



УНИВЕРЗИТЕТ У НОВОМ САДУ  
ФАКУЛТЕТ ТЕХНИЧКИХ НАУКА  
Одсек за рачунарску технику  
и рачунарске комуникације



Драгана Сандић-Станковић

**МУЛТИ-РЕЗОЛУЦИОНА МЕРА  
ЗА ОБЈЕКТИВНУ ОЦЕНУ КВАЛИТЕТА  
СИНТЕТИЗОВАНИХ СЛИКА  
ФТВ ВИДЕО СИГНАЛА**

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Нови Сад, 2016



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Abstract, <b>AB</b> :	The main contribution of this doctoral thesis is the development of algorithms for objective DIBR-synthesized view quality assessment. DIBR algorithms introduce nonuniform geometric distortions affecting the edge coherency in the synthesized images. The non-linear morphological filters used in multi-scale image decompositions of the proposed metric maintain important geometric information such as edges across different resolution levels. Calculating MSE pixel-by-pixel through subbands in which the edges are extracted, the difference of the two multiresolution representations, the reference and the synthesized image, is precisely measured. In that way the importance of edge areas which are prone to synthesis artifacts is emphasized in the image quality assessment. The proposed metric has very good agreement with human judgment.	
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	Member: Dr Irini Reljin, full professor	
	Member: Dr Miroslav Popovi , full professor	Menthor's sign
	Member: Dr Nikola Tesli , full professor	
	Member, entor: Dr Dragan Kukulj, full professor	

## Захвалница

(Short Term Scientific Mission, STSM) IRCCyN/IVC  
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Lab) 2013. -COST (European Cooperation in  
Science and Technology) Action IC1003 QUALINET (European Network on Quality of Experience  
in Multimedia Systems and Services). Patrick Le Callet  
STSM IRCCyN/IVC  
STSM IRCCyN/IVC

Marcus Barkowsky STSM  
VQEG (Video Quality Experts Group).  
STSM 2014 -COST  
Action IC1003 QUALINET.

Le Callet  
(Training School) 3D AudioVisual Content Processing and Communications  
(Iscte-Iul, Instituto Universitário De Lisboa)  
2015 -COST Action IC1105: 3D-ConTourNet (3D Content Creation,  
Coding and Transmission over Future Media Networks)  
3DTV  
COST Action IC1105 3D-ConTourNet 2016  
(Engineering Department at University of  
Roma TRE) 2016  
(Dept. of Information and Communication Systems Mid-Sweden  
University, Sundsvall, Sweden).

## Сажетак

3 (3 ) (Free-viewpoint TV)

MPEG (Moving Picture Experts Group).

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3

3

e e

Rendering)

(Depth-Image-Based-

3

/



3DswIM,

/ , PSNR, PSNR

e  
e, MP-PSNRr MW-PSNRr,

**Кључне речи:**

- / ,  
,  
,

## **Abstract**

3DV (3D video) is the second phase in the development of FTV (Free-viewpoint TV) standard implemented by MPEG (Moving Picture Experts Group). FTV is the most immersive visual media that enables the user to view a three-dimensional scene by freely changing viewpoints. In the 3DV standard, smaller number of captured views is transmitted and greater number of views is synthesized at the receiver side. Video sequences are generated using DIBR (Depth-Image-Based-Rendering) techniques which introduce new types of artefacts mostly located around the disoccluded regions. As the DIBR algorithms involve geometric transformations, most of them introduce nonuniform geometric distortions affecting the edge coherency in the synthesized images. Typical artefacts due to synthesis process are black holes, blurred edges, shifted edges or ghost edges.

The synthesized image quality is of great importance for the success of the 3D video applications. The common image quality assessment metrics, which are primarily designed for other types of distortions, don't handle efficiently the synthesis distortion. The metrics dedicated to synthesized image quality assessment show better performances in the quality assessment of synthesized views, but there is still room for improvement.

In order to better deal with specific geometric distortions in the DIBR synthesized images, full-reference metric based on multi-scale image decompositions using morphological filters is proposed in this thesis. Psychophysics and physiological experiments have shown that multiscale transforms seem to appear in the visual cortex of mammals. Introducing multiresolution decomposition of the reference and the synthesized images in the image quality assessment, better correlation of the objective metric's results to subjective results is achieved. The non-linear morphological filters used in the multi-scale image decomposition maintain important geometric information such as edges on their true positions, neither drifted nor blurred, across different resolution levels. Morphological multiresolution decomposition can be interpreted as structural image decomposition tending to enhance image features such as edges which are segregated by scale at the various resolution levels. Edge distortion between appropriate subbands of the multi-scale representations of the

reference image and the DIBR synthesized image is measured using Mean Squared Error (MSE) precisely pixel-by-pixel. In this way, areas around edges that are prone to synthesis artifacts are emphasized in the metric score. Subbands' mean squared errors are combined into multi-scale mean squared error, which is transformed into multi-scale peak signal-to-noise ratio measure.

Two versions of morphological multi-scale metric have been analysed: Morphological Pyramid Peak Signal-to-Noise Ratio (MP-PSNR) based on morphological pyramid decomposition, and Morphological Wavelet Peak Signal-to-Noise Ratio (MW-PSNR) based on morphological wavelet decomposition.

The performances of the proposed metrics are tested using three image/video databases which contain DIBR-synthesis artefacts. The used databases are the IRCCyN/IVCDIBR database which contains images synthesized using seven DIBR algorithms, the part of the MCL-3D database which contains stereoscopic images synthesized using four DIBR algorithms, and the Free-Viewpoint video database, FVSV, which contains video sequences with scroll through positions and with distortions due to synthesis process and depth maps compression. Proposed metrics achieve significantly higher correlation with human judgment compared to the state-of-the-art image quality metrics such as PSNR, SSIM, MS-SSIM and compared to the tested metric dedicated to synthesis-related artifacts, 3DswIM.

We have demonstrated that PSNR has particularly good agreement with human judgment when it is calculated between images at higher scales of morphological multi-scale representations. Consequently, simplified and in essence reduced versions of multi-scale metrics, MP-PSNR<sub>r</sub> and MW-PSNR<sub>r</sub>, are proposed, taking into account only detailed images at higher decomposition scales. The performances of reduced versions of the morphological multi-scale measure are improved comparing to their full versions.

Morphological operators used in the image multiresolution decomposition are computationally efficient since they involve only integer numbers and simple computations like a min, max and sum. The calculation of MSE by subbands is also computationally simple and the proposed metric is of low computational complexity.

**Keywords:** DIBR-synthesized View Quality Assessment, Multi-scale Image Quality Metric, Morphological multi-scale image decomposition, Morphological Pyramid, Morphological Wavelets

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		í ..	xv
		í í	xvii

# 1 УВОД

( , 4 /8 ), 1.1.

2

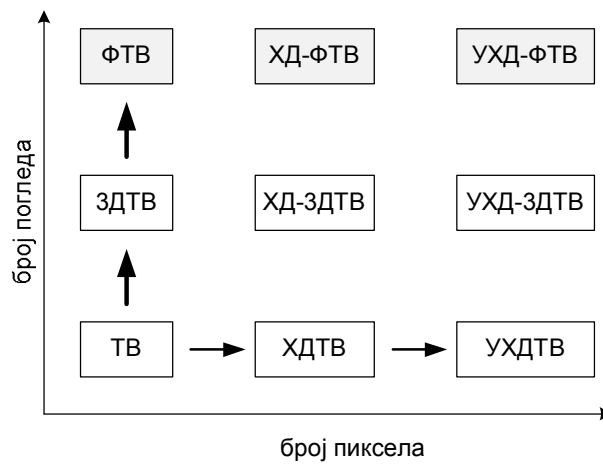
(3 )

3

3 - 3 3

viewpoint TV).

[1].



1.1.

## 1.1 Предмет истраживања

3

3

Depth, MVD) [2]. MVD

3

MVD (Multiview Video plus

(depth maps).

3

3

(depth maps)

(Depth Image Based Rendering)

[3].

Group) 2001.

3 [4].

MPEG (Moving Picture Experts

2004

2009

[5],

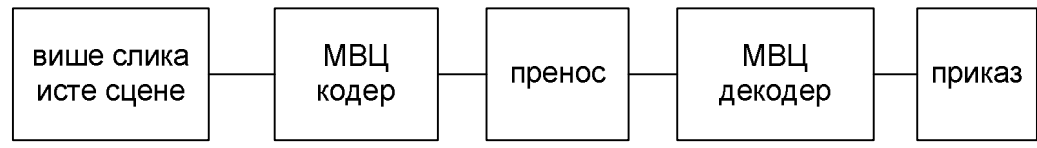
(Multi-view Video Coding, MVC),

H.264/MPEG-4 AVC (Advanced Video Coding).

1.2.

3

(multi-view)



1.2.

3 (3 )

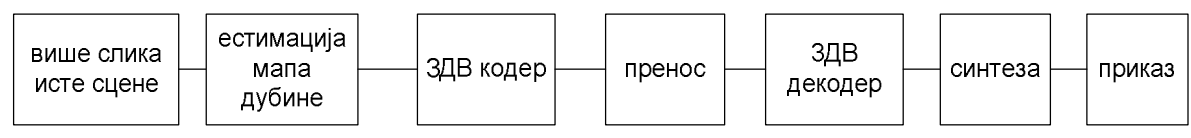
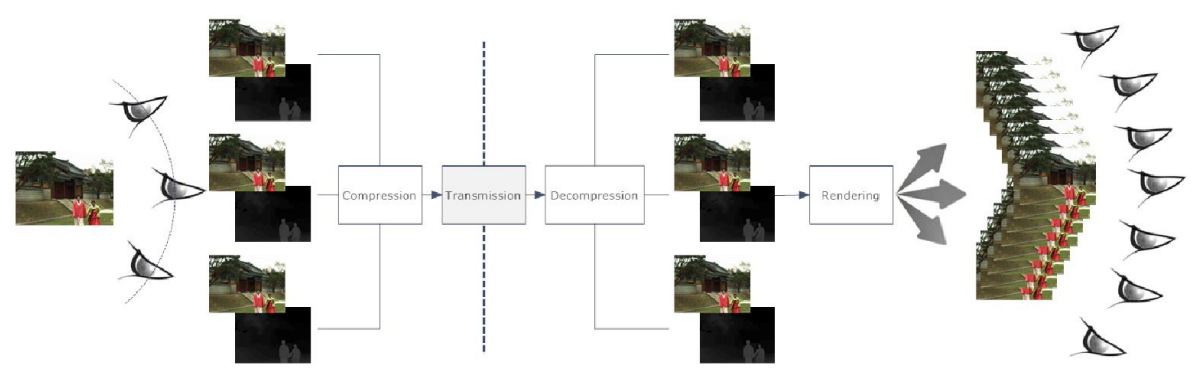
2007. 2014.

### MVD (Multi-View plus Depth)

[2].

MVD Efficiency Video Coding) [7]. 3      3D-AVC [6]      3D-HEVC (High Efficiency Video Coding) [2].

1.3.



1.3.3

3

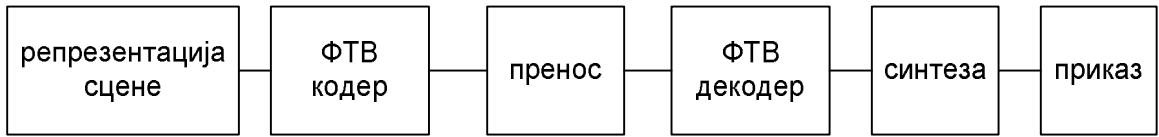
MVD

( )

3 3 (3  
 , 3 , 3 )  
 ( , , , )

2013. 3D super multiview  
 (free navigation).  
 1.4. - 3D super multiview . 3D Super  
 multiview -

3 ,  
 3D super multiview ,  
 ( 80 ).



1.4. ( )

2022.  
 3



( )

( )

3

3

2

( )

( )

(cracks)

õ

õ. õ

õ

(

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(

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õ

õ õ.

a



1.5. ( )

. ( )

š õ ( )

š õ.

15

, ð ð .  
 ( ) (blend)  
 š ð .  
 3 .  
 ,  
 ð ö.  
 ,  
 (inpainting algorithms)  
 š ð.  
 ð ö,  
 ,  
 (resized). ð ð  
 (blurry)  
 . 1.5  
 š ð.  
 [13].

## 1.2 Циль истраживања

3 . /  
 3  
 /  
 3 3 ,  
 , 3 , (

)

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/

.

/

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/

3

(Quality of Experience, QoE)

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3

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2 / 3

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/

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/

.

### 1.3 Допринос истраживања

[16].

[16].

[17].

: Morphological Pyramid Peak Signal-to-Noise Ratio, MP-PSNR [18], [19]  
[20] Morphological Wavelet Peak Signal-to-Noise Ratio, MW-PSNR [18], [21]

[22].

õquincunxõ

, MP-PSNR MW-PSNR,

PSNR

PSNR

PSNR

PSNR

[18], [21], [23].

, MP-PSNRr [18], [23] MW-PSNRr [18], [21]

3

[24].

## 1.4 Организација дисертације

## 2 ПРЕГЛЕД МЕТРИКА ЗА ОЦЕНУ КВАЛИТЕТА ДИБР СИНТЕТИЗОВАНИХ СЛИКА/ВИДЕА

õ ö. 2 [14]

[25]. 2 2

[26]. 50%

2 / [15]. ,

/ ,

(illumination)

PSNR

( )

[27]

VSQA (View Synthesis Quality Assessment)

[28].

3

2

VSQA-SSIM

SSIM.

[25]

61.42%

17.8%

SSIM

3DSwIM (3D Synthesized view Image Quality Metric)

[29].

õ

õ

76.17%  
[25].

/ MVD  
3 [30].

PSNR

2

[31]

[32].

49

2

2

[32]

[33].

(wavelets)

( )

(blend)

( )

3

: HEVC, H264

JPEG2000.

/

[15].

[34].

SSIM.  
(block-matching) x- . , 2

MPEG MVD , , . 42

CSED (Color and Sharpness of Edge Distortion) [35]

3 ã ö.  
SVD (Single View Video)

3 [36].

MPEG.

HEVC .  
H.264/ VC

[37].

(intra frame, inter frame).

30%

PSNR SSIM

[38].

VQM

PSNR SSIM.

3 (3D Video Quality Measure, 3VQM)

[39].

DIBR

: (temporal outliers) (spatial outliers)

, ( )

(temporal inconsistencies)

, , 3VQM. PSNR  
SSIM.

3  
/

[40].

( ),

( ).

. SSIM

### 3 МУЛТИРЕЗОЛУЦИОНА РЕПРЕЗЕНТАЦИЈА СЛИКЕ

( ) [41].

( )

[42].

/

#### 3.1 ПРЕГЛЕД МУЛТИРЕЗОЛУЦИОНИХ МЕТРИКА ЗА ОЦЕНУ КВАЛИТЕТА СЛИКА

Similarity) [43]

MS-SSIM (Multi-scale Structural Similarity) [44]

MS-SSIM

SSIM

MS-SSIM.

S-PSNR [45].

