

# Восстановление сжатого видео

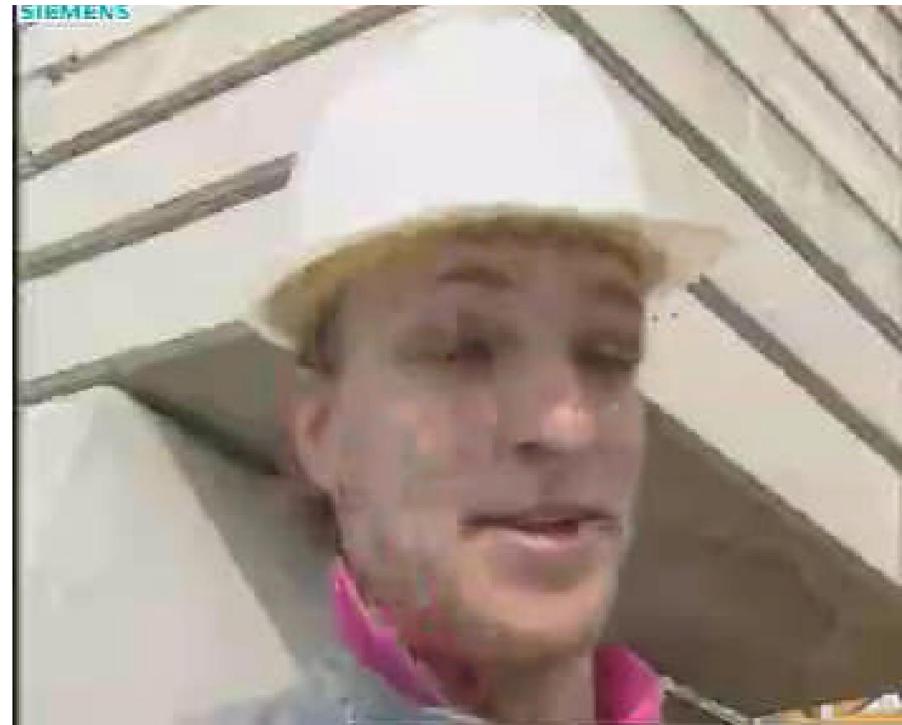
*Моисеев Алексей*

*Video Group  
CS MSU Graphics & Media Lab*

# Содержание

- Введение
- SWAT
- Adaptive Fuzzy Filtering
- Заключение

# Введение



# Содержание

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- SWAT
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# SWAT

