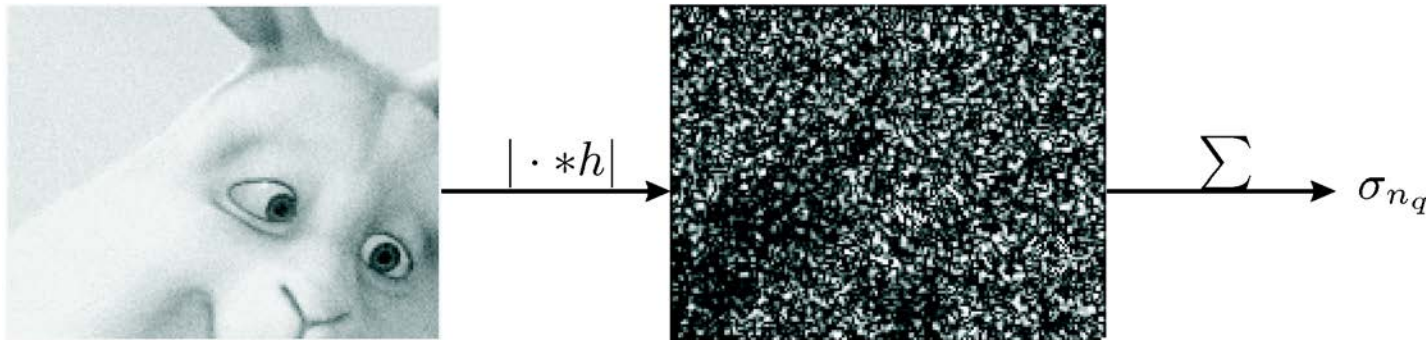
- Noise is different for different CU-types
  - Different quantization of intra and inter prediction residuals
  - Constant noise variance of skipped CUs
  - Mode Adaptive (MA) reference frame denoising

- Noise variance estimation

$$\sigma_{n_q}[c] = \frac{1}{6|\Omega_c|} \sqrt{\frac{\pi}{2}} \sum_{j \in \Omega_c} |gl[j] * \mathbf{h}|$$

$$\mathbf{h} = \begin{bmatrix} 1 & -2 & 1 \\ -2 & 4 & -2 \\ 1 & -2 & 1 \end{bmatrix}$$

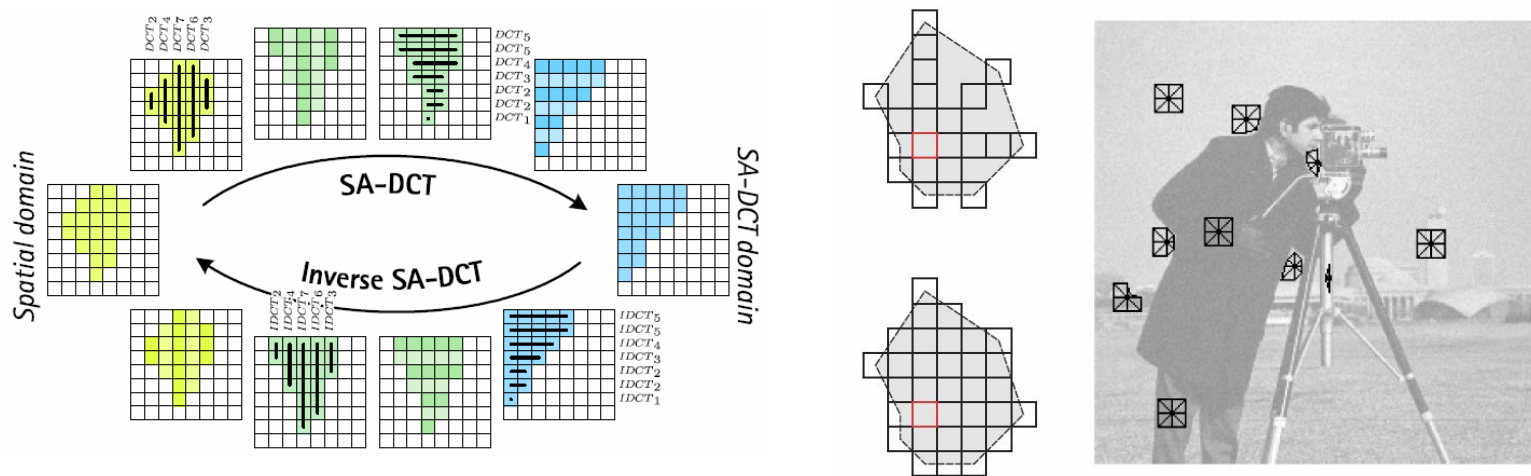
- Mode class  $c = \{Intra, Inter, Skip\}$



