

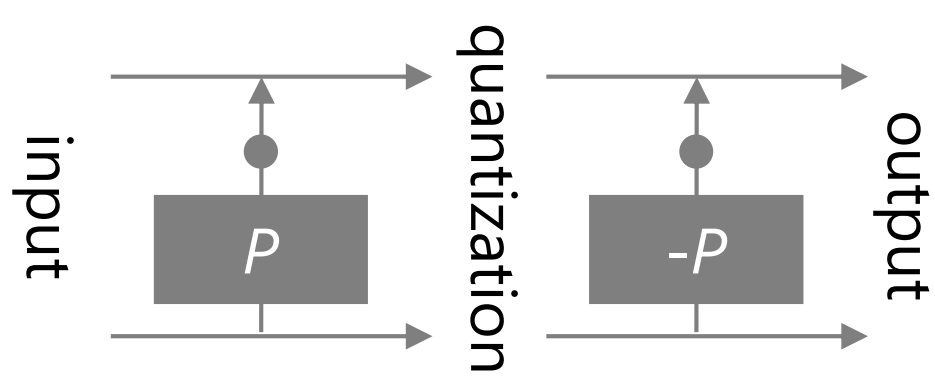
# PSUEDO REVERSIBLE SYMMETRIC EXTENSION FOR LIFTING-BASED NONLINEAR-PHASE PARAUNITARY FILTER BANKS

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## 1. Purpose & Preparation

- Our target is more efficient lossy-to-lossless (L2L) image coding.
- **lifting-based nonlinear-phase paraunitary filter banks (L-NLPPUFBs)** which are more efficient reversible transforms
  - **pseudo reversible symmetric extension (P-RevSE)** which solves the image boundary problem on the reversible transforms