2x2

MS-SSIM.

a

MSE MSE S-PSNR LIVE3D

PSNR SSIM MS-SSIM

(Information content Weighted Structural Similarity, IW-SSIM, Information content Weighted Peak Signal-to-Noise Ratio, IW-PSNR) [46]

[44]

IW-SSIM,

IW-PSNR.

( IW-SSIM MS-SSIM 0.3% - 4.3 %).

PSNR

(IW-PSNR 5.1% - 26.2% PSNR).

DoG)

[47].

(difference of Gaussian,

( )

( ).

[48].

[49].

PSNR. PSNR

PSNR

PSNR

### 3.2 ОПШТЕ ШЕМЕ МУЛТИРЕЗОЛУЦИОНЕ ДЕКОМПОЗИЦИЈЕ СЛИКЕ

(wavelets).

#### 3.2.1 Редундантна мултирезолуциона репрезентација слике

3.1.1. , [20],

$$s_{j+1} = \Psi_j^\uparrow(s_j)$$

$$\Psi_j^\downarrow(s_{j+1}) = \check{s}_j \cdot V_j$$

$s_j$

$$\Psi_j^\uparrow : V_j \rightarrow V_{j+1},$$

$$\Psi_j^\downarrow : V_{j+1} \rightarrow V_j,$$

$j, s_j$

$j$

$s_j$

$$\check{s}_j = \Psi_j^\downarrow \Psi_j^\uparrow(s_j) \in \check{V}_j.$$

$$d_j = s_j - \check{s}_j \in Y_j$$

$s_j$

$\check{s}_j,$

$Y_j$

$j.$

$$, \Psi_j^\uparrow \Psi_j^\downarrow = id , \quad id$$

M :

$$x \rightarrow (d_0, s_1) \rightarrow (d_0, d_1, s_2) \rightarrow \dots \rightarrow (d_0, d_1, \dots, d_{j-1}, s_j) \rightarrow \dots \rightarrow (d_0, d_1, \dots, d_{M-1}, s_M) \quad (3.1)$$

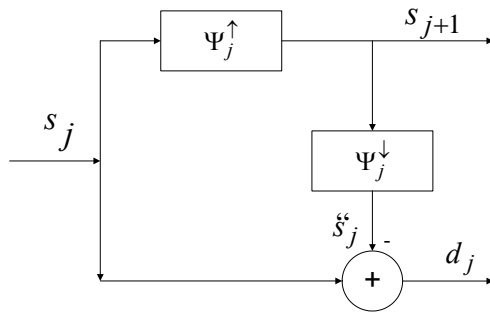
,  $x$

$$\{s_1, s_2, \dots, s_M\}$$

$$(\quad) \{d_0, d_1, \dots, d_{M-1}\} .$$

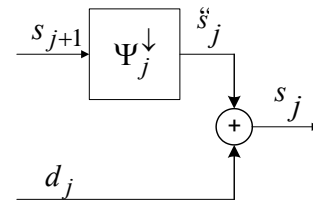
$$s_0 = x \in V_0, \quad s_{j+1} = \Psi_j^\uparrow(s_j) \in V_{j+1}, \quad 0 \leq j \leq M-1 \quad (3.2)$$

$$d_j = s_j - \Psi_j^\downarrow(s_{j+1}) \in Y_j \quad (3.3)$$



( )

. 3.1.1



( )

: (a)

; ( )

$x$   $d_j, j=0,$   
 $1, \dots, M-1$   $s_M$

. 3.1.1.

$s_{j+1}$

$d_j$ .

$s_j$

$d_j$

$s_{j+1}$ :

$$s_j = \Psi_j^\downarrow(s_{j+1}) + d_j, \quad M-1 \geq j \geq 0, \quad x = s_0 \quad (3.4)$$

[50].

[44].

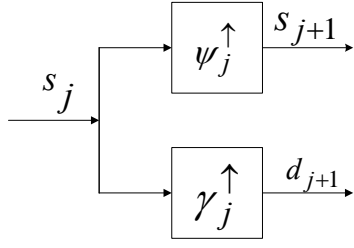
[50].

[51].

### 3.2.2 Передундантна мултирезолуциона репрезентација слике

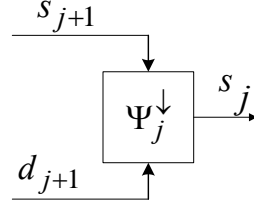
[22]

3.2.1. .

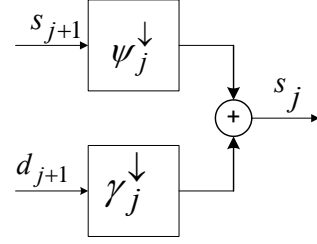


( )

3.2.1.



( )



( )

: (a)

( )

( )

$$\psi_j^\uparrow : V_j \rightarrow V_{j+1} \quad (V_j)$$

$j)$   $s_j$

$$s_{j+1} = \psi_j^\uparrow(s_j).$$

$$\gamma_j^\uparrow : V_j \rightarrow Y_{j+1} \quad (Y_j)$$

$j)$

$$, d_{j+1} = \gamma_j^\uparrow(s_j).$$

M

:

$$x \rightarrow (d_1, s_1) \rightarrow (d_1, d_2, s_2) \rightarrow \dots \rightarrow (d_1, d_2, \dots, d_j, s_j) \rightarrow \dots \rightarrow (d_1, d_2, \dots, d_M, s_M) \quad (3.5)$$

:

$$s_0 = x \in V_0, \quad s_{j+1} = \psi_j^\uparrow(s_j) \in V_{j+1}, \quad 0 \leq j \leq M-1 \quad (3.6)$$

$$d_{j+1} = \gamma_j^\uparrow(s_j) \in Y_{j+1} \quad (3.7)$$

[22].

$\Psi_j^\downarrow$ 

3.2.1. . :

$$\Psi_j^\downarrow(\psi_j^\uparrow(s), \gamma_j^\uparrow(s)) = s, \quad s \in V_j, \quad \Psi_j^\downarrow: V_{j+1} \times Y_{j+1} \rightarrow V_j \quad (3.8)$$

, :

$$\psi_j^\uparrow(\Psi_j^\downarrow(s, d)) = s, \quad s \in V_{j+1}, d \in Y_{j+1} \quad (3.9)$$

$$\gamma_j^\uparrow(\Psi_j^\downarrow(s, d)) = d, \quad s \in V_{j+1}, d \in Y_{j+1} \quad (3.10)$$

 $x$  :

$$s_j = \Psi_j^\downarrow(s_{j+1}, d_{j+1}), \quad M-1 \geq j \geq 0, \quad x = s_0 \quad (3.11)$$

, 3.2.1. ,

[22].

 $\psi_j^\downarrow$ 

$$: V_{j+1} \rightarrow V_j, \quad \psi_j^\downarrow(s_{j+1}) = \check{s}_j \quad \gamma_j^\downarrow: Y_{j+1} \rightarrow V_j, \quad \gamma_j^\downarrow(d_{j+1}) = \check{d}_j$$

:

$$\Psi_j^\downarrow(s_{j+1}, d_{j+1}) = \psi_j^\downarrow(s_{j+1}) + \gamma_j^\downarrow(d_{j+1}) \quad (3.12)$$

,

:

$$\psi_j^\downarrow \psi_j^\uparrow(s) + \gamma_j^\downarrow \gamma_j^\uparrow(s) = s, \quad \forall s \in V_j \quad (3.13)$$

 $x$  :

$$s_j = \psi_j^\downarrow(s_{j+1}) + \gamma_j^\downarrow(d_{j+1}), \quad M-1 \geq j \geq 0, \quad x = s_0 \quad (3.14)$$

:

$$\psi_j^\uparrow(\psi_j^\downarrow(s) + \gamma_j^\downarrow(d)) = s, \quad s \in V_{j+1}, d \in Y_{j+1} \quad (3.15)$$

$$\gamma_j^\uparrow(\psi_j^\downarrow(s) + \gamma_j^\downarrow(d)) = d, \quad s \in V_{j+1}, d \in Y_{j+1} \quad (3.16)$$

$$x \in V_0 \quad (d_1, d_2, \dots, d_M, s_M)$$

(wavelet transformation).

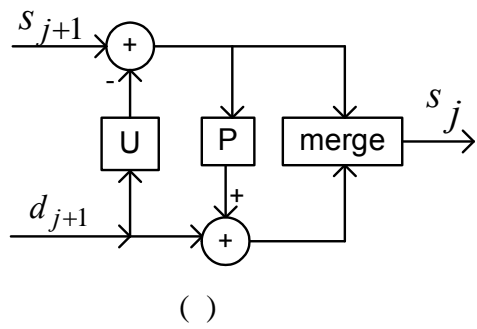
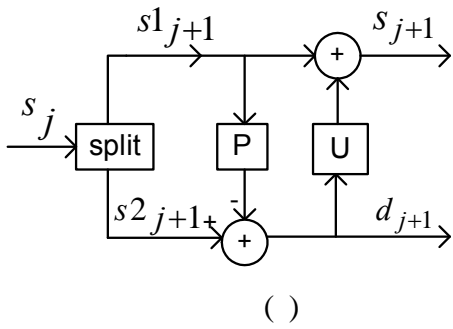
$j$   
 $j+1$

### Лифтинг шема

[52]

[53].

[52].



3.2.2

: (split), (predict, P) (update, U).  
 ( ) ( ) , .

3.2.2. , 3 : (split), (predict, P) (update, U).  
 $s_j$   $s1_{j+1}$   $s2_{j+1}$   
 $j+1$ :

$$(s1_{j+1}, s2_{j+1}) = split(s_j) \tag{3.17}$$

$s1_{j+1}$   $s2_{j+1}$  ,  
 ( ) . ( )  $d_{j+1}$   
 :

$$d_{j+1} = s2_{j+1} - P(s1_{j+1}) \tag{3.18}$$

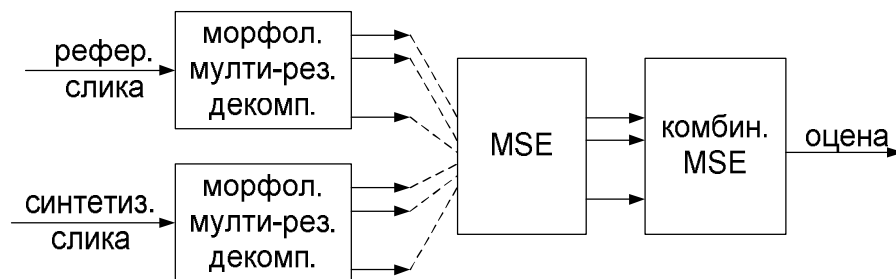
, (update)  $s1_{j+1}$

$s_{j+1}$  :

$$s_{j+1} = s1_{j+1} + U(d_{j+1}) \tag{3.19}$$

, 3.2.2. .

#### 4 ПРЕДЛОЖЕНА МУЛТИ-РЕЗОЛУЦИОНА МЕТРИКА ЗА ОЦЕНУ КВАЛИТЕТА ДИБР-СИНТЕТИЗОВАНИХ СЛИКА



4.1.

õquincunxõ

, 4.1.

#### 4.1 МУЛТИРЕЗОЛУЦИОНА ДЕКОМПОЗИЦИЈА СЛИКЕ ПРИМЕНОМ МОРФОЛОШКИХ ОПЕРАТОРА

( )

[55].

[56], [57].

/

( )

( , , )

)

(gray scale) [58].

$f$  (SE),

$$D : \text{dilation}_{SE}(f)(x) = \max_{y \in SE} f(x - y) \quad (4.1)$$

$$E : \text{erosion}_{SE}(f)(x) = \min_{y \in SE} f(x + y) \quad (4.2)$$

#### 4.1.1 ПИРАМИДАЛНА ДЕКОМПОЗИЦИЈА СЛИКЕ ПРИМЕНОМ МОРФОЛОШКИХ ОПЕРАТОРА

[16]

3.1.1a,

[20]:

( )

(D)

$\Psi_j^\uparrow$

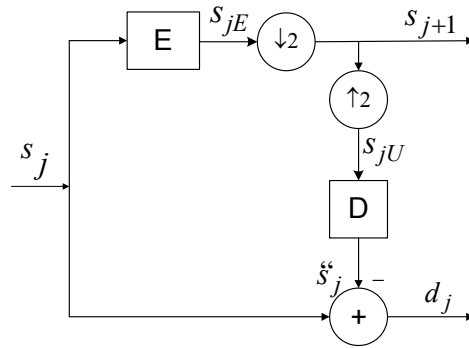
$\Psi_j^\downarrow$

[20]

4.1.1.

3

[59].



4.1.1.

: E , D

$s_{j+1}$

$s_j$

2

$\delta^\downarrow$ .

$(2r + 1) \times (2r + 1)$

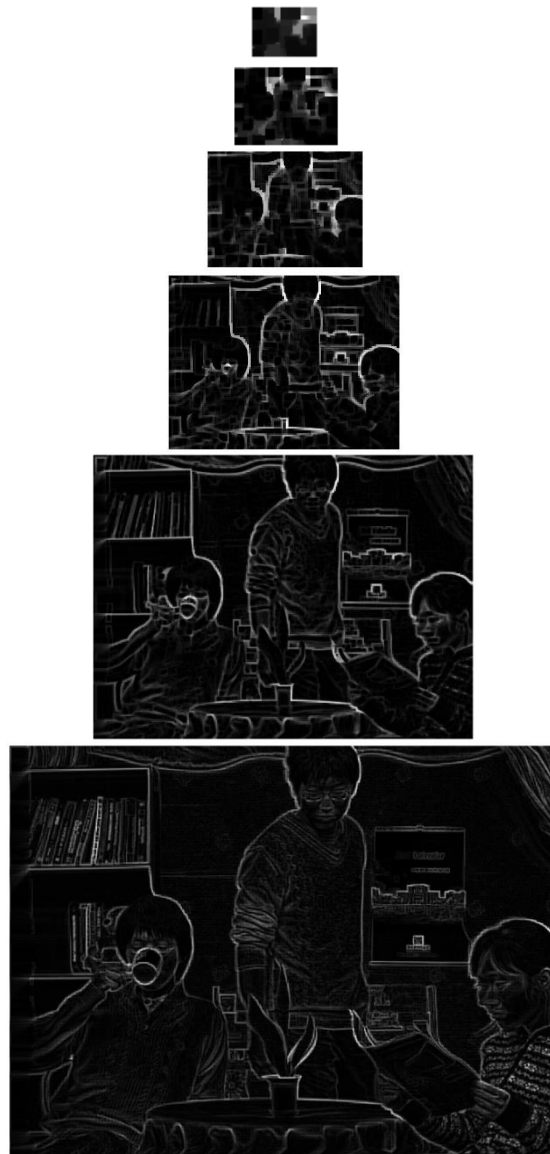
$s_{j+1}$

:

$$s_{jE}(m,n) = \min \{ s_j(m+k, n+l), \mid -r \leq k, l \leq r \}$$

$$s_{j+1} = \delta^\downarrow(s_{jE}) \tag{4.3}$$





4.1.2.

Newspaper.

7x7.

#### 4.1.2 ДЕКОМПОЗИЦИЈА СЛИКЕ МОРФОЛОШКИМ ТАЛАСИЋИМА

MW-PSNR

minHaar minLift  
õquincunxõ minLiftQ.