E. Wige, G. Yammine, P. Amon, A. Hutter, A. Kaup, "Mode Adaptive Reference Frame Denoising for High Fidelity Compression in HEVC", VCIP 2012

# Shape-Adaptive DCT

- Introduced for coding of arbitrarily shaped regions [1]
- Supported in MPEG-4 Visual (Advanced Coding Efficiency Profile)
- Efficient denoising and deblocking tool
- Implementation of the SA-DCT algorithm according to [2]



[1] T. Sikora, B. Makai, "Shape-Adaptive DCT for generic coding of video," TCSVT 1995

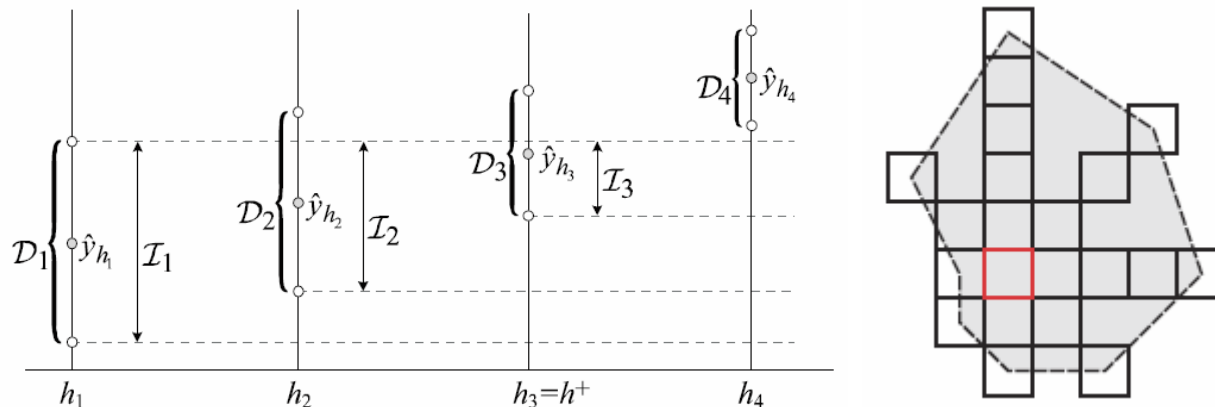
[2] A. Foi, V. Katkovnik, and K. Egiazarian, "Pointwise Shape-Adaptive DCT for high-quality denoising and deblocking of grayscale and color images", TIP 2007

# LPA-ICI-Rule for SADCT

- Local Polynomial Approximation & Intersection of Confidence Intervals
  - Search for homogenous regions (based on directional LPA-kernels)
  - Estimation of pixel value by scalar product with kernel
  - Calculation of the confidence intervals

$$\mathcal{D}_i = \left[ \hat{y}_{h_i}(x) - \Gamma \sigma_{\hat{y}_{h_i}(x)}, \hat{y}_{h_i}(x) + \Gamma \sigma_{\hat{y}_{h_i}(x)} \right]$$

- Optimal length is given by the biggest reliable kernel



A. Foi, V. Katkovnik, and K. Egiazarian, "Pointwise Shape-Adaptive DCT for high-quality denoising and deblocking of grayscale and color images", TIP 2007