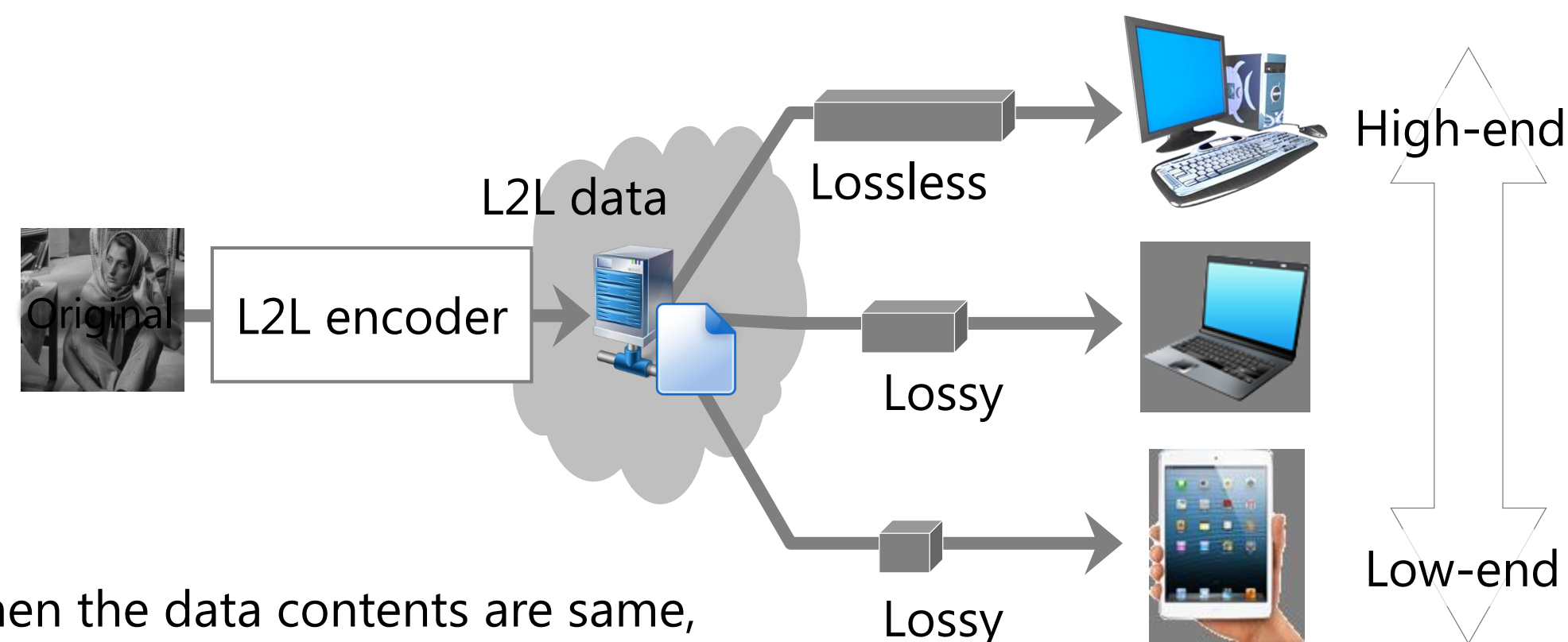
### Lifting Structure



- Map **integer to integer** (signals)
- **Lossless** when quantization width = 1
- **Lossy** when quantization width > 1
- FBs can be factorized into lifting structures where the constraint is  $\det(\mathbf{E}(z)) = \pm 1$
- Be also used for LT in JPEG XR

●: "rounding operation" which rounds a floating-point number to an integer  
 P: "lifting coefficient" which is a floating-point number

### Lossy-to-lossless (L2L) Image Coding



When the data contents are same, the files are unified to only one data.

**Lifting-based FBs can achieve L2L image coding.**

## 2. P-RevSE for L-NLPPUFBs (Proposal)

### Nonlinear-Phase Paraunitary Filter Banks (NLPPUFBs) [5]

- The lattice structure is as follows:

$$\mathbf{E}(z) = \left( \prod_{i=K-1}^1 \mathbf{G}_i \begin{bmatrix} \mathbf{I} & \mathbf{O} \\ \mathbf{O} & z^{-1}\mathbf{I} \end{bmatrix} \mathbf{G}_0 \right) \mathbf{G}_k \quad \mathbf{G}_k : \text{an } M \times M \text{ arbitrary unitary matrix}$$

$$\det(\mathbf{E}(z))|_{z=1} = \pm 1$$

- **NOT limited by the linear-phase property**, i.e., they have high compression rates
- ex) The lapped transform (LT) in JPEG XR has the linear-phase property
- **Can be easily factorized into lifting structures**

### Pseudo Reversible Symmetric Extension (P-RevSE) for Lifting-based NLPPUFBs (L-NLPPUFBs)

Even if NLPPUFBs can be easily factorized into lifting structures, the conventional SE cannot achieve reversible transforms.

If  $\mathbf{V}$  is also expressed as lifting structures, the SE can achieve reversible transforms.

A minimum condition to realize lifting factorization:

$$\det(\mathbf{V}) = \pm 1$$

According to the condition, we control the det. of the matrices in

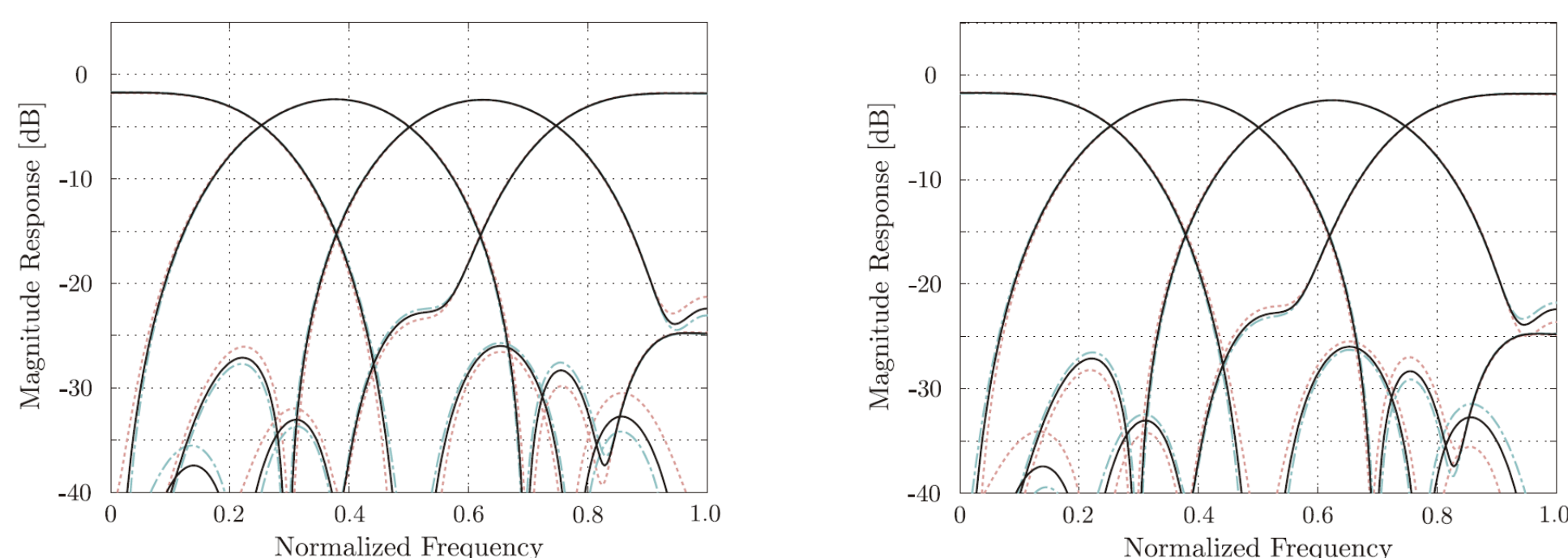
$$\tilde{\mathbf{V}} = \frac{\mathbf{V}}{M^{1/2} \sqrt{|\det(\mathbf{V})|}}$$

On the other hand, if  $\tilde{\mathbf{U}}, \tilde{\mathbf{V}}$  are significantly different from  $\mathbf{U}, \mathbf{V}$ , smoothness at the boundary may be lost and may degrade compression efficiency.

To preserve the smoothness, we design the L-NLPPUFBs by considering the differences as

$$C_{det} = (|\det(\mathbf{V})| - 1)^2$$

We designed 3 types of 4x12 NLPPUFBs (K=3): not boundary (A), upper boundary (B), lower boundary (C)



Frequency responses (black: type A, pink: type B, light blue: type C)

Coding gain of the resulting 4x12 L-NLPPUFBs

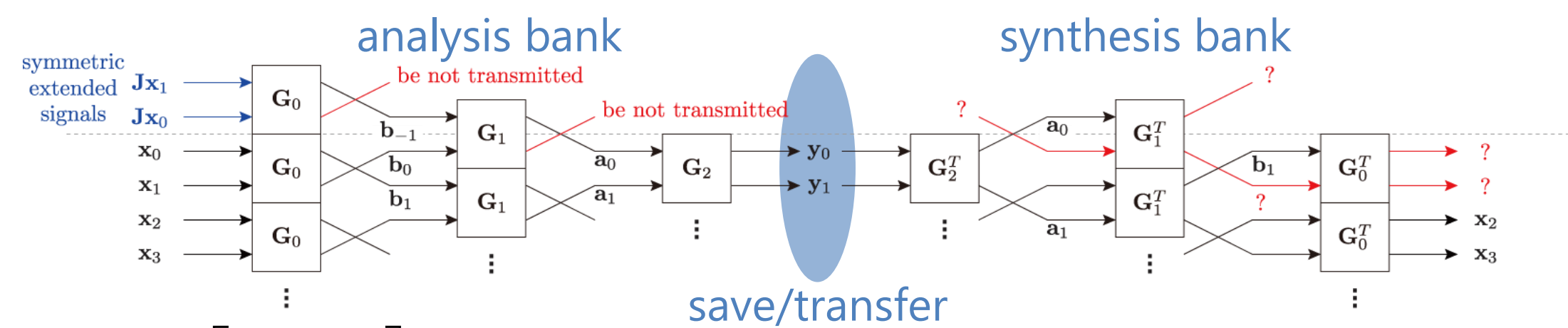
Boundary	Not	Upper	Lower
$C_{cg}$	8.3168	8.2852	8.3173