[53].

[22].

[22].

[60]

õdigital

watermarkingõ [61].

### Сепарабилна декомпозиција слике таласићима

$d_{i+1,1}, d_{i+1,2}, d_{i+1,3}$

$s_{i+1},$  4.1.3,

(dyadic decomposition).

3.2.2a

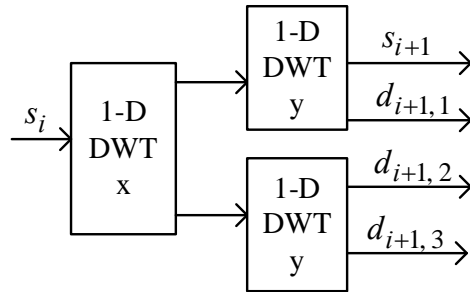
(prediction, P)

(update, U)

(lazy

transform)

(split)



4.1.3.

, minHaar minLift,  
MW-PSNR

(Haar wavelet) cdf (2,2).

- 1-D трансформација морфолошким Харовим таласићем (minHaar)

, minHaar [22].

(update, U)

( ) :

,  $d_{j+1}$   $s_{j+1}$

[62]:

$$d_{j+1}[n] = s_j[2n+1] - s_j[2n],$$

$$s_{j+1}[n] = s_j[2n] + \min(0, d_{j+1}[n]) \tag{4.5}$$

[22]. je (gray-shift invariant) (gray-multiplication invariant) [61].

- 1D Харов таласић (Haar)

. [53],

. (update, U)

. ,  $d_{j+1}$

$s_{j+1}$  :

$$d_{j+1}[n] = s_j[2n+1] - s_j[2n],$$

$$s_{j+1}[n] = s_j[2n] + \frac{1}{2}d_{j+1}[n] \tag{4.6}$$

#### 4.1.4.

$s_j$

$d_{j+1}$

)

$s_j$

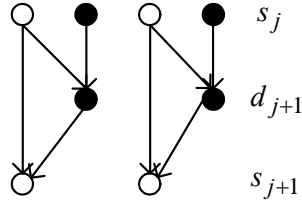
(

)

(2

,

$s_j$   $d_{j+1}$



4.1.4.

$s_j$

$d_{j+1}$

$s_{j+1}$

- 1D декомпозиција морфолошким таласићем (*minLift*)

*minLift*

(P)

(U)

[63], [22].

(update)

$$d_{j+1}[n] = s_j[2n+1] - \min(s_j[2n], s_j[2n+2])$$

$$s_{j+1}[n] = s_j[2n] + \min(0, d_{j+1}[n-1], d_{j+1}[n]) \quad (4.7)$$

*minLift*

[22].

*minLift*

(gray-shift invariant)

(gray-multiplication invariant) [62].

Newspaper

minLift

4.1.5.

( ).



4.1.5.

Newspaper

minLift

:

- *Линеарни таласић cdf (2,2)*

, Cohen-Daubechies-Feauveau, cdf(2,2),

[53]

minLift.

(update)

cdf(2,2)

$d_{j+1}$

$s_{j+1}$

:

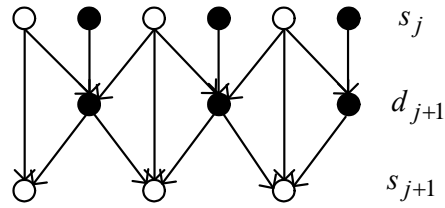
$$d_{j+1}[n] = s_j[2n+1] - \frac{1}{2}(s_j[2n] + s_j[2n+2])$$

$$s_{j+1}[n] = s_j[2n] + \frac{1}{4}(d_{j+1}[n-1] + d_{j+1}[n]) \tag{4.8}$$

minLift

4.1.6.

cdf(2,2)



4.1.6.

$s_j$

$d_{j+1}$

$s_{j+1}$

minLift

cdf(2,2)

$s_j$

( )

( )

,

$d_{j+1}$

3

,  $s_j$ ,

$$s_j, s_{j+1}, d_{j+1},$$

**Несепарабилна декомпозиција таласићима на “quincunx” решетки**

[64]. 2  
1

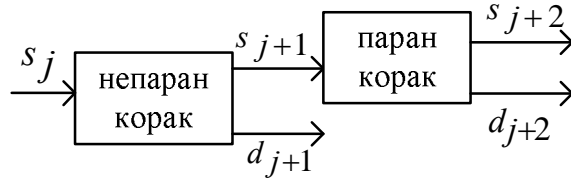
,

[65].  $\tilde{\text{quincunx}}$  (  $\tilde{\text{quincunx}}$  ,

$\sqrt{2}$  .  
 $\tilde{\text{quincunx}}$  ,

$\tilde{\text{quincunx}}$  MW-PSNR  
 $\tilde{\text{quincunx}}$

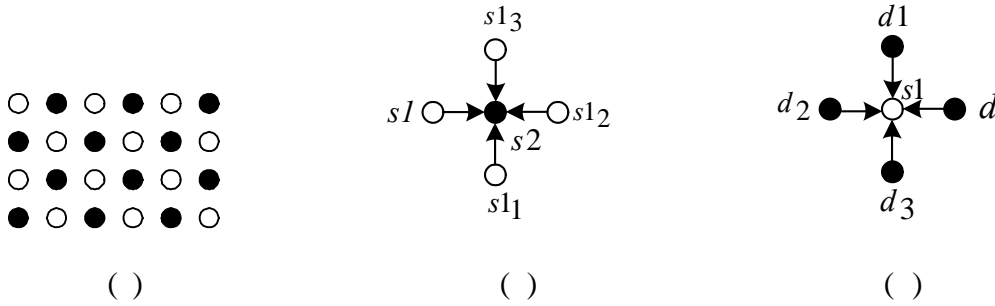
2  $\tilde{\text{quincunx}}$   
 , 4.1.7.



4.1.7.

õquincunõ

3.2.2 .



4.1.8.

a)

Cartesian

, õquincunõ )

4 )

4

,  $s_j$  (split) 2

,  $(s_{1j+1}, s_{2j+1}) = split(s_j)$  õquincunõ ,  $s_{1j+1}$

$s_{2j+1}$  , 4.1.8. .

4

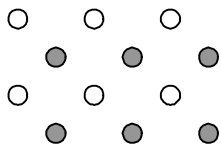
4.1.8 .

$d_{j+1}$

$$, d = s_2 - P(s_1, s_{1_1}, s_{1_2}, s_{1_3}).$$

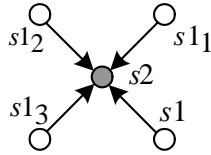
$$s_{1_{j+1}} \quad ( \quad ) \quad 4 \quad ( \quad )$$

$$, s = s_1 + U(d, d_1, d_2, d_3) \quad 4.1.8. \quad s_{j+1}$$

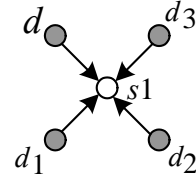


( )

4.1.9.



( )



( )

õquincunxõ

quincinx

a)

, Cartesian )

4

)

4

$s_{j+1}$

õquincunxõ

,  $s_{1_{j+2}}$   $s_{2_{j+2}}$

4.1.9.a,

Cartesian

$s_{2_{j+2}}$

4

$s_{1_{j+2}}$

, 4.1.9 .

$d_{j+2}$

$s_{1_{j+2}}$  ( )

4

, 4.1.9. ,

$s_{j+2}$  .

- Несепарабилна нелинеарна декомпозиција слике са “quincunx” узорковањем морфолошким таласићем  $minLiftQ$

$minLiftQ$        $\tilde{quincunx\tilde{o}}$

$minLift$       [22], [66].

$\tilde{quincunx\tilde{o}}$       ,      4.1.8 .

4      ,      4.1.8. .

(4.9).

4      (4.10),      4.1.8. .

Cartesian      ,      4

4.1.9 .

(4.9).

( )      4

4.1.9 ,      [62].

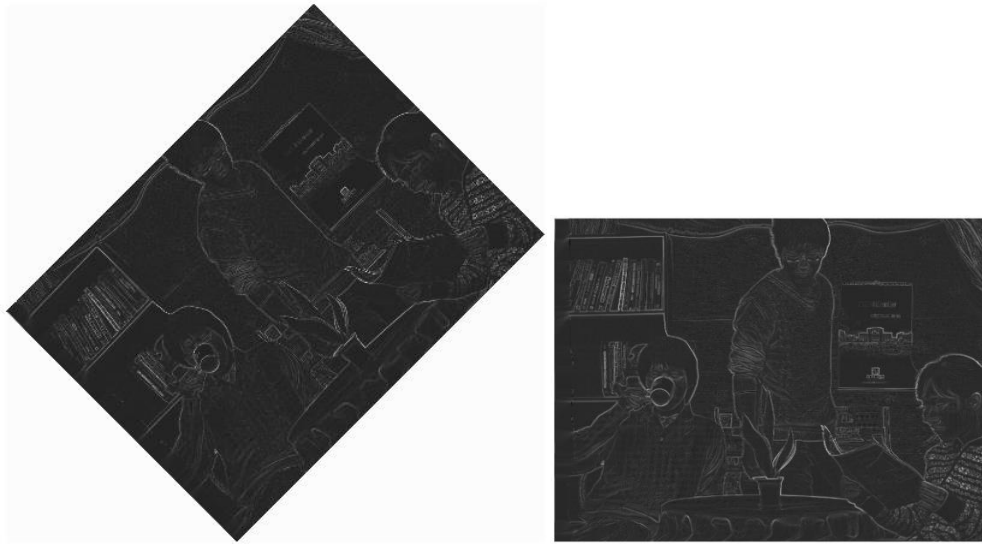
$$d = s2 - \min(s1, s1_1, s1_2, s1_3) \tag{4.9}$$

$$s = s1 + \min(d, d_1, d_2, d_3, 0) \tag{4.10}$$

Newspaper       $\tilde{quincunx\tilde{o}}$

$minLiftQ$       4.1.10.

45°      .      ( )



4.1.10.

Newspaper

õquincunxõ

minLiftQ.

45°.

- Несепарабилна линеарна декомпозиција слике са “quincunx” узорковањем таласићем  $cdfQ(2,2)$

õquincunxõ  
cdf(2,2)

cdf(2,2)Q [67]

2

4.1.8 ,

(4.11).

4.1.8. .

4.1.8. , (4.12).

$$d = s_2 - \frac{1}{4}(s_1 + s_{11} + s_{12} + s_{13}) \quad (4.11)$$

$$s = s_1 + \frac{1}{8}(d + d_1 + d_2 + d_3) \quad (4.12)$$

2

4.1.9. .

4

4.1.9. .

(4.11).

4

4.1.9. ,

(4.12).

## 4.2 ИЗРАЧУНАВАЊЕ ДИСТОРЗИЈЕ

(Mean Squared Error), MSE,

(Peak Signal-to-Noise Ratio), PSNR,

. MSE

ó

. MSE

MSE PSNR [68].

MSE

MSE

### 4.2.1 Израчунавање MP-PSNR

MP-PSNR

4.2.1.

$$MSE_j = \frac{1}{N_j \cdot K_j} \sum_{k=1}^{K_j} \sum_{n=1}^{N_j} (x_{R_j}(k,n) - x_{D_j}(k,n))^2 \quad (4.13)$$

MP-MSE

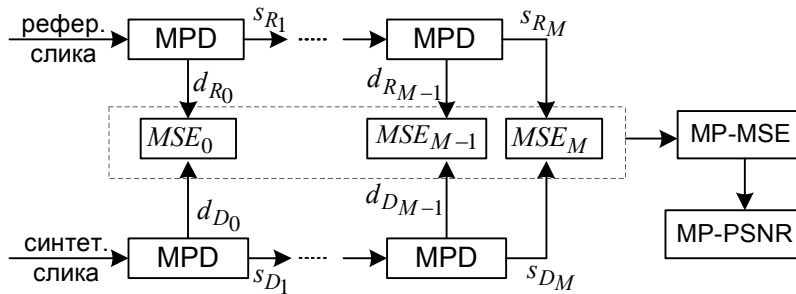
$$\beta_j = \frac{1}{M+1}$$

$$MP\_MSE = \prod_{j=0}^M [MSE_j]^{\beta_j} \quad (4.14)$$

R, MP-MSE

MP-PSNR:

$$MP\_PSNR = 10 \cdot \log_{10} \left( \frac{R^2}{MP\_MSE} \right) \quad (4.15)$$

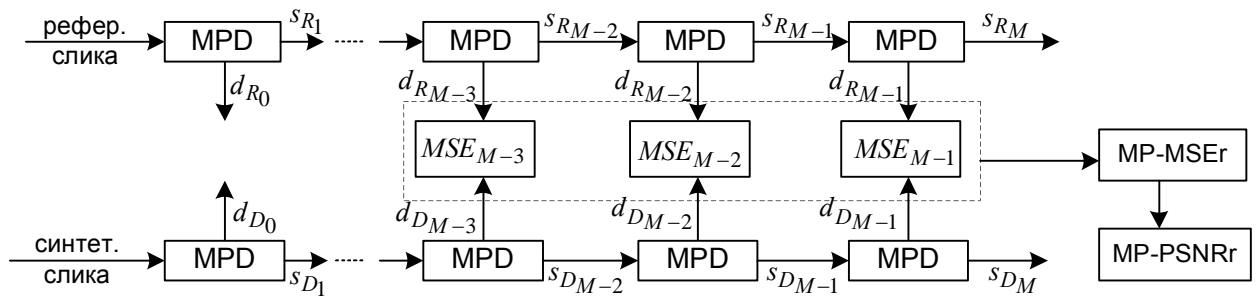


4.2.1. MP-PSNR  $MSE_j$  :

MPD-

MP-PSNRr

, 4.2.2.



4.2.2.

MP-PSNRr

$MSE_j$

: MPD-

MP-MSEr

$$\beta_j = \frac{1}{M_r}, \quad M_r$$

, 4.2.2.

$$MP\_MSEr = \sum_j \beta_j \cdot MSE_j \tag{4.16}$$

$$MP\_PSNRr = 10 \cdot \log_{10} \left( \frac{R^2}{MP\_MSEr} \right) \tag{4.17}$$

#### 4.2.2 Израчунавање MW-PSNR

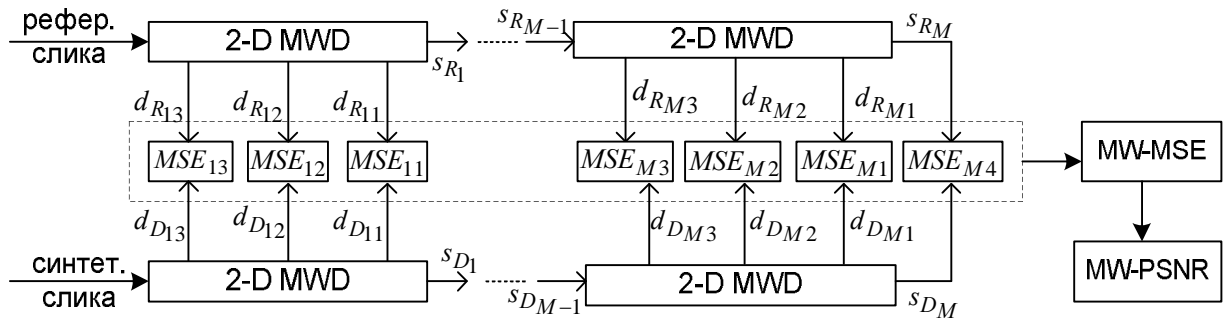
MW-PSNR

4.2.3.

$$MSE_{ji}, \quad i$$

$j$ .

$$MSE_{j,i} = \frac{1}{N_j \cdot K_j} \sum_{k=1}^{K_j} \sum_{n=1}^{N_j} (x_{R,j,i}(k,n) - x_{D,j,i}(k,n))^2 \tag{4.18}$$



4.2.3.

