



# JCT-VC B024: Mode-dependent fast separable KLT for block-based intra coding

Chuohao Yeo, Yih Han Tan,  
Zhengguo Li, Susanto Rahardja

Institute for Infocomm Research, Singapore

# Outline

- Proposal
- Experimental results
- Conclusion

# What transform to use in Intra Coding?

- H.264: 2-D separable integer DCT-like transform

$$Y = MXM^T$$

- MDDT: 2-D separable KLT [Qualcomm, VCEG-AG11]

$$Y = C_m X R_m^T$$

- Stores 2 matrices per prediction mode
- KLT computed from training sequences
- Full matrix multiply more expensive than DCT

# MDDT Variations

- OMDDT: 2-D separable KLT [TI, VCEG-AM20]  
$$Y = C_m X {C_m}^T$$

- MDDCT: 2-D separable rotated DCT [TI, VCEG-AM20]  
$$Y = Q_m M X {M}^T Q_m$$

# Proposal: Fast separable KLT

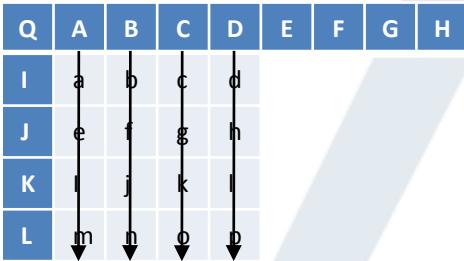
$$Y = C_m X R_m^T$$
$$C_m, R_m \in \{M, C\}$$

→ Proposed Transform

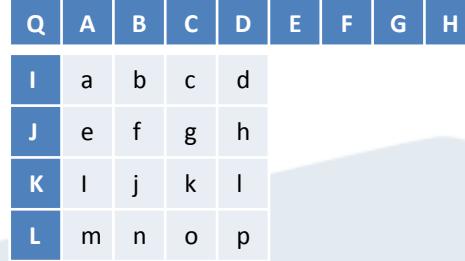
MDDT	Proposal
Requires training to compute KLT	<b>No training required</b>
Needs 18 transforms to be implemented	<b>Needs only 2 transforms</b>
16 muls, 12 adds per tx	<b>8 muls, 10 adds per tx</b>
All modes use KLT	<b>Combination of DCT/KLT</b>

# Observation: Intra prediction leads to uneven error distribution

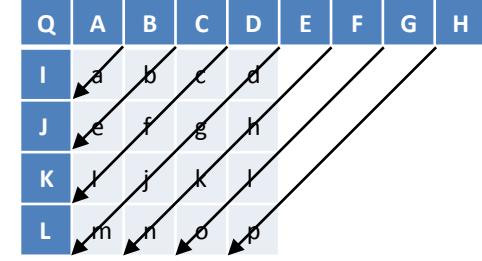
Mode 0 – Vertical



Mode 2 – DC



Mode 3 – Diagonal down-left



27	27	26	32
40	40	41	48
53	54	54	65
72	73	74	86

62	91	93	124
71	100	107	139
89	114	124	160
109	137	154	197

87	88	77	95
131	137	132	150
173	175	172	195
244	225	212	256

Average square error in each 4x4 pixel location

# Statistics of prediction residual

Gauss-Markov  
Image correlation model

$$E[X_{ij}X_{kl}] = \rho^{|i-k|} \rho^{|j-l|}$$

0 (vertical)							
M	A	B	C	D	E	F	G
I							
J							
K							
L							

$k_{th}$  Row-wise

P <sub>1</sub>	P <sub>2</sub>	P <sub>3</sub>	P <sub>4</sub>
X <sub>1</sub>	X <sub>2</sub>	X <sub>3</sub>	X <sub>4</sub>

$k_{th}$  Column-wise

$$\begin{aligned} E[R_i R_j] &= E[(X_i - P_i)(X_j - P_j)] \\ &= 2(1 - \rho^k) \rho^{|i-j|} \end{aligned}$$

Toeplitz matrix!  
DCT is close to optimal

P <sub>0</sub>
X <sub>1</sub>
X <sub>2</sub>
X <sub>3</sub>
X <sub>4</sub>

$$\begin{aligned} E[R_i R_j] &= E[(X_i - P_0)(X_j - P_0)] \\ &= 1 + \rho^{|i-j|} - \rho^{|i|} - \rho^{|j|} \end{aligned}$$

No longer Toeplitz.  
Need to compute KLT.