$u \in R^{N \times 1}$  — исходное изображение

$G \in G^{N \times N}$  — ортонормированное преобразование

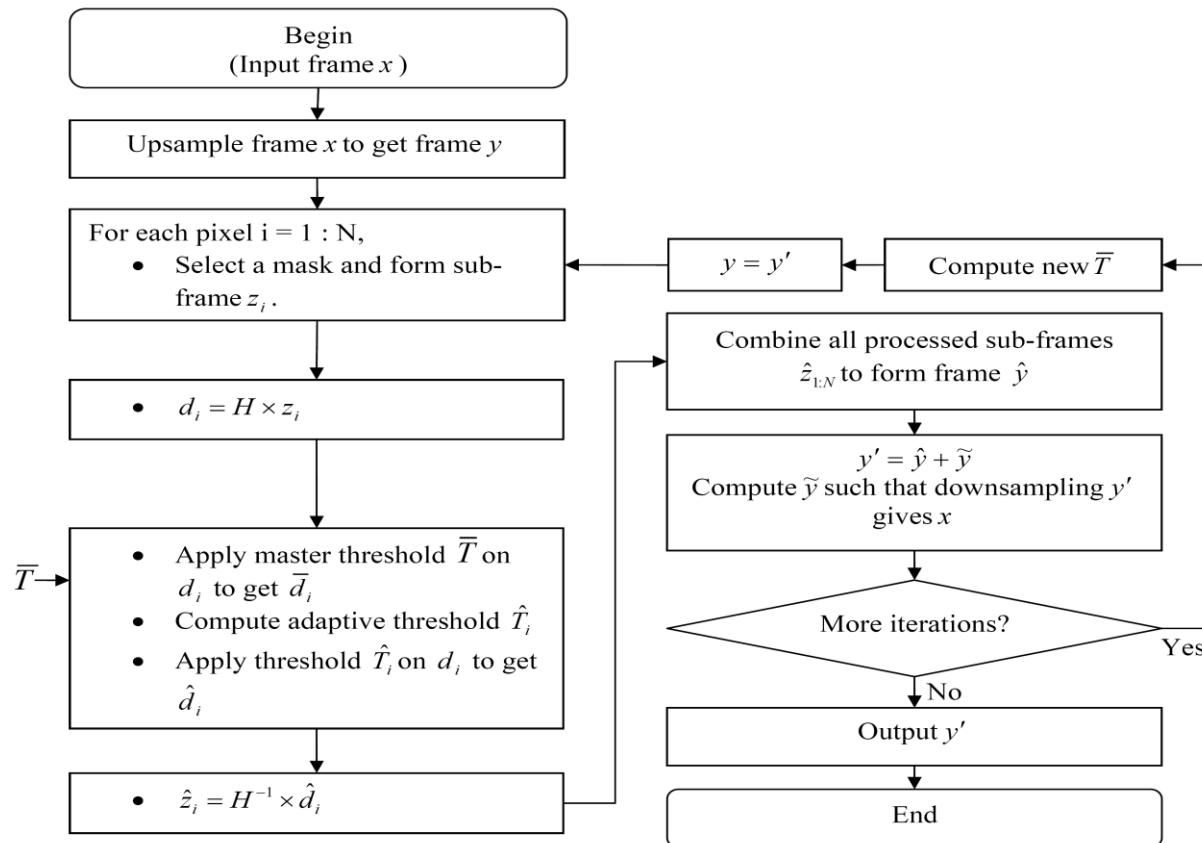
$c_i = g_i^T u$  — коэффициенты преобразования

$$u = \sum_{i=1}^N c_i g_i$$

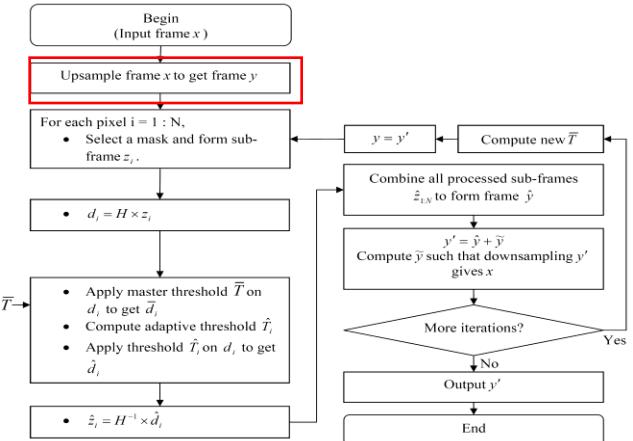
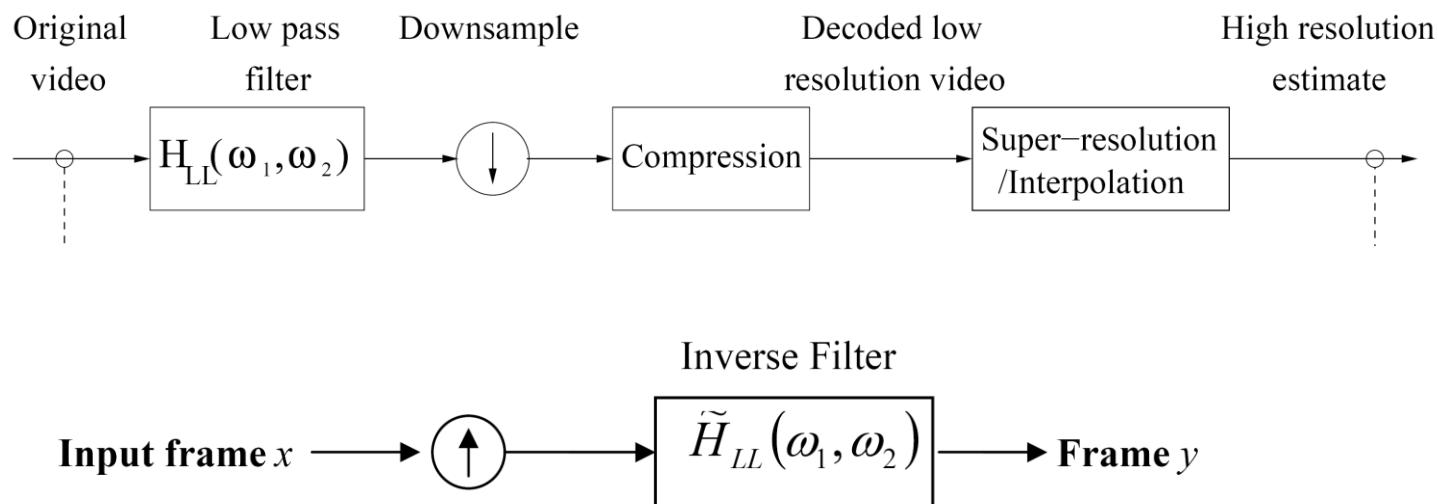
$$u = \sum_{i \in S(u, K)} c_i g_i + \sum_{i \notin S(u, K)} c_i g_i \approx \sum_{i \in S(u, K)} c_i g_i$$