MW-PSNR

$MSE_{ji}$

$i$

$j$

2-D MWD

, MW-MSE,

$$\beta_{ji} = \frac{1}{M \cdot D + 1},$$

(

D

D=3,

D=2).

$$MW - MSE = MSE_{M,D+1} \cdot \beta_{M,D+1} + \sum_{j=1}^M \sum_{i=1}^D MSE_{j,i} \cdot \beta_{j,i} \quad (4.19)$$

R, MW-MSE

MW-PSNR:

$$MW - PSNR = 10 \cdot \log_{10} \left( \frac{R^2}{MW - MSE} \right) \quad (4.20)$$

, MW-PSNRr,

:

$$MW - MSE_r = \sum_j \sum_i MSE_{ji} \cdot \beta_{ji} \tag{4.21}$$

$$\beta_{ji} = \frac{1}{M_r}$$

e.

$$MW - PSNR_r = 10 \cdot \log_{10} \left( \frac{R^2}{MW - MSE_r} \right) \tag{4.22}$$

### 4.3 РАЧУНСКА КОМПЛЕКСНОСТ ПРЕДЛОЖЕНЕ МЕТРИКЕ

MSE (1, 1, 1, MP-PSNR, MW-PSNR, .

#### 4.3.1 Сложеност израчунавања MP-PSNR

, P×1, P=2, 3, 5, 7, 9, 11, 13. NK (comparisons, C). (subtraction, S)

d<sub>1</sub>, 4.1.1.

$$(3 \cdot (P-1) \cdot C + S) \cdot NK$$

ED L :

$$(3 \cdot (P-1) \cdot C + S) \cdot NK \cdot \left(1 + \frac{1}{2^2} + \frac{1}{2^4} + \dots + \frac{1}{2^{2(L-1)}}\right) =$$

$$(3 \cdot (P-1) \cdot C + S) \cdot \frac{4}{3} NK, \quad L \rightarrow \infty \tag{4.23}$$

ED

SE

4.3.1.

4.3.1.

/

L

1xP

Px1

(S)

(C).

P (SE)	L	
2	6	$(3 \cdot C + S) \cdot \frac{1365}{1024} NK$
3	5	$(6 \cdot C + S) \cdot \frac{341}{256} NK$
5	5	$(12 \cdot C + S) \cdot \frac{341}{256} NK$
7	5	$(18 \cdot C + S) \cdot \frac{341}{256} NK$
9	4	$(24 \cdot C + S) \cdot \frac{85}{64} NK$
11	4	$(30 \cdot C + S) \cdot \frac{85}{64} NK$
13	4	$(36 \cdot C + S) \cdot \frac{85}{64} NK$

MSE

MP-PSNR

MP-PSNRr

4.3.2.

MP-PSNRr

MP-PSNR

MSE

MSE

4.3.2.

MSE

MP-PSNR

MP-PSNRr.

L

SE

PxP. MSE

(S),

(M)

(A).

P (SE)	L	MSE
MP-PSNR		
2	6	$(S + M + A) \frac{1365}{1024} NK$
3	5	$(S + M + A) \frac{341}{256} NK$
5	5	
7	5	
9	4	$(S + M + A) \frac{85}{64} NK$
11	4	
13	4	
MP-PSNRr		
2	4-6	$(S + M + A) \frac{21}{1024} NK$
3	3-5	$(S + M + A) \frac{21}{256} NK$
5	<b>3-5</b>	
7	3-5	
9	2-4	$(S + M + A) \frac{21}{64} NK$
11	2-4	
13	2-4	

### 4.3.2 Сложеност израчунавања MW-PSNR

$NK$

4.3.3.

minHaar

minLift

3

MW-PSNR

MSE

$$(S + M + A)NK.$$

$NK.$

4.3.3.

(S, C, A, M)

	minHaar	$(S + C + A) \cdot \frac{4}{3} NK$
	Haar	$(S + M + A) \cdot \frac{4}{3} NK$
	minLift	$(3C + S + A) \cdot \frac{4}{3} NK$
	cdf(2,2)	$(3A + 2M + S) \cdot \frac{4}{3} NK$
	minLiftQ	$(7C + S + A) \cdot 2NK$
	cdf(2,2)Q	$(7A + 2M + S) \cdot 2NK$

## 5 РЕЗУЛТАТИ

:  
 , IRCCyN/IVCDIBR,  
 , MCL-3D,  
 , FVSV,

### 5.1 МЕРЕ ЗА ПОРЕЂЕЊЕ ПЕРФОРМАНСИ ОБЈЕКТИВНИХ МЕТРИКА ЗА ОЦЕНУ КВАЛИТЕТА СЛИКА

/ .  
 /

DMOS (Differential Mean Opinion Score).

( ).

(Mean Opinion Score)

/ MOS(r), /  
 MOS(d), DMOS(d) /

[70]:

$$DMOS(d) = MOS(d) - MOS(r) + 5 \quad (5.1)$$

DMOS / .

DMOS 1 5

MOS .

[70].

Q

$DMOS_p$  :

$$DMOS_p(Q) = aQ^3 + bQ^2 + cQ + d \tag{5.2}$$

$a, b, c, d$

DMOS MOS

VQEG HDTV [70].

: (Root Mean Squared Error, RMSE)

(Pearson's Correlation Coefficient, PCC)

(Spearman's correlation coefficient, SCC).

(Root Mean Squared Error, RMSE)

DMOS

$DMOS_p$

N

:

$$RMSE = \sqrt{\frac{1}{N-d} \sum_{i=1}^N (DMOS_{p_i} - DMOS_i)^2} \tag{5.3}$$

$d$

( $d=4$ )

).

(PCC)

$$PCC = \frac{\sum_{i=1}^N (DMOS_i - \overline{DMOS}) * (DMOS_{p_i} - \overline{DMOS}_p)}{\sqrt{\sum_{i=1}^N (DMOS_i - \overline{DMOS})^2} * \sqrt{\sum_{i=1}^N (DMOS_{p_i} - \overline{DMOS}_p)^2}}$$

(5.4)

[-1, 1].

(SCC)

$$SCC = 1 - \frac{6 \sum d_i^2}{N(N^2 - 1)}$$

(5.5)

RMSE PCC , SCC  
PCC SCC RMSE.

## 5.2 ТЕСТ ПРИМЕР 1: БАЗА СИНТЕТИЗОВАНИХ СЛИКА IRCCyN/IVCDIBR

IRCCyN/IVCDIBR

### 5.2.1 Опис базе IRCCyN/IVCDIBR

IRCCyN/IVCDIBR [25], [14]

IRCCyN/IVCDIBR 3 MVD

5.2.1, 5.2.1.



5.2.1. MVD IRCCyN/IVCDIBR: Book Arrival, Lovebird1 Newspaper.

5.2.1. IRCCyN/IVCDIBR MVD

Book Arrival	1024x768	16	6.5
Lovebird1		12	3.5
Newspaper		9	5

5.2.2. IRCCyN/IVCDIBR: 3 MVD ,

BookArrival	10	8	60
	10	9	60
	8	9	54
	8	10	54
Lovebird	8	6	112
	8	7	112
	6	7	104
	6	8	104
Newspaper	6	4	104
	6	5	104
	4	5	136
	4	6	136

IRCCyN/IVCDIBR,

2

MVD 2

5.2.2. 2 2

5.2.2.

7 , 1- 7. 1 2

[12] 2

ö ö

1

2

[71]. 1

MVD ,

1

MVD

ö ö

3 [71]

3 [72] MPEG

4 [73]

5

[74].

5

1- 5

6

[75].

7

õ

õ

84

(3 MVD x 4

x 7

)

12

(3 MVD x 4

).

1

1

(inpainting)

õ

õ. õ

õ

. õ

õ

3

3

2- 7

5.2.2.

ACR-HR (Absolute

Categorical Rating with Hidden Reference Removal)

1-5.

§

ö.

TVLogic LVM401W.

[77].  
(Mean Opinion Score)



5.2.2.

Newspaper

2- 7



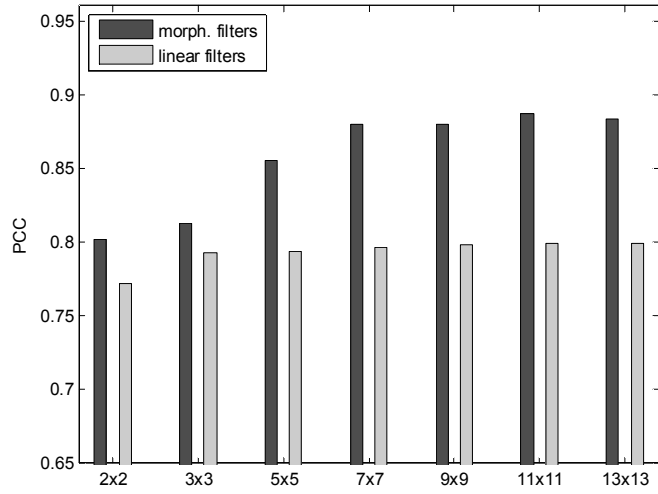


5.2.3.

A		MP-PSNR			A
		PSNR <sub>R</sub>			
SE		RMSE	PCC	SCC	
		MP-PSNR			
2x2	6	0.4101	0.8019	0.7083	
3x3	5	0.3996	0.8131	0.7101	
5x5	5	0.3561	0.8549	0.7759	
7x7	5	0.3264	0.8796	0.8050	
9x9	5	0.3263	0.8798	0.8015	
11x11	4	0.3165	0.8874	0.8175	
13x13	4	0.3221	0.8830	0.8021	
		MP-PSNR <sub>R</sub>			
2x2	4-6	0.3660	0.8459	0.7775	
3x3	3-5	0.3252	0.8806	0.8185	
5x5	3-5	0.2936	0.9039	0.8634	
7x7	3-5	0.2931	0.9042	0.8573	
9x9	2-4	0.2997	0.8996	0.8614	
11x11	2-4	0.2922	0.9048	0.8684	
13x13	2-4	0.2920	0.9050	0.8684	

a a a 2x2, a a MP-PSNR  
a 6 a a a a 3x3,  
5x5, 7x7 9x9 a a MP-PSNR a 5 a  
a a . a a a  
MP-PSNR a 4 a a a .  
a a a a . a a ,  
a MP-PSNR a a a a  
PSNR a DMOS- a a a a a MP-  
a 5x5, a a MP-

PSNR. a a MP-PSNR a  
 a 11x11: a 0.887 a  
 a 0.817.



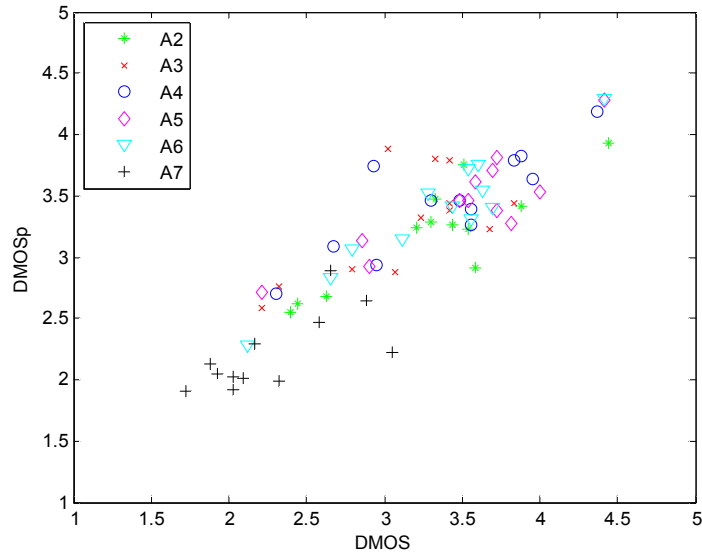
5.2.4.

(PCC)

, MP-PSNR,

, LP-PSNR, DMOS

2x2 13x13.



5.2.5. IRCCyN/IVCDIBR: DMOSp (MP-PSNR)

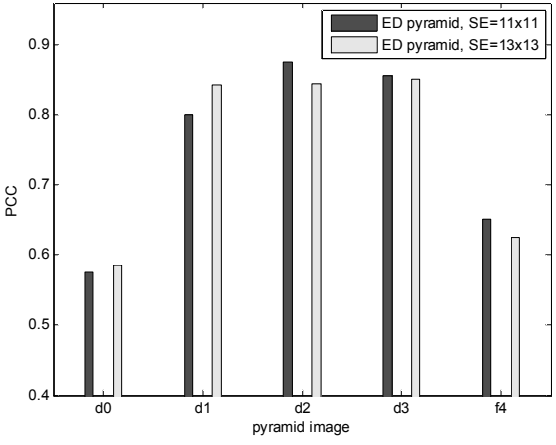
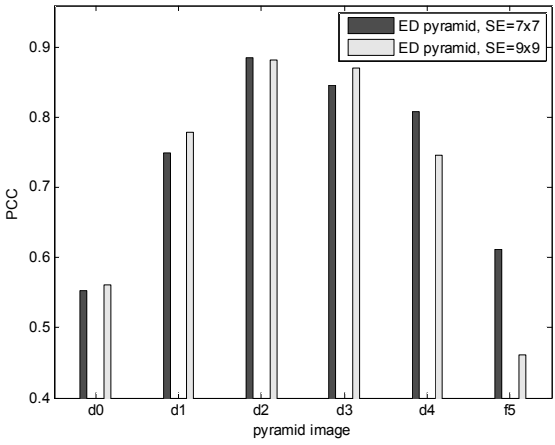
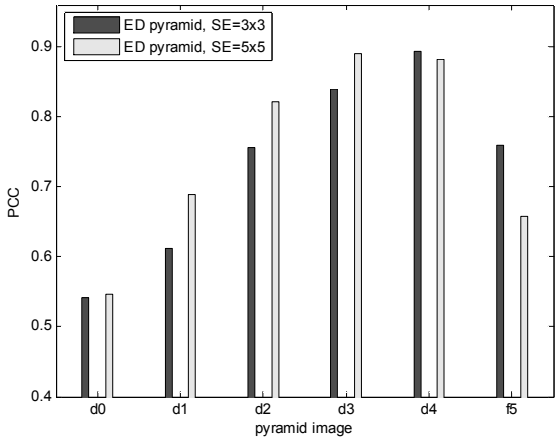
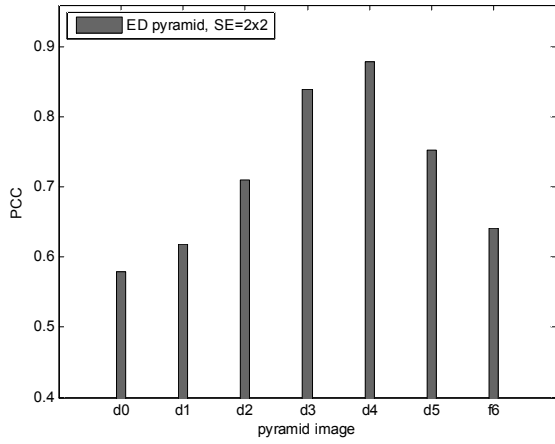
DMOS

a a a MP-PSNR a DMOS a a a  
 a 5.2.5. a a a a a a a .  
 a a a a a a a a a a a a  
 a a a a a a a, LP-PSNR.  
 a a a a a a a a a  
 a a [78]. a a a a a,  
 a a a a. a a a a  
 a a a a a a a a a a.  
 a a a a a a a a a  
 LP-PSNR. a a 2, 3, 5, ..., 13 a a  
 LP-PSNR a a a a a 6 a.  
 a LP-PSNR a a a a a a  
 5.2.4. a a LP-PSNR a DMOS  
 a 0.771 a a a 2 0.799 a a a  
 13. a , a MP-PSNR a  
 a a a a a LP-PSNR  
 a a a a a a . a a a a  
 a a. a , a 11x11 a  
 a a a ,  
 a MP-PSNR a DMOS 0.887, a a a 11  
 a a a a LP-  
 PSNR a DMOS 0.798.