# Simulation Results

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- Integration of the SA-DCT reference frame denoising algorithm into the HM-8.2 reference software
- “Lowdelay P” parameter configuration settings
- Coding of 100 frames of high and low resolution sequences
  - ClassB sequences (1920x1080)
  - ClassD sequences (416x240)
- Calculation of average bitrate savings for three quality ranges
  - Lossless compression (LL)
  - High quality (HQ, QP={12,...,27})
  - Medium quality (MQ, QP={22,...,37})

# Simulation Results

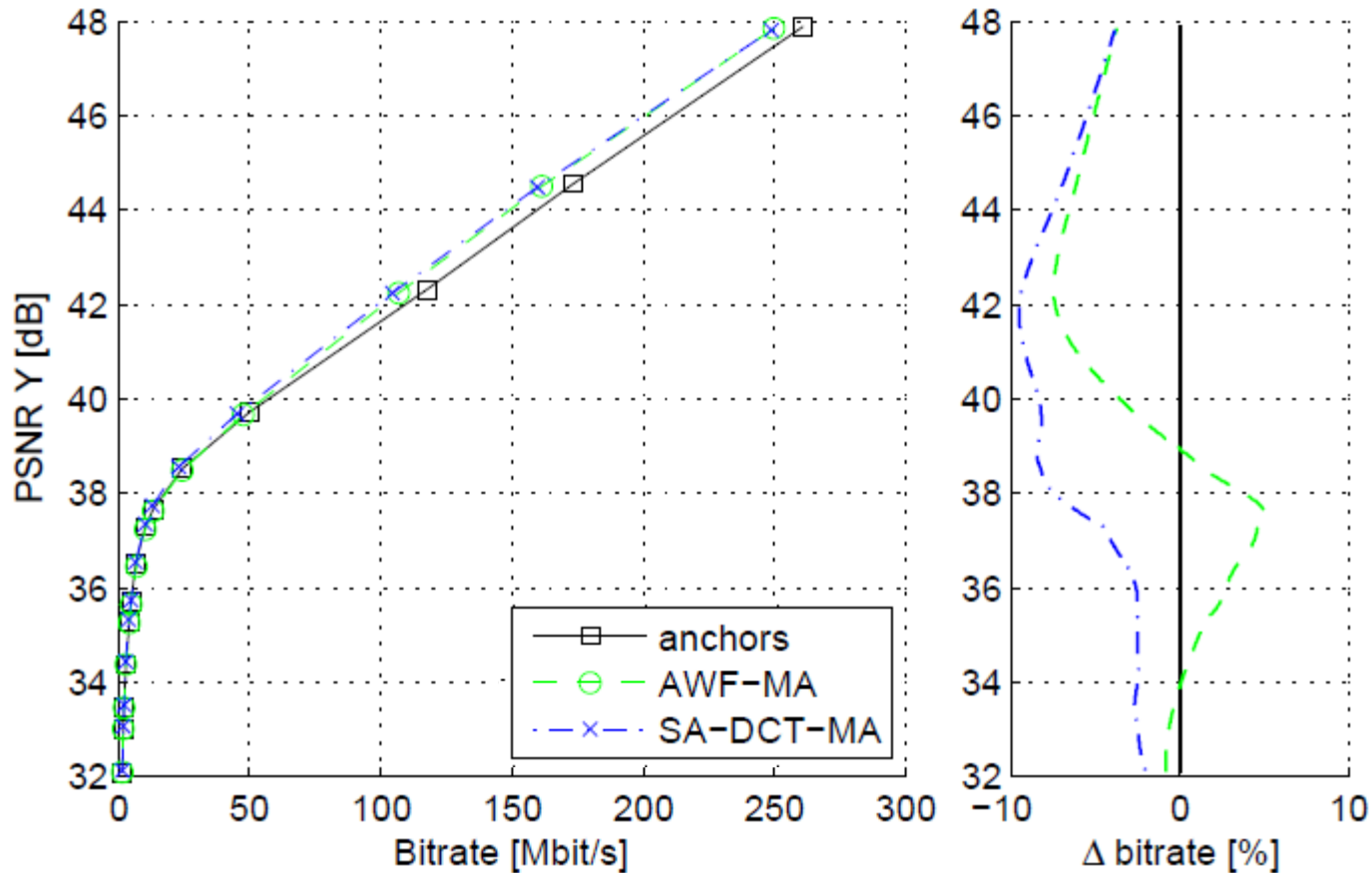
- ClassB on the top and ClassD on the bottom