$S(u, K)$  —  $K$  наибольших коэффициентов разложения

# SWAT

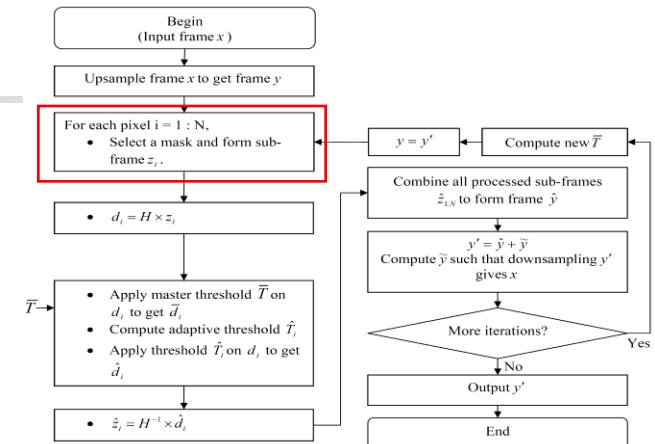
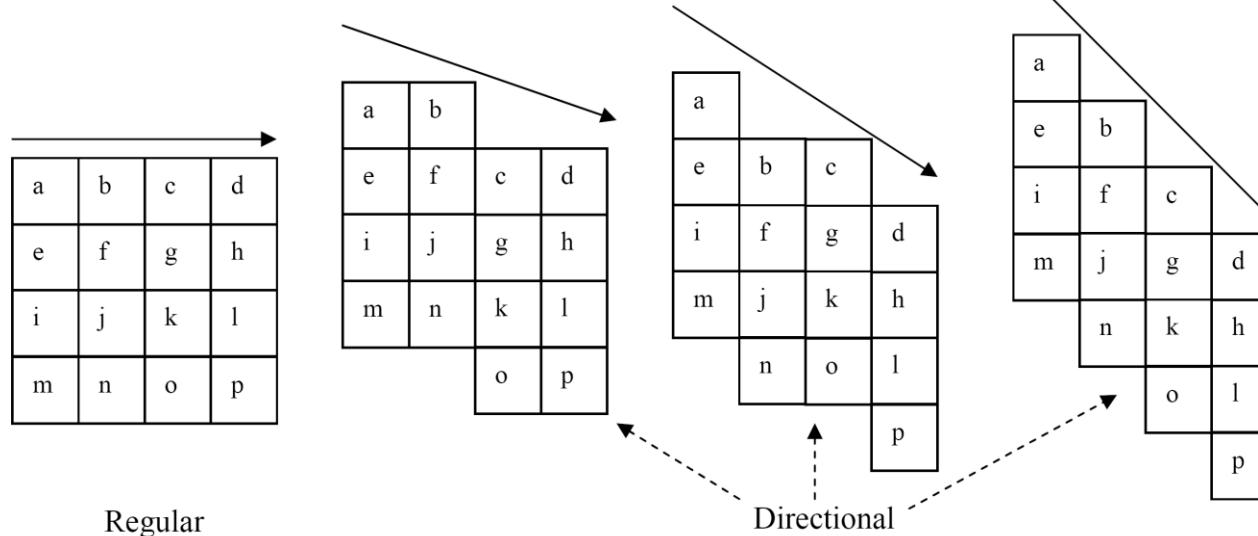