### Анализа перформанси PSNR метрике по сликама пирамиде

( , ,  
 , , JPEG , ,  
 , , ) MSE  
 [69]  
 . PSNR

, PSNR  
 [79]. PSNR  
 .  
 a a a PSNR  
 . / .  
 , PSNR  
 . PSNR  
 , PCC,  
 PSNR DMOS. 5.2.6  
 PCC  
 2x2, 3x3, 13x13,  
 .  
 PSNR  
 :  
 2x2 3x3, PSNR  
 5 d4.  
 5x5 PSNR 4  
 PSNR  
 3.



5.2.6.

PSNR

DMOS

PSNR

PSNR

5.2.4  
PSNR  
, PCC=89.39% SCC=86.71%,

5

3x3

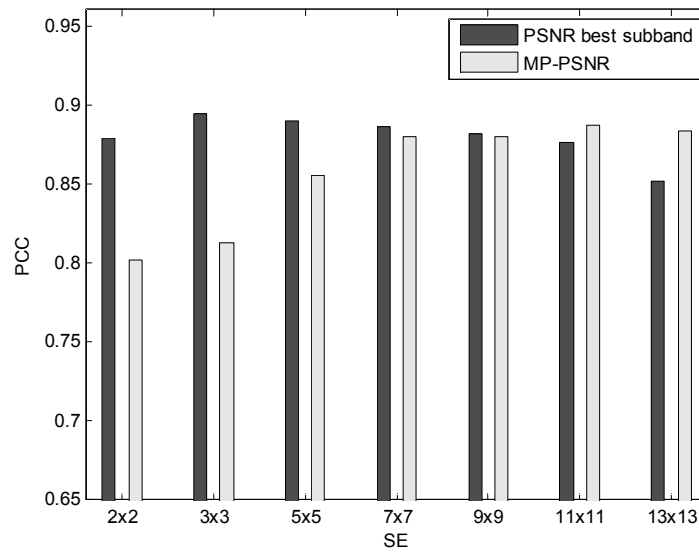
PSNR

PSNR

5.2.4.

PSNR

S		RMSE	PCC	SCC
2x2	d4	0.3270	0.8792	0.8147
<b>3x3</b>	<b>d4</b>	<b>0.3076</b>	<b>0.8939</b>	<b>0.8671</b>
5x5	d3	0.3130	0.8899	0.8656
7x7	d2	0.3180	0.8862	0.8485
9x9	d2	0.3239	0.8816	0.8697
11x11	d2	0.3307	0.8763	0.8513
13x13	d3	0.3597	0.8517	0.7859
PSNR( / .)		0.4525	0.7519	0.6766



5.2.7.

PSNR

DMOS

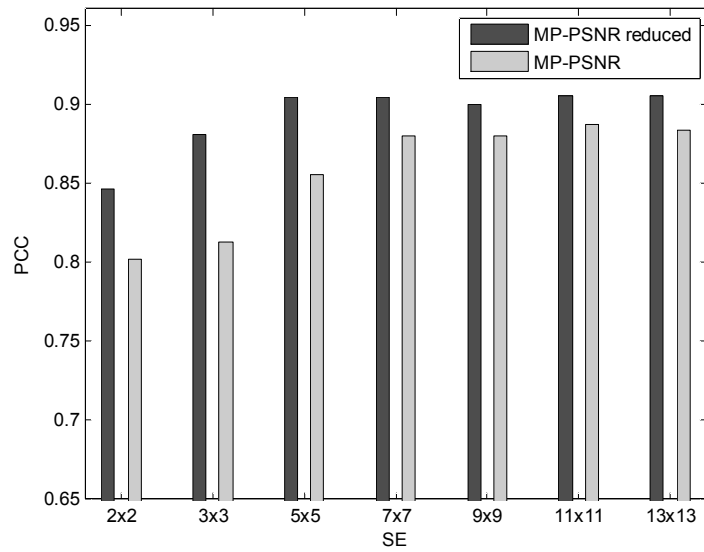
MP-PSNR

DMOS,

PSNR PSNR DMOS  
 PSNR  
 5.2.7.  
 MP-PSNR DMOS.  
 PSNR  
 MP-PSNR  
 9x9  
 .  
 - , PSNR  
 .

**Перформансе редуковане верзије MP-PSNRr**

PSNR  
 , MP-PSNRr  
 MSE  
 2x2  
 MP-PSNRr 4-6.  
 3x3, 5x5 7x7, MP-PSNRr MSE  
 3-5.  
 9x9, 11x11 13x13, MP-PSNRr MSE  
 2-4.  
 MP-PSNRr 5.2.3.  
 MP-PSNRr  
 =5x5 (  
 90.39%, 86.3%).  
 MP-PSNRr MP-PSNR, 5.2.8.



5.2.8.

MP-PSNRr

MP-PSNR

DMOS

2x2 ó 13x13

### Анализа перформанси MW-PSNR

MW-PSNR (Morphological

Wavelet Peak Signal-to-Noise Ratio)

minHaar minLift  
minLiftQ

(quincunx)

MW-PSNR.

cdfQ(2,2)

, cdf(2,2)

õquincunxõ

MW-PSNR.

PSNR

PSNR

MW-PSNRr PSNR

1 8 MW-

PSNR. 7

22

MW-PSNR 7

15 MW-

PSNR 5.2.5.

5.2.5 MW-PSNR MW-PSNRr

	RMSE	PCC	SCC
MW-PSNR			
<b>minHaar</b>	<b>0.3565</b>	<b>0.8545</b>	<b>0.7750</b>
Haar	0.4435	0.7632	0.6491
minLift	0.4017	0.8108	0.6816
cdf(2,2)	0.5009	0.6836	0.5450
minLiftQ	0.3922	0.8206	0.7382
cdf(2,2)Q	0.4756	0.7210	0.5779
MW-PSNRr			
<b>minHaar</b>	<b>0.3188</b>	<b>0.8855</b>	<b>0.8298</b>
Haar	0.3935	0.8194	0.7695
minLift	0.3878	0.8251	0.6990
cdf(2,2)	0.4735	0.7239	0.5958
minLiftQ	0.3599	0.8514	0.7641
cdf(2,2)Q	0.4508	0.7541	0.6126

MW-PSNR

MW-PSNR

minHaar. MW-PSNR

minLiftQ

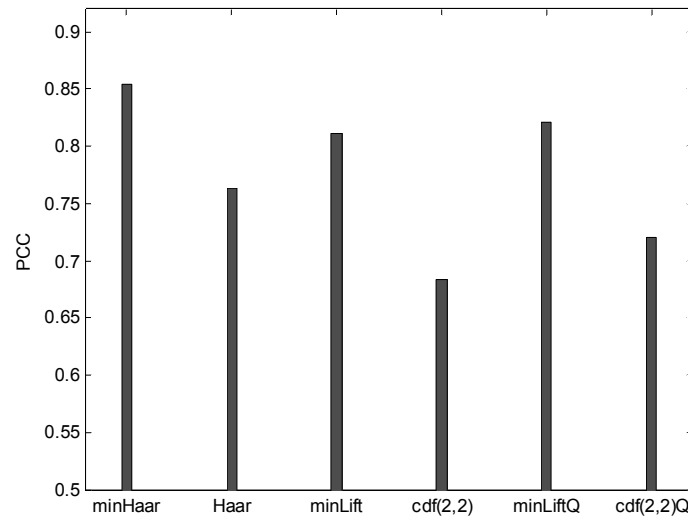
MW-PSNR

minLift.

5.2.9

MW-PSNR

DMOS



5.2.9.

MW-PSNR

DMOS

**Перформансе PSNR по подопсезима добијеним декомпозицијом слике морфолошким таласићима**

a a a PSNR

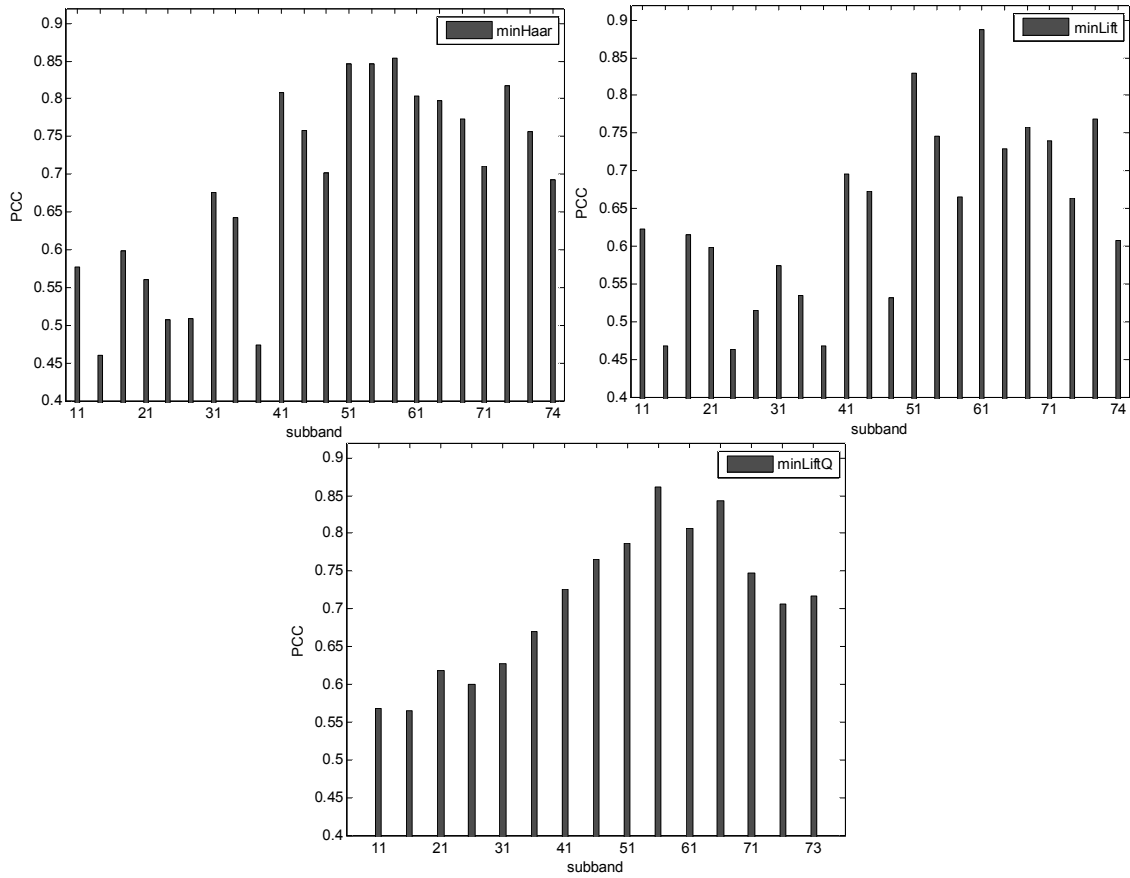
PSNR

PSNR

, PCC,

PSNR

DMOS.



5.2.10.

(PCC)

PSNR

DMOS

minHaar, minLift minLiftQ

5.2.10

PCC

, minHaar, minLift minLiftQ.

PSNR

PSNR

DMOS

, 4 7,

, 1 3.

PSNR

PSNR

5.2.6.

minLift,

PSNR

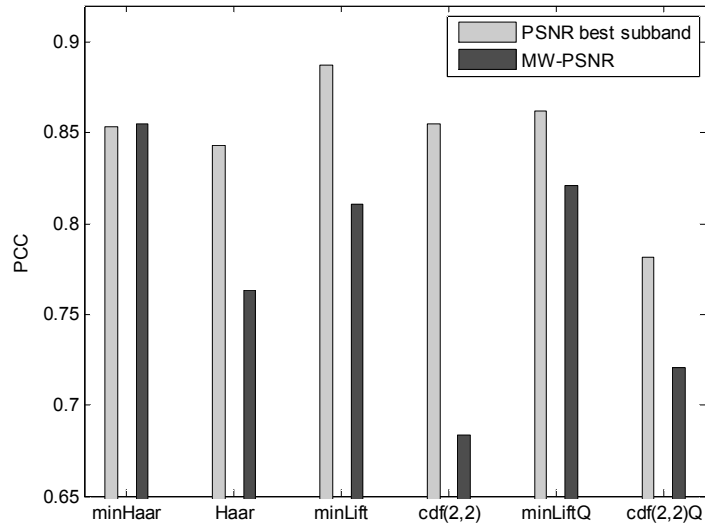
d61, PCC=0.887, SCC=0.828.

PSNR

PSNR

5.2.6. PSNR

			RMSE	PCC	SCC
	minHaar	53	0.3576	0.8535	0.7831
	Haar	61	0.3691	0.8431	0.7939
	<b>minLift</b>	<b>61</b>	<b>0.3167</b>	<b>0.8872</b>	<b>0.8281</b>
	cdf(2,2)	61	0.3558	0.8551	0.7671
	minLiftQ	52	0.3478	0.8621	0.7777
	cdf(2,2)Q	52	0.4279	0.7818	0.6493
	/		0.4525	0.7519	0.6766



5.2.11.