- KLT has sinusoidal terms
- Do this for 4x4, 8x8 and 16x16
- Fast implementation for 4x4

# Fast KLT for N=4

- Forward

$$\begin{pmatrix} y_0 \\ y_1 \\ y_2 \\ y_3 \end{pmatrix} = \begin{pmatrix} 29 & 55 & 74 & 84 \\ 74 & 74 & 0 & -74 \\ 84 & -29 & -74 & 55 \\ 55 & -84 & 74 & -29 \end{pmatrix} \begin{pmatrix} x_0 \\ x_1 \\ x_2 \\ x_3 \end{pmatrix}$$

$$c_0 = x_0 + x_3$$

$$c_1 = x_1 + x_3$$

$$c_2 = 74x_2$$

$$y_0 = 29c_0 + 55c_1 + c_2$$

$$y_1 = 74(x_0 + x_1 - x_3)$$

$$y_2 = 84c_0 - 29c_1 - c_2$$

$$y_3 = 55c_0 - 84c_1 + c_2$$

## Backward

$$\begin{pmatrix} x_0 \\ x_1 \\ x_2 \\ x_3 \end{pmatrix} = \begin{pmatrix} 29 & 74 & 84 & 55 \\ 55 & 74 & -29 & -84 \\ 74 & 0 & -74 & 74 \\ 84 & -74 & 55 & -29 \end{pmatrix} \begin{pmatrix} y_0 \\ y_1 \\ y_2 \\ y_3 \end{pmatrix}$$

$$b_0 = y_0 + y_2$$

$$b_1 = 74y_1$$

$$b_2 = y_2 + y_3$$

$$x_0 = 29b_0 + b_1 + 55b_2$$

$$x_1 = 55b_0 + b_1 - 84b_2$$

$$x_2 = 74(y_0 - y_2 + y_3)$$

$$x_3 = 84b_0 - b_1 - 29b_2$$

- 8 multiplies, 10 adds

# Proposed separable transforms

- Analysis applied for modes 0,1,2,3,7,8
- Computed KLT very similar to MDDT trained KLTs for modes 4,5,6

Mode	Column	Row	Computation Savings
0	KLT	DCT	63%
1	DCT	KLT	63%
2	DCT	DCT	75%
3	KLT	DCT	63%
4	KLT	KLT	50%
5	KLT	KLT	50%
6	KLT	KLT	50%
7	KLT	DCT	63%
8	DCT	KLT	63%

# Experiment Conditions (I)

- KTA2.6r1, High Profile
- 5 QP points
- Full length of all CfP sequences coded as Intra frames
- KTA options:
  - UseAdaptiveLoopFilter = 1

# Experimental Results

Test Class	KTA+MDDT vs KTA		KTA + Proposed KLT vs KTA	
	BD-Rate (%)	BD-PSNR (dB)	BD-Rate (%)	BD-PSNR (dB)
2560x1600	-6.08	0.34	-6.72	0.38
1920x1080	-5.09	0.22	-5.10	0.22
832x480	-4.60	0.27	-4.68	0.27
416x240	-3.85	0.25	-3.89	0.25
1280x720	-7.74	0.45	-7.75	0.45

# Experiment Conditions (II)

- KTA2.6r1, High Profile
- 5 QP points
- Full length of all CfP sequences coded as with Hier-B with GOP size 8
- KTA options:
  - MVCompetition = 1
  - UseAdaptiveLoopFilter = 1
  - UseExtMB = 2

# Experimental Results

Test Class	KTA+MDDT vs KTA		KTA + Proposed KLT vs KTA	
	BD-Rate (%)	BD-PSNR (dB)	BD-Rate (%)	BD-PSNR (dB)
2560x1600	-2.85	0.12	-3.02	0.13
1920x1080	-2.58	0.07	-2.50	0.07
832x480	-2.00	0.08	-1.93	0.08
416x240	-1.54	0.07	-1.48	0.06
1280x720	-3.77	0.16	-3.43	0.14

# Conclusion

- Proposed fast separable KLT for intra coding
  - No training required to compute transform
  - Only 2 transform matrices needed (DCT, KLT)
  - Some rows/columns can use fast DCT
  - Exploit coefficients in KLT to reduce operations
- Recommend further study in Tool/Core Experiments