Sequence	$\Delta$ bitrate in %					
	AWF-MA			SA-DCT-MA		
	LL	HQ	MQ	LL	HQ	MQ
<i>BasketballDrive</i>	-1.72	-3.46	0.12	-3.04	-10.23	-2.27
<i>BQTerrace</i>	0.03	-0.82	7.66	-1.56	-9.08	-5.21
<i>Cactus</i>	-1.92	-3.61	1.66	-2.61	-7.26	-3.54
<i>Kimono1</i>	-1.30	-1.32	-0.45	-2.25	-9.84	-3.32
<i>ParkScene</i>	-0.58	2.15	2.73	-1.18	1.74	-0.25
<b><i>Average</i></b>	<b>-1.10</b>	<b>-1.41</b>	<b>2.34</b>	<b>-2.13</b>	<b>-6.93</b>	<b>-2.92</b>
<i>BasketballPass</i>	3.86	3.97	0.82	-0.06	-0.16	-0.09
<i>BlowingBubbles</i>	1.42	4.89	1.84	-0.20	-0.48	0.02
<i>BQSquare</i>	9.55	27.89	12.80	-0.50	-0.01	0.65
<i>RaceHorses</i>	-0.07	0.07	0.14	-0.03	-0.15	-0.03
<b><i>Average</i></b>	<b>3.69</b>	<b>9.21</b>	<b>3.90</b>	<b>-0.20</b>	<b>-0.20</b>	<b>0.14</b>

E. Wige, G. Yammine, P. Amon, A. Hutter, A. Kaup, "Mode Adaptive Reference Frame Denoising for High Fidelity Compression in HEVC", VCIP 2012

# Simulation Results

- Rate distortion and relative bitrate savings for *Cactus* (ClassB)



# Application to Low Bitrate Coding

- Sometimes compression for very low bitrate transmission is needed
- An error signal is introduced into the reference frame due to coarse quantization
- Can the prediction be improved by reference frame filtering?

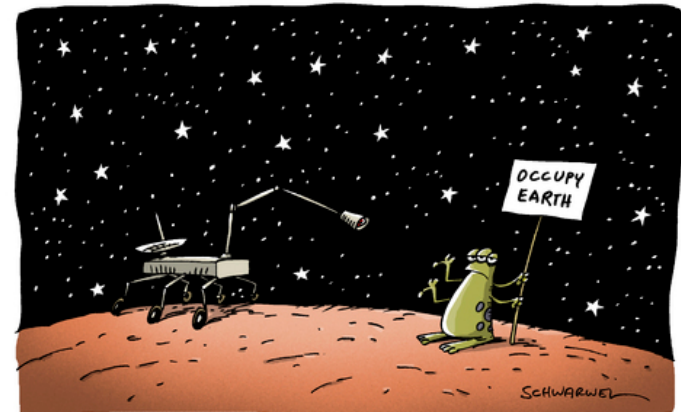


<http://www.engadget.com>, Skype VOIP



[www.prosieben.de/tv/galileo](http://www.prosieben.de/tv/galileo), Mars rover „Curiosity“

MARSSONDE „CURIOSITY“ SENDET ERSTE BILDER !!!