PSNR

DMOS MW-PSNR

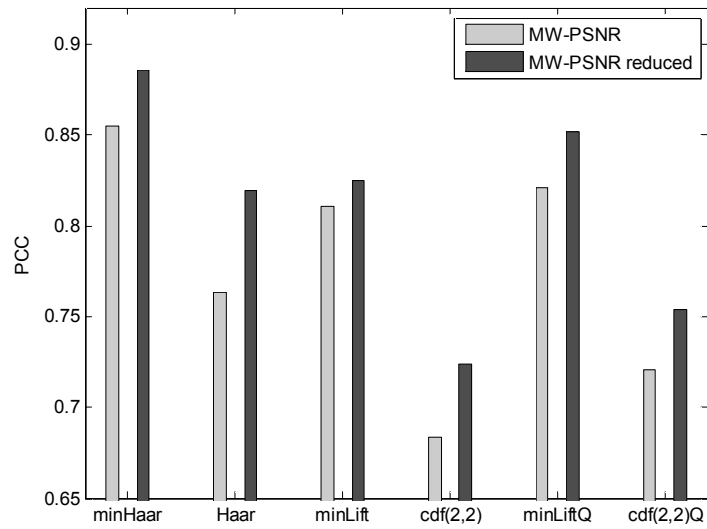
DMOS

5.2.11 (PCC)  
 PSNR DMOS PSNR  
 PCC MW-PSNR DMOS.  
 , PSNR PSNR ,  
 MW-PSNR.

**Анализа редуковане верзије MW-PSNRr**

,  
 ( ) [80].  
 .  
 ,  
 .

PSNR ,  
 4 7,  
 MW-PSNRr .  
 MW-PSNRr d41-d72.  
 e õquincunxõ  
 MW-PSNRr d42-d71.  
 MW-PSNRr 5.2.5.  
 (PCC) MW-PSNRr  
 DMOS 5.2.12.  
 MW-PSNRr  
 minHaar, PCC=88.5%, SCC= 82.98%.  
 , MW-PSNRr  
 MW-PSNR.



5.2.12.

MW-PSNRr

MW-PSNR

DMOS

### Преглед резултата

PSNR, Universal Quality Index, UQI [81], Structural Similarity index SSIM [82], Multi-Scale Structural Similarity, MS-SSIM [43], Information Weighted PSNR, IW-PSNR [46], Information Weighted Structural Similarity IW-SSIM [46]

, 3DswIM [29],

5.2.7.

: PSNR

3x3;

MP-PSNRr

SE

5x5;

MP-PSNR

SE

7x7.

: PSNR

minLift;

MW-PSNRr

MW-PSNR

minHaar.

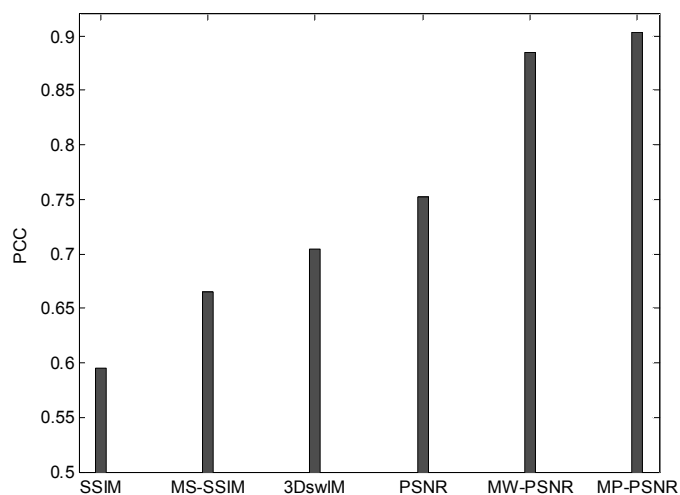
5.2.7.

	IRCCyN/IVC DIBR		
	RMSE	PCC	SCC
PSNR	0.4525	0.7519	0.6766
IW-PSNR [100]	0.5267	0.6411	0.5320
UQI [98]	0.5199	0.6529	0.5708
SSIM [99]	0.5513	0.5956	0.4424
MS-SSIM [100]	0.5127	0.6649	0.5188
IW-SSIM [100]	0.5350	0.6265	0.4856
3DswIM [101]	0.4868	0.7049	0.6396
PSNR (d4), SE=3x3	0.3076	0.8939	0.8671
MP-PSNRr SE=5x5	<b>0.2936</b>	<b>0.9039</b>	<b>0.8634</b>
MP-PSNR SE=7x7	0.3264	0.8796	0.8050
PSNR (d61), minLift	0.3167	0.8872	0.8281
MW-PSNRr, minHaar	0.3188	0.8855	0.8298
MW-PSNR, minHaar	0.3565	0.8545	0.7750

3DswIM.

DMOS

5.2.13.



5.2.13. (SSIM, MS-SSIM, PSNR), (3DswIM) MP-PSNRr MW-PSNRr

### 5.3. ТЕСТ ПРИМЕР 2: БАЗА СИНТЕТИЗОВАНИХ СТЕРЕО СЛИКА MCL-3D

, MCL-3D, 5.3.2

#### 5.3.1 Опис базе MCL-3D

MCL-3D [83], [84], 36

9 MVD 5.3.1.

, Kendo, Balloons Lovebird1, 1024x728

6 Poznan street, Poznan Hall2, Shark, Microworld,

Gt\_fly, Undo\_dancer 1920x1088 .

MCL-3D MVD

3

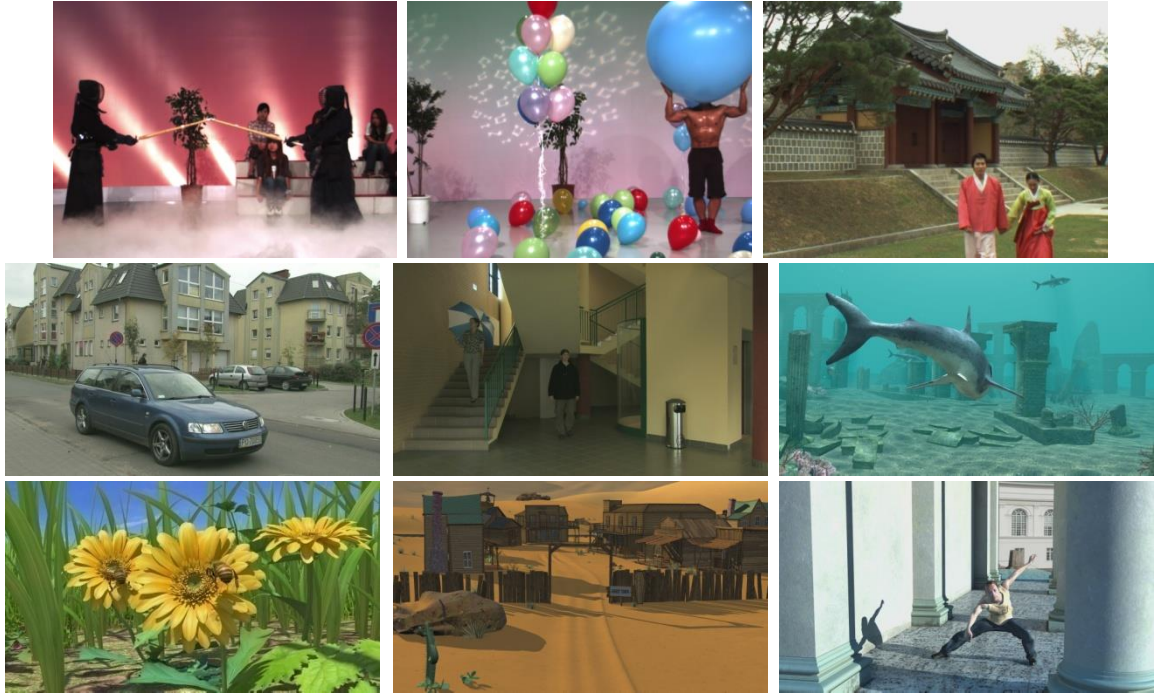
( 1, 2, 3)

( 1, 2, 3).

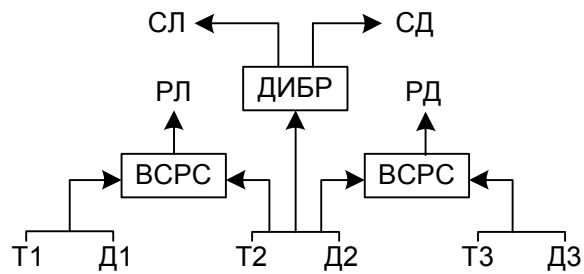
2

2, 5.3.2,

2, , , .



. 5.3.1. : MCL-3D: Kendo, Balloons Lovebird1, Poznan street, Poznan Hall2, Shark, Microworld, Gt\_fly, Undo\_dancer, ,



5.3.2.

MCL-3D.

( , )

2

2.

( , )

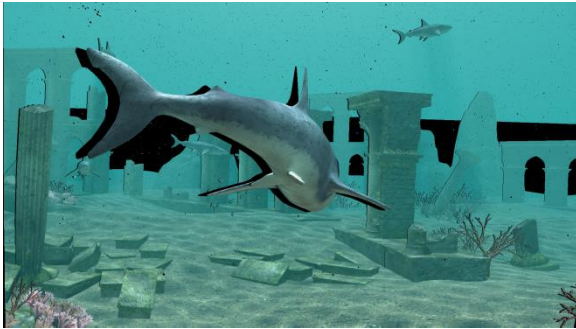
( 1, 2) ( 2, 3)

( 1, 2) ( 2,

3).



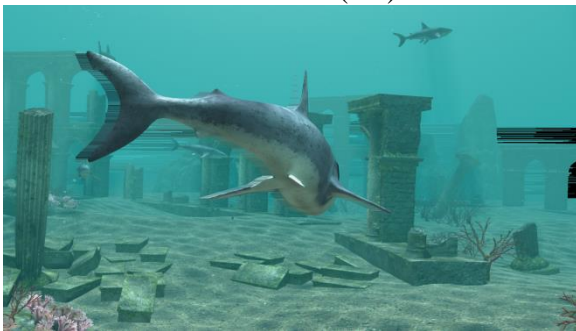
T1



(A7)



(A1)



(A2)



( 8)

5.3.3. Shark:

1,

,

7, 1, 2, 8

MCL-3D

4

: 1, 2, 7

8.

1 2

[12].

2

[71]. A7

. A8

[76].

8

.

3) , ( 1, 1) ( 2, 2)  
 , , 5.3.2, ( 2, 2) ( 3,  
 [85]. , 1,

4  
 ( 1), ( 2), ( 7), ( 8) 5.3.3 Shark

5.3.4 Balloons.  
 1, . 5.3.2,

5.3.5. 5.3.5  
 , 1 - ( ),

( ), 3, .

, 5.3.2,  
 [85]

( , ) ( 1, 1)  
 ( 2, 2) ( 2, 2) ( 3, 3) . , ,  
 , ( ),

5.3.5.  
 ( ) .

( )



T1



(A7)



(A1)



(A2)



( 8)

5.3.4. Balloons:

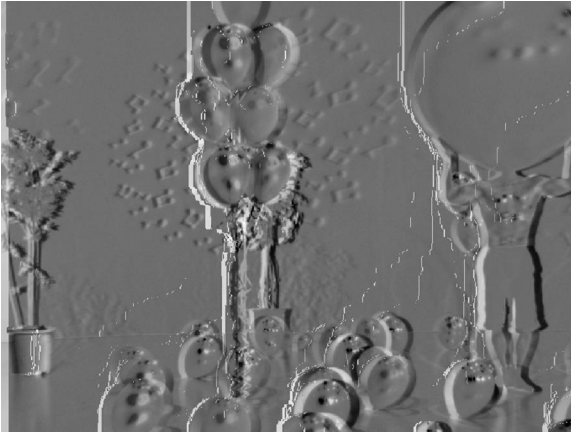
1,

,

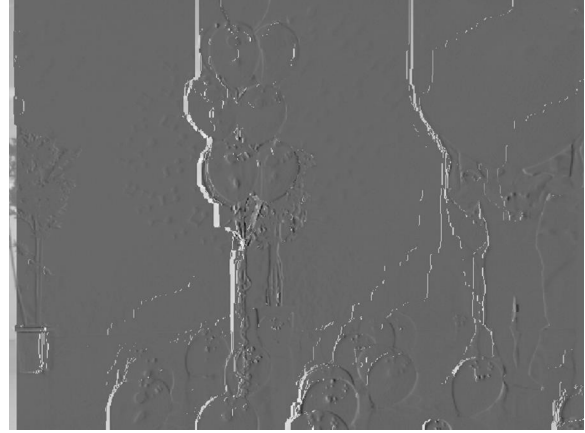
7, 1, 2, 8

( , )

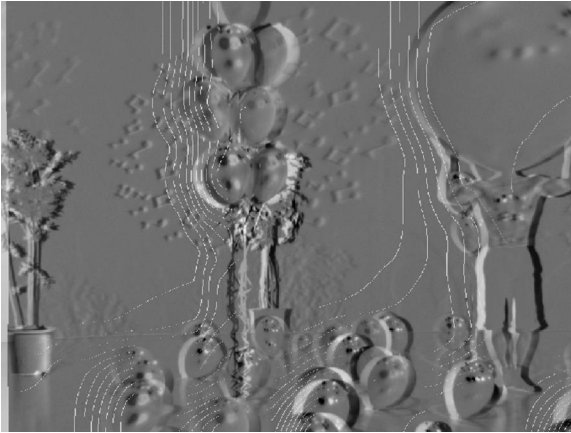
( , ).