# SWAT



# SWAT

- Изображение разбивается на блоки 4x4
- Для каждого блока выбирается подходящая маска



# SWAT

$\bar{T}$  — главный порог

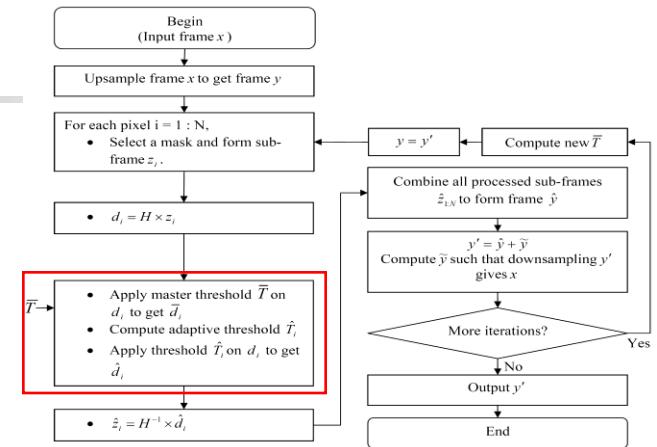
$$\overline{d}_i = \begin{cases} d_i, & |d_i| > \bar{T} \\ 0, & |d_i| \leq \bar{T} \end{cases}$$

$$\hat{T}_i = \bar{T} \times f \left( \|d_i - \overline{d}_i\|_2^2 \right)$$

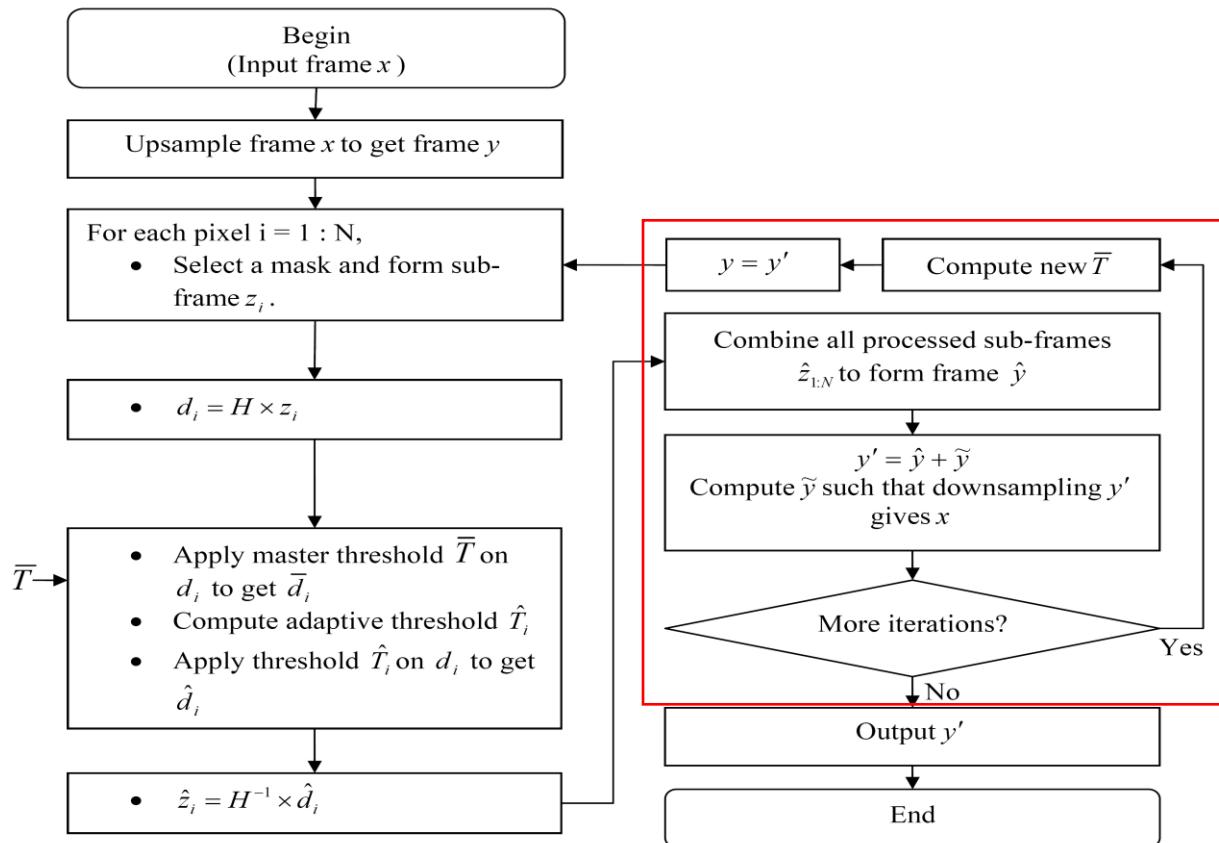
$$\hat{d}_i = \begin{cases} d_i, & |d_i| > \hat{T}_i \\ 0, & |d_i| \leq \hat{T}_i \end{cases}$$