**All types of NLPPUFBs have almost same property.**

### Symmetric Extension (SE) for NLPPUFBs [9]

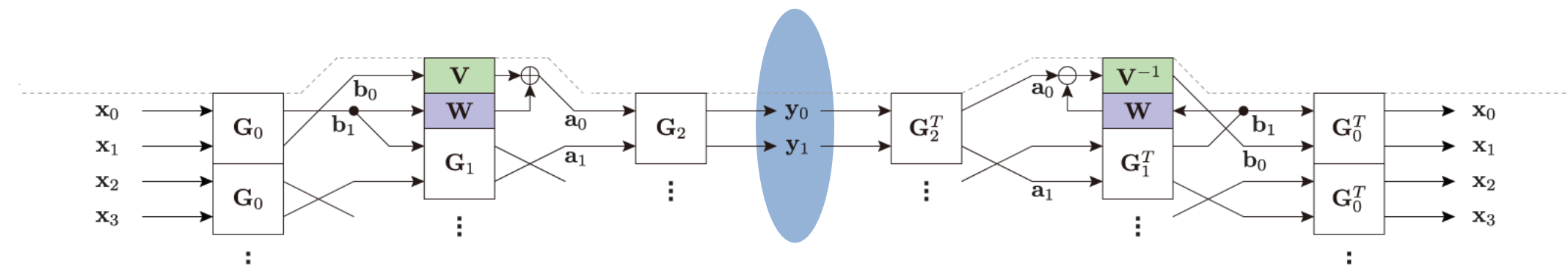
In lapped transforms such as NLPPUFBs, **\* periodic extension (PE) is not smooth**. a smooth nonexpansive convolution should be used at the boundaries not to increase the number of samples and achieve more efficient coding.

Upper boundary processing of NLPPUFBs (K=3) are as follows:



When  $\mathbf{G}_k = \begin{bmatrix} \mathbf{A}_k & \mathbf{B}_k \\ \mathbf{C}_k & \mathbf{D}_k \end{bmatrix}$  where each submatrix is  $M/2 \times M/2$ ,

by solving a simultaneous matrix equation, we obtain the following forms:



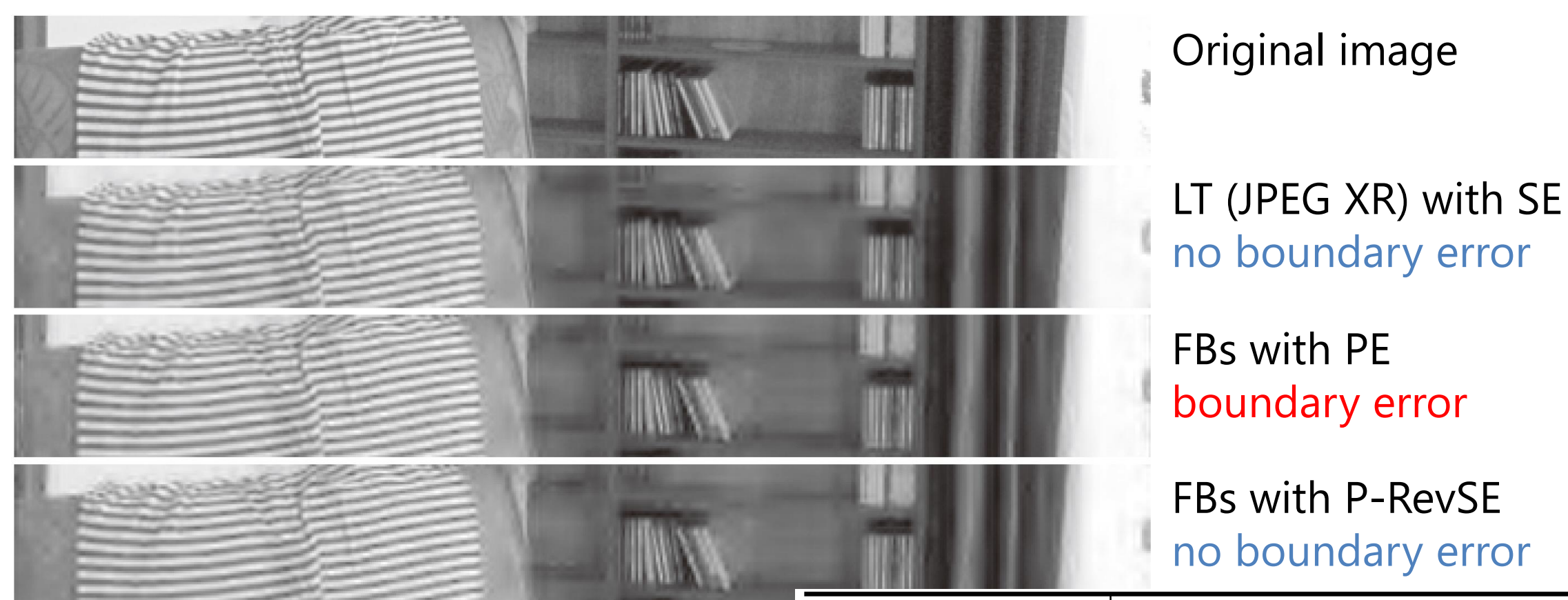
$$\mathbf{V} = \mathbf{A}_1(\mathbf{B}_2\mathbf{J}\mathbf{C}_2^T + \mathbf{A}_2\mathbf{J}\mathbf{D}_2^T) + \mathbf{B}_1 \quad \text{where } \det(\mathbf{V}) \neq 0$$