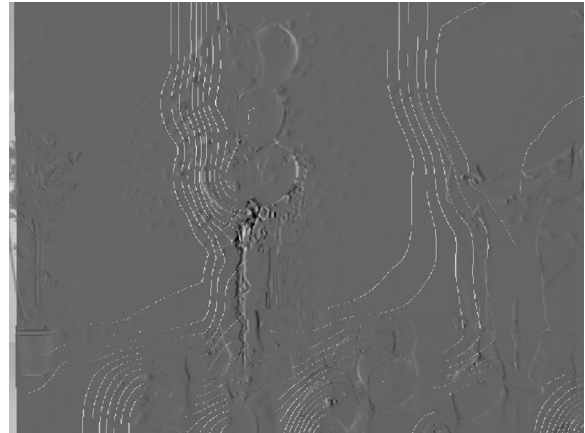
T1 ó (A7)



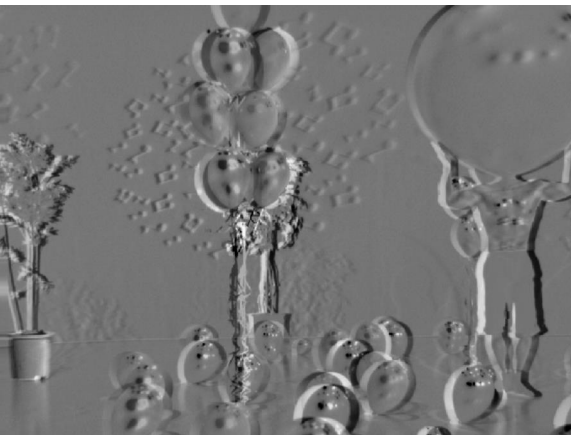
ó (A7)



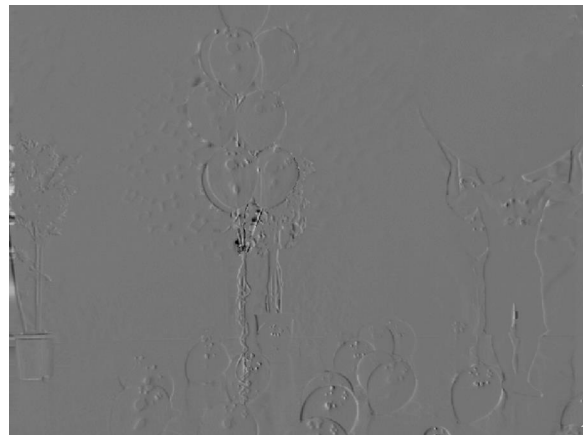
T1 ó (A1)



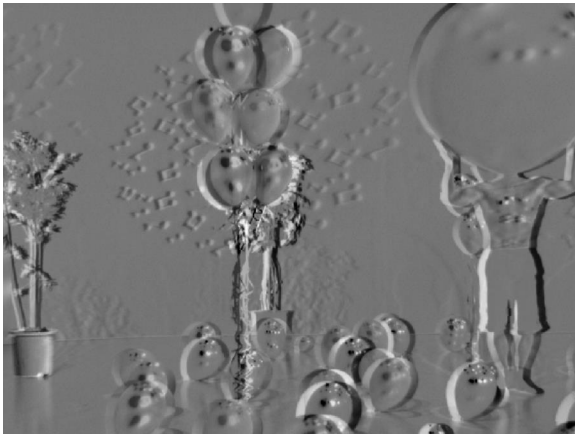
ó (A1)



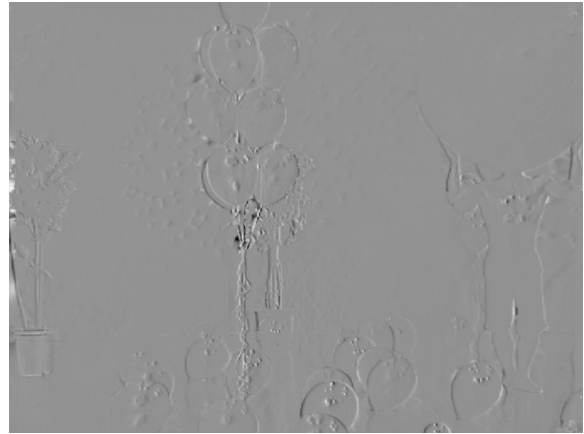
T1 ó (A2)



ó (A2)



T1 ó (A8)



ó (A8)

5.3.5.  
( 8)

( 1), ( 2), ( 7),  
1, ;

1, 2, 7, 8 ( );

MCL-3D

[86].

46.9ö LG47LW5600.

(pair-wise comparison

method)

(mean opinion score)

30

10%

10%

24

### 5.3.2 Перформансе предложене метрике при оцењивању слика базе MCL-3D

MCL-3D

## Перформансе метрике MP-PSNR

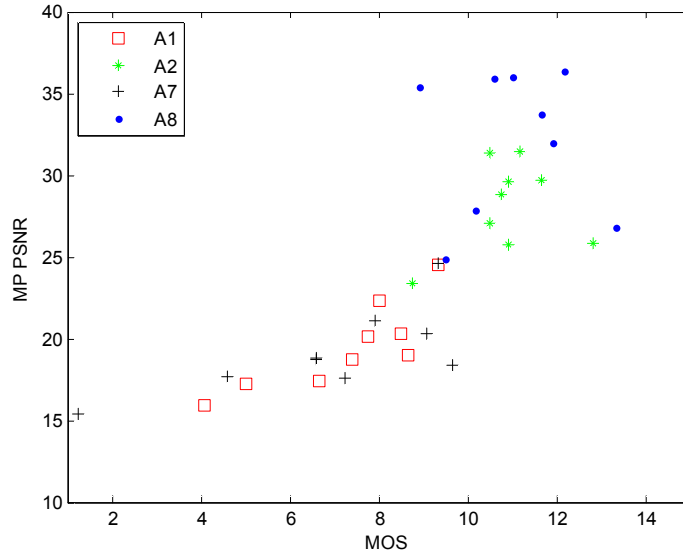
		MP-PSNR			
5.3.1.					
5.3.1.	A	MP-PSNR		A	MP-
	PSNR <sub>R</sub>	MCL-3D			
		MCL-3D			
	SE	RMSE	PCC	SCC	
		MP-PSNR			
	2x2	8	1.2506	0.8902	0.8131
	3x3	7	1.2270	0.8946	0.8503
	5x5	5	1.2305	0.8939	0.8360
	7x7	5	1.2274	0.8945	0.8430
	9x9	4	1.2304	0.8940	0.8395
	11x11	4	1.2298	0.8941	0.8373
	13x13	4	1.2121	0.8973	0.8389
			MP-PSNR <sub>r</sub>		
	2x2	3-9	1.2378	0.8926	0.8142
	3x3	3-8	1.2014	0.8992	0.8481
	5x5	3-6	1.2267	0.8946	0.8445
	7x7	2-6	1.2097	0.8977	0.8502
	9x9	2-5	1.2242	0.8951	0.8398
	11x11	2-5	1.2261	0.8947	0.8389
	13x13	2-5	1.2047	0.8986	0.8467

MCL-3D,

MP-PSNR

4

MOS ( ) MP-PSNR  
MCL-3D 5.3.6. a a a a a a



5.3.6. MP-PSNR MOS MCL-3D.

### Перформансе метрике PSNR по сликама морфолошке пирамиде

a a a PSNR

#### 5.3.7

PSNR MOS

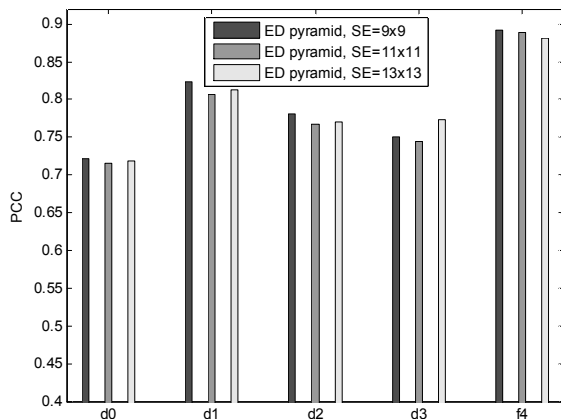
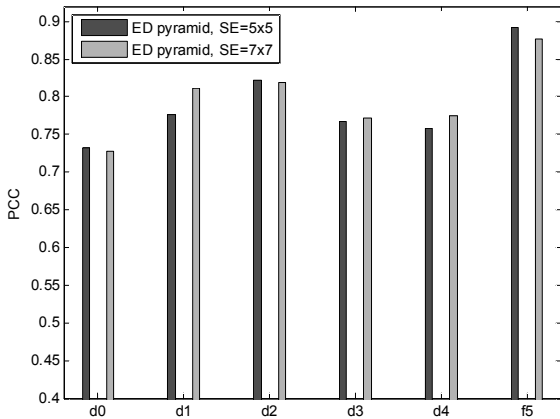
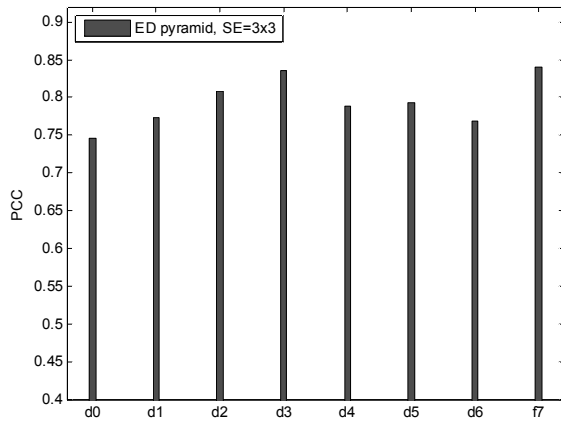
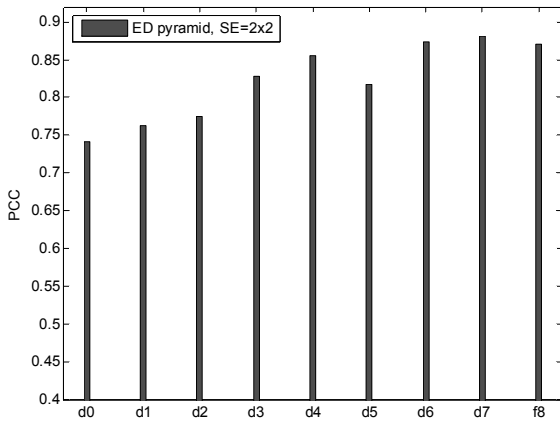
, 2x2 13x13,

. MCL-3D ,

PSNR MOS

PCC

,  $d_0$ ,



5.3.7.

MOS.

PSNR

PSNR

PSNR

5.3.2.

MCL-3D,

MP-PSNR<sub>r</sub>

7x7.

7x7,

MP-PSNR<sub>r</sub>

MP-PSNR<sub>r</sub>

5.3.1.

MP-PSNRr

MP-PSNR MCL-3D.

5.3.2.

PSNR

MCL-3D

SE	MCL-3D			
	image	RMSE	PCC	SCC
2x2	d8	1.3095	0.8789	0.7988
3x3	s6	1.2327	0.8935	0.8427
5x5	s5	1.1959	0.9001	0.8583
7x7	<b>s4</b>	<b>1.1696</b>	<b>0.9047</b>	<b>0.8733</b>
9x9	s4	1.1777	0.9033	0.8724
11x11	s4	1.2012	0.8992	0.8691
13x13	s4	1.2431	0.8916	0.8556
-----	f0	2.4566	0.4465	0.4537

### Перформансе метрике MW-PSNR

MW-PSNR

MCL-3D

MW-PSNR

5.3.2.

MW-PSNR, PCC=0.88,

SCC=0.80,

õquincunxõ

minLiftQ.

MW-PSNR

minLiftQ

MCL-

3D

5.3.8.

5.3.3.

MW-PSNR

MW-PSNRr

MCL-3D

MCL-3D

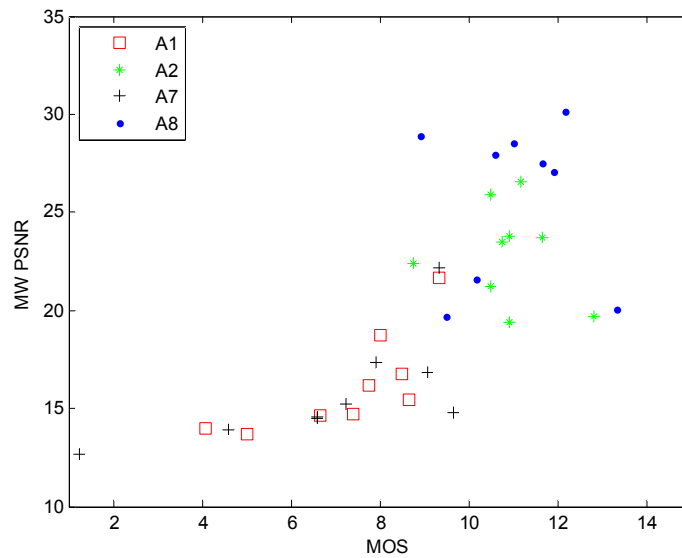
RMSE PCC SCC

MW-PSNR

<b>minHaar</b>	1.3063	0.8796	0.7970
Haar	2.2524	0.5718	0.6065
minLift	1.3823	0.8640	0.7909
cdf(2,2)	2.2916	0.5507	0.5849
minLiftQ	<b>1.3035</b>	<b>0.8801</b>	<b>0.8064</b>
cdf(2,2)Q	2.3691	0.5053	0.5101

MW-PSNRr

<b>minHaar</b>	1.2962	0.8815	0.8070
Haar	1.8452	0.7405	0.7412
minLift	1.3786	0.8648	0.8130
cdf(2,2)	1.7043	0.7840	0.7749
minLiftQ	<b>1.2700</b>	<b>0.8866</b>	<b>0.8142</b>
cdf(2,2)Q	1.8794	0.7290	0.7485



5.3.8.

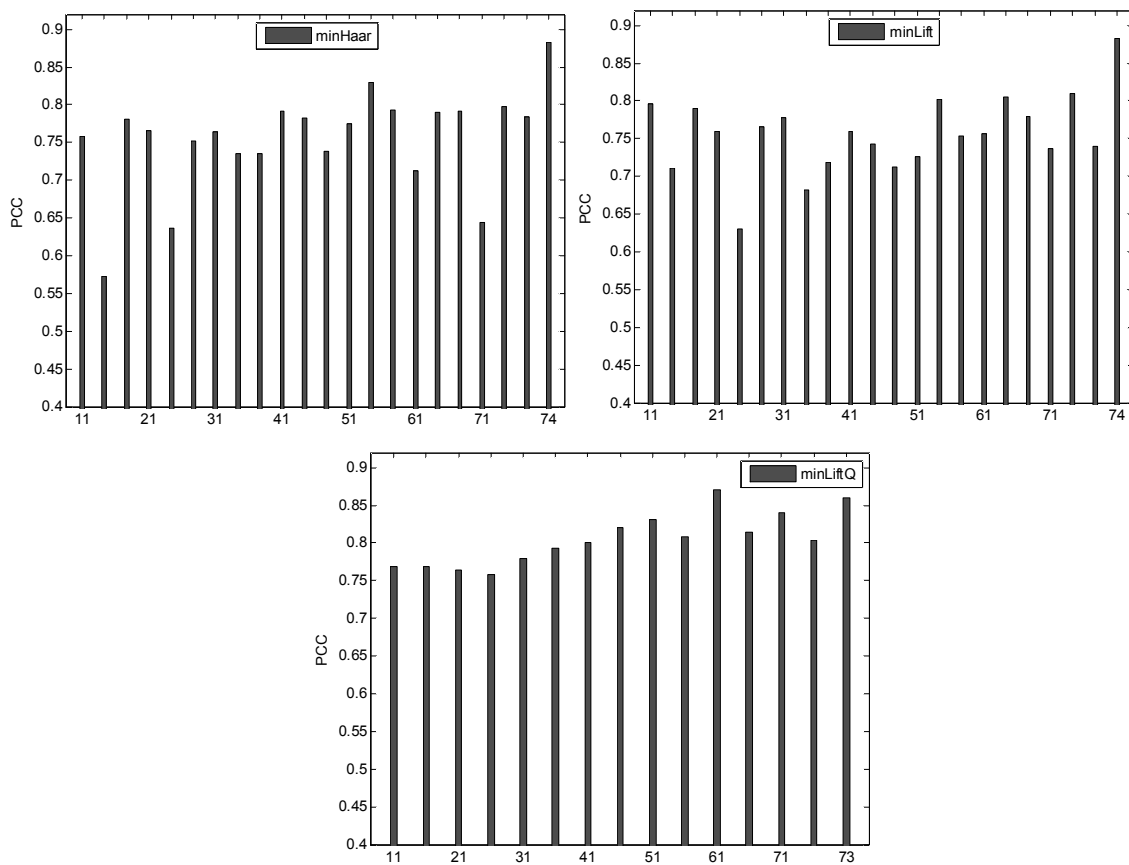
MW-PSNR

MOS

MCL-3D.