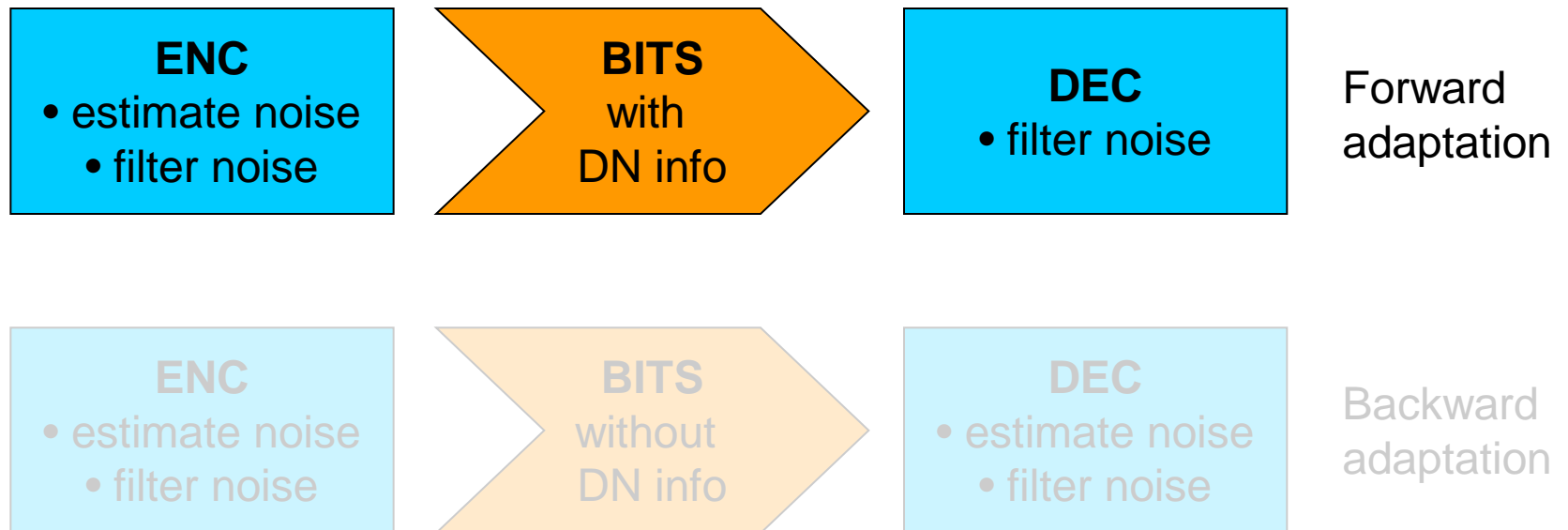


[de.toonpool.com](http://de.toonpool.com), Mars rover „Curiosity“



# Realization of In-Loop Denoising

- If noise is unknown it has to be estimated
- Two ways to implement a codec with in-loop denoising