$$\mathbf{W} = \mathbf{A}_1(\mathbf{B}_2\mathbf{J}\mathbf{A}_2^T + \mathbf{A}_2\mathbf{J}\mathbf{B}_2^T)$$

$$\mathbf{J} = \begin{bmatrix} 0 & \dots & 0 & 1 \\ \vdots & \ddots & \vdots & \vdots \\ 0 & \dots & 1 & 0 \\ 1 & 0 & \dots & 0 \end{bmatrix}$$

Lower boundary case can be reconstructed in the same way as in the upper case.

## 3. Experimental Results



Particular area of Room (0.25[bpp]): top and bottom are NOT boundaries.

Lossy image coding results (PSNR [dB])

Lossless image coding results (lossless bitrate [bpp])

Test Images	LT [2] RevSE	L-NLPPUFBs PE	L-NLPPUFBs P-RevSE
Barbara	4.801	4.798	<b>4.775</b>
Boat	5.124	5.103	<b>5.093</b>
Elaine	5.166	5.132	<b>5.106</b>
Lena	<b>4.587</b>	4.615	<b>4.587</b>
Pepper	4.954	4.907	<b>4.897</b>
Room	<b>4.344</b>	4.452	4.427

Test Images	Bitrate [bpp]	L-NLPPUFBs		
		LT [2] RevSE	PE	P-RevSE
Barbara	0.25	26.569	27.436	<b>27.578</b>
	0.50	30.334	31.097	<b>31.234</b>
	1.00	34.952	35.601	<b>35.728</b>
Boat	0.25	27.261	28.129	<b>28.219</b>
	0.50	30.727	31.296	<b>31.371</b>
	1.00	34.213	34.758	<b>34.805</b>
Elaine	0.25	30.825	31.178	<b>31.381</b>
	0.50	32.502	32.876	<b>33.016</b>
	1.00	34.179	34.746	<b>34.894</b>
Lena	0.25	31.603	31.965	<b>32.251</b>
	0.50	35.024	35.300	<b>35.524</b>
	1.00	38.247	38.572	<b>38.708</b>
Pepper	0.25	31.026	31.078	<b>31.586</b>
	0.50	33.892	34.207	<b>34.328</b>
	1.00	35.428	36.200	<b>36.273</b>
Room	0.25	27.818	28.684	<b>29.048</b>
	0.50	32.715	32.838	<b>33.116</b>
	1.00	38.288	37.927	<b>38.407</b>

[2] C. Tu et al., "Low-complexity hierarchical lapped transform for lossy-to-lossless image coding in JPEG" SPIE, 2008.

[5] X. Gao et al., "On factorization of M-channel paraunitary filterbanks," IEEE TSP, 2001.

[9] Y. Tanaka et al., "A non-expansive convolution for nonlinear-phase paraunitary filter banks and its application to image coding," ACSSC, 2005.