## Перформансе метрике PSNR по подопсезима добијеним декомпозицијом слике морфолошким таласићима

а а а PSNR  
 PSNR  
 , PCC, PSNR DMOS. 5.3.9  
 PCC , minHaar,  
 minLift minLiftQ. PCC



5.3.9. (PCC) PSNR DMOS

minHaar, minLift minLiftQ

5.3.4.

PSNR

MCL-3D

		MCL-3D			
		RMSE	PCC	SCC	
	minHaar	s7	<b>1.2858</b>	<b>0.8835</b>	<b>0.8465</b>
	Haar	d13	1.7036	0.7842	0.7392
	<b>minLift</b>	s7	1.2866	0.8834	0.8408
	cdf(2,2)	d11	1.8400	0.7422	0.7440
	minLiftQ	s7	1.3051	0.8798	0.8354
	cdf(2,2)Q	d1	1.7024	0.7845	0.7674
-----	-----		2.4566	0.4465	0.4537

PSNR

PSNR

5.3.3.

PSNR

minHaar,

PSNR

s7, PCC=0.883, SCC=0.846.

PSNR

PSNR

MW-PSNRr

5.3.2.

MW-

PSNRr

MW-PSNR

MCL-3D.

**Преглед резултата предложених метрика**

MCL-3D

3DswIM,

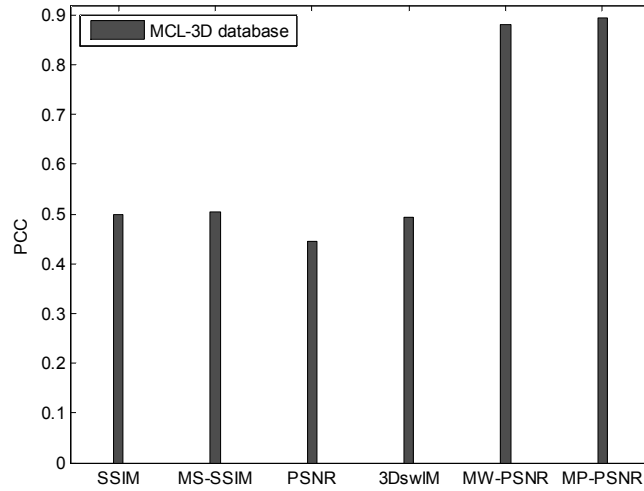
5.3.4,

5.3.10.

5.3.5.

MCL-3D

	MCL-3D		
	RMSE	PCC	SCC
PSNR	2.4566	0.4465	0.4537
IW-PSNR [100]	2.4541	0.4483	0.2892
UQI [98]	2.3292	0.5294	0.3177
SSIM [99]	2.3797	0.4987	0.1739
MS-SSIM [100]	2.0834	0.6513	0.2091
IW-SSIM [100]	2.1908	0.6027	0.1578
DIBR			
3DswIM [101]	2.3879	0.4935	0.3435
PSNR(s6), SE=3x3	1.2327	0.8935	0.8427
MP-PSNRr SE=5x5	1.2267	0.8946	0.8445
MP-PSNR SE=7x7	1.2274	0.8945	0.8430
PSNR(s7), minLift	1.2866	0.8834	0.8408
MW-PSNRr, minHaar	1.2962	0.8815	0.8070
MW-PSNR, minHaar	1.3063	0.8796	0.7970



5.3.10.  
PSNR),

MP-PSNR MW-PSNR

(SSIM, MS-SSIM,  
(3DswIM)  
MCL-3D

## 5.4. ТЕСТ ПРИМЕР 3: БАЗА СИНТЕТИЗОВАНИХ ВИДЕО СЕКВЕНЦИ FVSV

FVSV

FVSV.

### 5.4.1 Опис базе FVSV

(Free-Viewpoint video database) FVSV, [31], [32],

(View Synthesis Reference Software 1D Fast,

VSRS-1DFast [88])

(blended)

49

49

(blended)

49

100

49

5.4.1.



5.4.1.

FVSV

(blend)

100

: r1, r2

, s1-s49

-

(blended)  
(non-blended),

103

FVSV

5 MVD

( )

5.4.1 MVD  
MVD

5.4.1. MVD FVSV

				r1, r2	
Book Arrival	1024x768	16	6.5	6, 10	33
Kendo		7	5	1, 5	1
Balloons		7	5	1, 5	1
Undo Dancer	1920x1080			1, 9	250
GT Fly				9, 1	157

FVSV

7 , 3

:

- C1: 3D-HEVC Test Model, 3D-HTM 0.4 [89],  
(inter-view prediction) (View Synthesis Optimization);
- C2: Multiview Video Coding (MVC), JM 18.4 [90];
- C3: HEVC Test Model, HM 6.1 [91];
- C4: JPEG2000, Kakadu [92];

- C5: [93],  
(lossless-edge depth map coding);
- C6: [94];
- C7: Z-LAR-RP [95].

(intra coding). 3  
[87].

(Mean opinion score)

FVSV

ACR-HR [96].

Panasonic BT-3DL2550

1920x1080p

[97].

27

1 ( ) 5 ( )

30 . 4

(outliers).

( ).

FVSV

103

(blended)

5 MVD

, 7

3

(5 MVD

\* 7

\* 3

ó 2

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#### 5.4.2. Перформансе предложене метрике при оцењивању базе FVSV

FVSV

50

( , )

5.4.2 PSNR, , MP-PSNR MW- (PSNR, SSIM, MS-SSIM)

FVSV (blended mode). MP-PSNR

6

3x3

MW-PSNR

7

SSIM, [15].

, SSIM

5.4.2.

FVSV (BLENDED MODE)

	RMSE	PCC	SCC
MW-PSNR	0.5259	0.8043	0.7343
MP-PSNR	0.5330	0.7983	0.7324
PSNR	0.5906	0.7448	0.6826
SSIM [99]	0.6661	0.6585	0.6090
MS-SSIM [100]	0.7152	0.5891	0.5912
3DswIM [101]	0.7545	0.5227	0.5117

7

7

C1-C7.

MW-PSNR

7

FVSV

5.4.3.

PSNR

5.4.3.

C4, MW-PSNR

PSNR.

MW-PSNR

C2.

MW-PSNR

DMOS

C1-C7

5.4.2.

5.4.3.

MW-PSNR PSNR

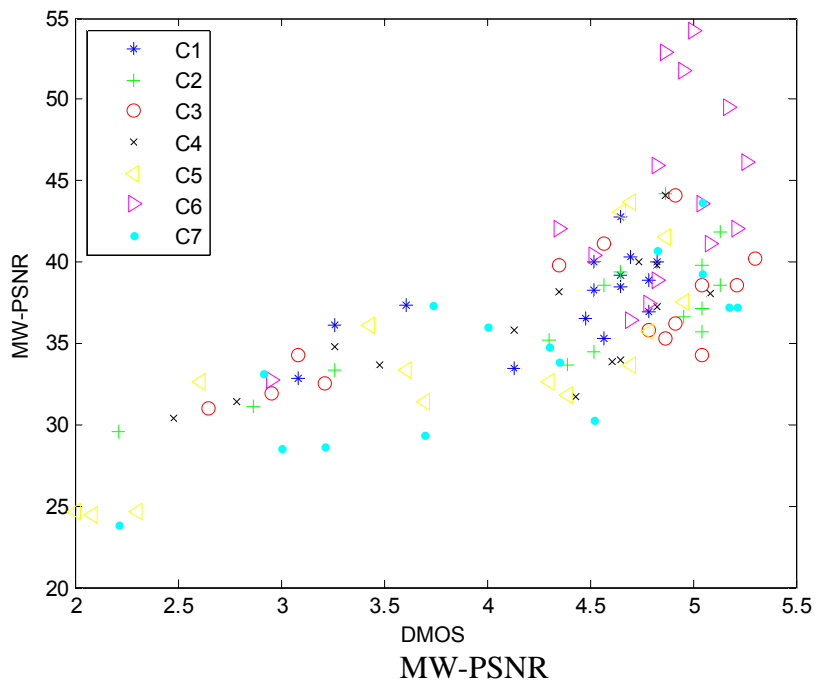
7

FVSV

7

C1- C7

	RMSE	PCC	SCC
	MW-PSNR		
C1	0.4787	0.6628	0.6679
C2	0.3461	<b>0.9402</b>	<b>0.8032</b>
C3	0.5430	0.8619	0.5705
C4	0.6112	0.7687	0.7437
C5	0.6140	0.8643	0.7757
C6	<b>0.3067</b>	0.8751	0.5541
C7	0.6122	0.8142	0.7542
	PSNR		
C1	0.5804	0.4191	0.4165
C2	0.4919	<b>0.8750</b>	0.7299
C3	0.5845	0.8379	0.6013
C4	0.6091	0.7706	<b>0.7459</b>
C5	0.6845	0.8280	0.6988
C6	<b>0.3197</b>	0.8634	0.5326
C7	0.7032	0.7452	0.6184



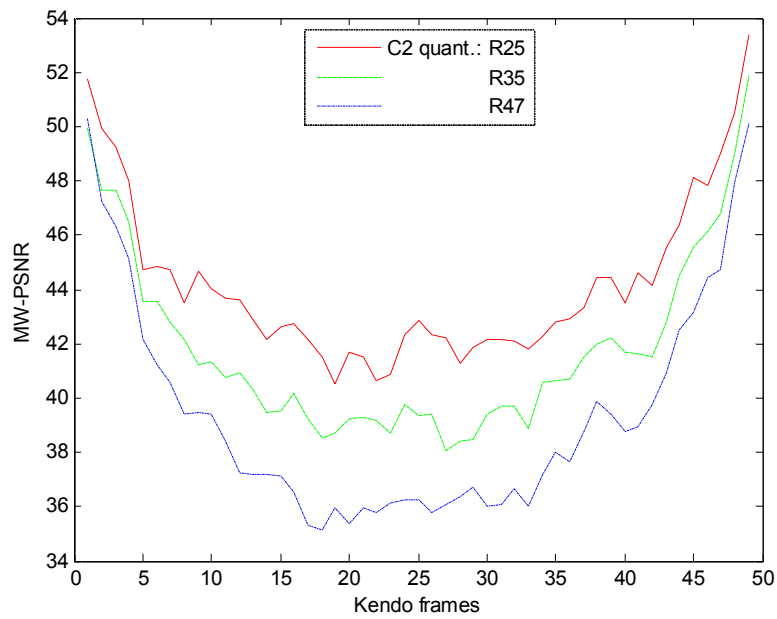
5.4.2.

MW-PSNR

FVSV

(blend)

C1-C7



5.4.3.

Kendo

C2 3

: 25, 35, 47

5.4.3.

FVSV

5

MVD

MW-PSNR 5

5.4.4.

MW-PSNR

MVD

Kendo

Gt Fly.

MW-PSNR

DMOS

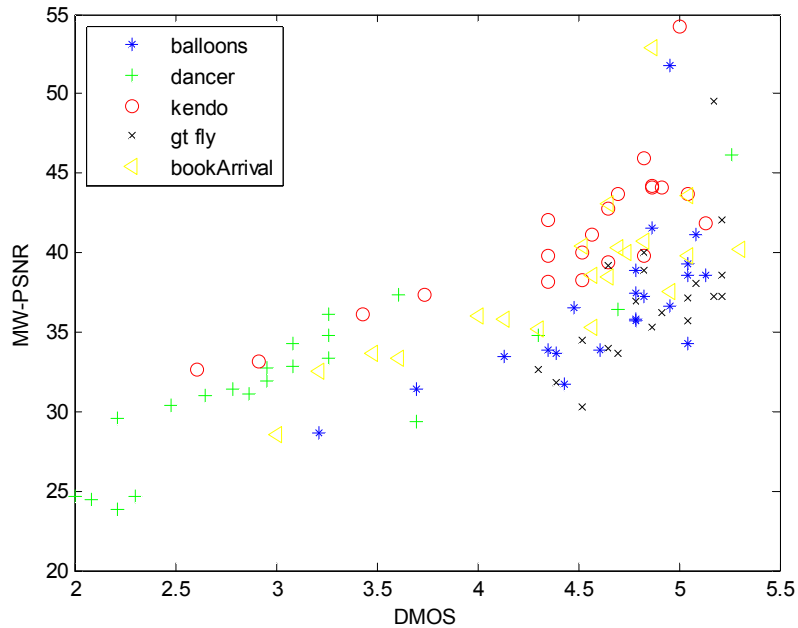
5.4.4.

5.4.4.

MW-PSNR 5

FVSV MVD

MW-PSNR	RMSE	PCC	SCC
Balloons	0.2220	0.9063	0.7994
Dancer	0.4566	0.8699	0.8526
Kendo	0.2330	0.9498	0.8184
BookArrival	0.3059	0.8994	0.7693
Gt_Fly	0.2092	0.7465	0.6767



5.4.4.

MW-PSNR MVD

FVSV

5.4.5.

KENDO

	[s]
MW-PSNR [103]	0.15
MP-PSNR [102]	0.47
PSNR	0.01
SSIM [99]	0.23
MS-SSIM [100]	0.41
3DswIM [101]	14.74

Kendo

5.4.5.

HP ProBook 450

Intel Core i3, Dual Core 4GB RAM.

Matlab R2010b.

PSNR,

MW-PSNR.

## 6 ЗАКЉУЧАК

(Depth Image Based Rendering)

MP-PSNR ( Morphological Pyramid Peak Signal-to-Noise Ratio)

Signal-to-Noise Ratio)

MW-PSNR (Morphological Wavelet Peak

õquincunõ

, IRCCyN/IVCDIBR,

, MCL-3D,  
, FVSV,

. , MP-PSNR MW-PSNR,  
PSNR,  
SSIM, MS-SSIM  
3DswIM.

PSNR

.  
PSNRr MW-PSNRr,  
, MP-

( ).

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	Free-viewpoint TV,	
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3	3	
MVD	(Multiview Video plus Depth),	
MVV	(Multi-View Video),	
SVD	(Single-View Video),	
MPEG	Moving Picture Experts Group (Depth-Image-Based-Rendering),	
MVC	(Multi-view Video Coding),	
MSE	(Mean Squared Error),	
PSNR	(Peak Signal-to-Noise Ratio),	/
MP-MSE		
MP-PSNR	orphological Pyramid Peak Signal-to-Noise Ratio	
MP-MSEr		
MP-PSNRr	orphological Pyramid Peak Signal-to-Noise Ratio	
MW-MSE		
MW-PSNR	Morphological Wavelet Peak Signal-to-Noise Ratio	
MW-MSEr		
MW-PSNRr	Morphological Wavelet Peak Signal-to-Noise Ratio	

minHaar

minLift

minLiftQ

õquincunxõ

Haar

cdf(2,2)

, Cohen-Daubechies-Feauveau

cdf(2,2)Q

õquincunxõ

SSIM Structural Similarity index

MS-SSIM Multi-Scale Structural Similarity

3DswIM 3D Synthesized view Image Quality Metric

IRCCyN/IVCDIBR

MCL-3D

FVSV

DMOS Differential Mean Opinion Score

MOS Mean Opinion Score

RMSE (Root Mean Squared Error)

PCC (Pearson's Correlation Coefficient)

SCC (Spearman's correlation coefficient)