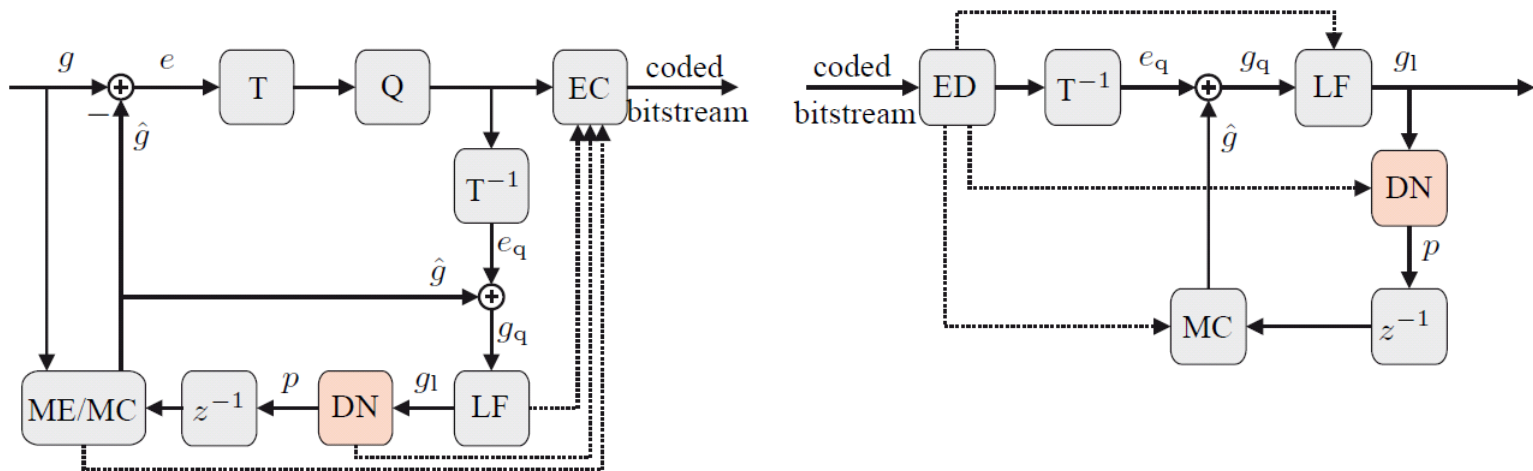


# Noise Modeling

- Estimate noise standard deviation in the encoder and transmit it to the decoder
- Modeling noise variance by the MSE between the current and the reconstructed picture
- Quantize the noise parameter for transmission
- Adaptive decision between  $p$  and  $g_l$

$$\sigma_q^z = \sqrt{\frac{1}{|\Omega|} \sum_{j \in \Omega} (g[j] - g_l[j])^2}$$

$$\sigma_q = \min(\text{round}(\sigma_q^z \cdot 10)/10, 25.5)$$



# Simulation Results

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- Integration of the SA-DCT reference frame filtering algorithm into the HM-8.2 reference software
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- Coding of 100 frames of high and low resolution sequences
  - ClassB sequences (1920x1080)
  - ClassD sequences (416x240)
- Calculation of average bitrate savings for two quality ranges
  - Medium quality (MQ, QP={22,...,37})
  - Low quality (LQ, QP={37,...,51})

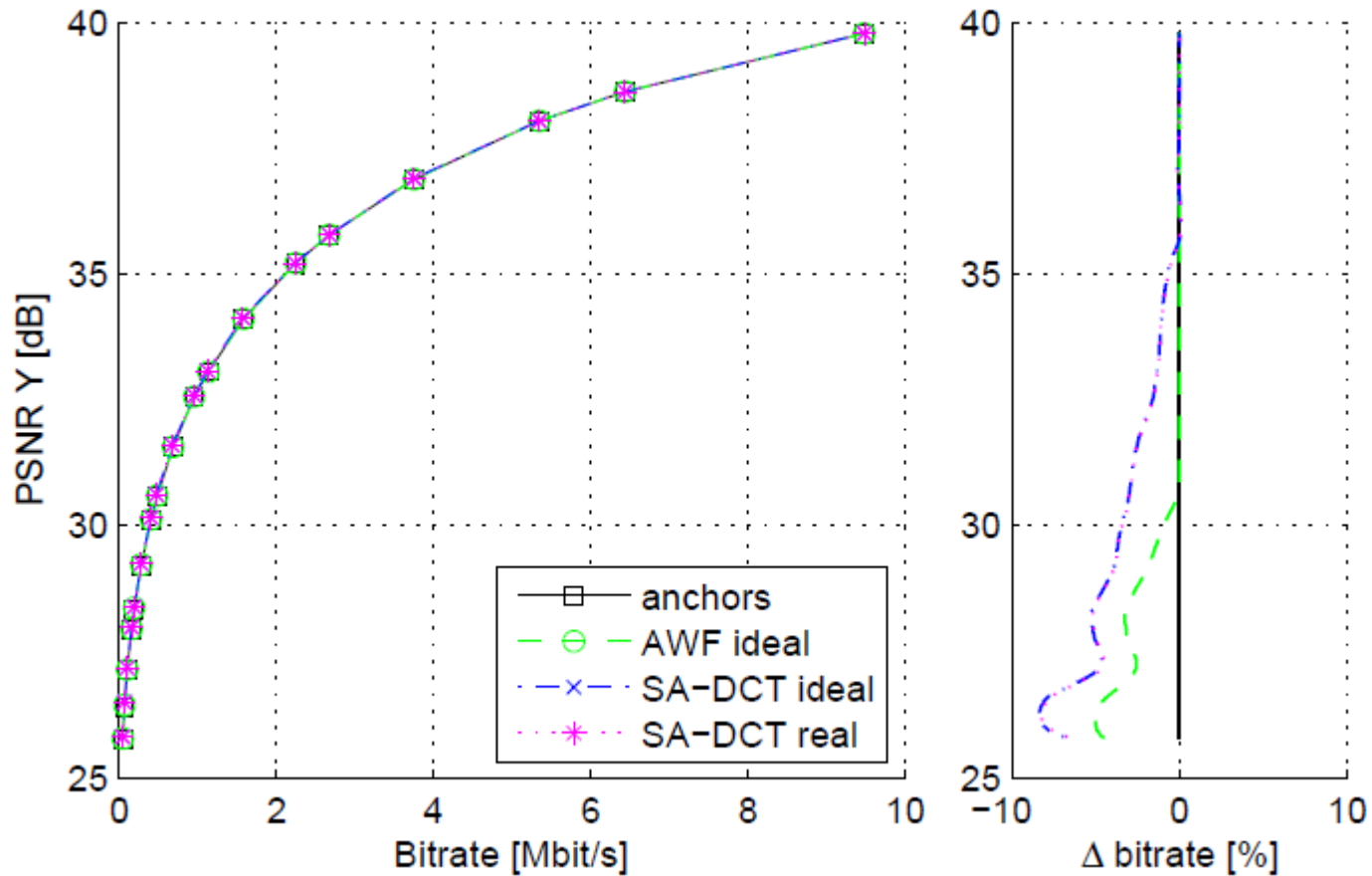
# Simulation Results

- ClassB on the top and ClassD on the bottom

Sequence	$\Delta$ bitrate in %					
	AWF ideal		SA-DCT ideal		SA-DCT real	
	MQ	LQ	MQ	LQ	MQ	LQ
<i>BasketballDrive</i>	-0.13	-2.11	-3.57	-5.47	-3.57	-5.42
<i>BQTerrace</i>	0.00	-0.38	-2.75	-3.78	-2.74	-3.69
<i>Cactus</i>	0.00	-0.88	-2.70	-2.90	-2.70	-2.84
<i>Kimono1</i>	-2.65	-9.42	-8.24	-10.18	-8.23	-10.12
<i>ParkScene</i>	0.00	-2.24	-0.58	-4.64	-0.58	-4.57
<b><i>Average</i></b>	<b>-0.56</b>	<b>-3.01</b>	<b>-3.57</b>	<b>-5.39</b>	<b>-3.56</b>	<b>-5.33</b>
<i>BasketballPass</i>	-0.09	-2.64	-1.69	-4.54	-1.61	-3.84
<i>BlowingBubbles</i>	0.00	-0.42	-0.10	-1.64	-0.04	-1.01
<i>BQSquare</i>	0.07	0.17	-0.27	-2.25	-0.21	-1.69
<i>RaceHorses</i>	-0.01	-0.69	-0.92	-4.34	-0.88	-3.94
<b><i>Average</i></b>	<b>-0.01</b>	<b>-0.90</b>	<b>-0.75</b>	<b>-3.19</b>	<b>-0.69</b>	<b>-2.62</b>

# Simulation Results

- Rate distortion and relative bitrate savings for *ParkScene* (ClassB)



# Summary

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- Conclusion

- Knowledge of noise can be exploited for more efficient prediction
- Dedicated in-loop reference frame denoising filter is proposed
- In general impact of the source noise decreases and impact of coding noise increases with increasing QP
- Evaluation of the SA-DCT algorithm for prediction improvement
- Significant bitrate savings can be achieved in the state-of-the-art video coding standard for strong and weak quantization

- Outlook

- Improve the prediction efficiency for low-bitrate coding by coding variant noise modeling
- Context adaptive entropy coding of the noise parameters
- Combination of the forward and backward adaptive scheme
- Use SA-DCT for output signal reconstruction