$$f(0) = 1, f(\infty) = 0$$

Fast super-resolution reconstructions of mobile video using warped transforms and adaptive thresholding, Sandeep Kanumuri, Onur G. Guleryuz, M. Reha Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007

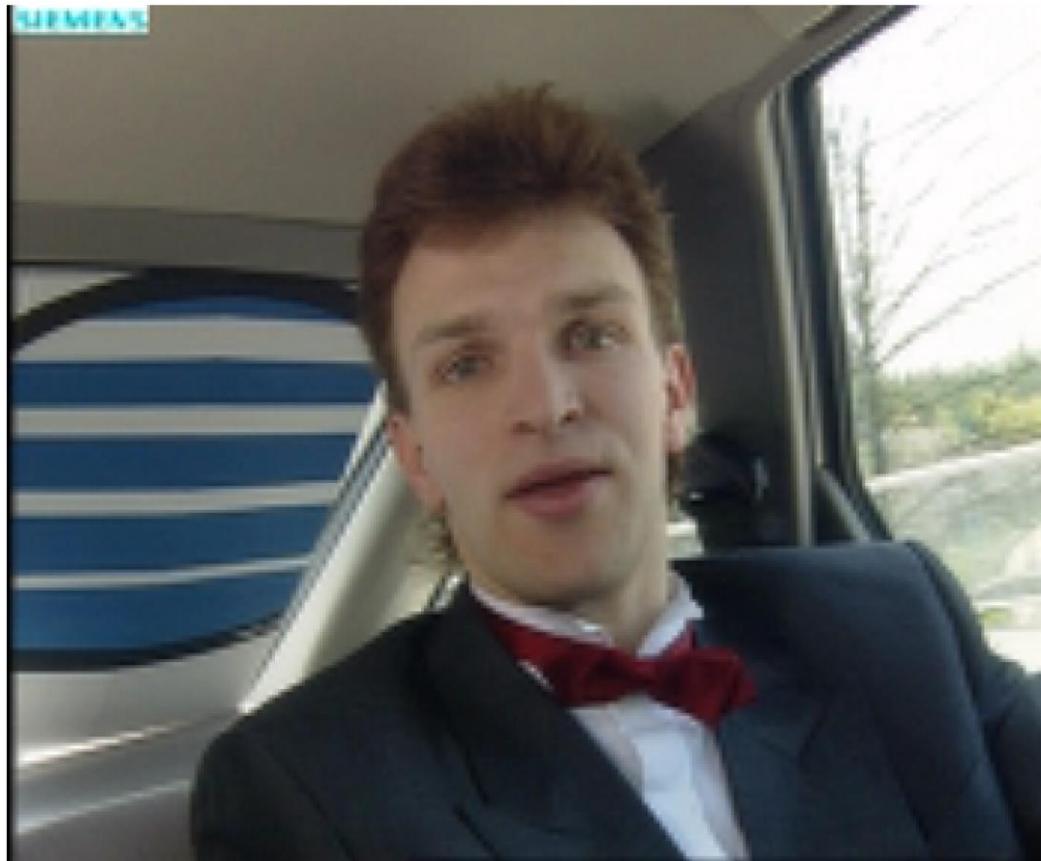


# SWAT



# SWAT

## Результаты

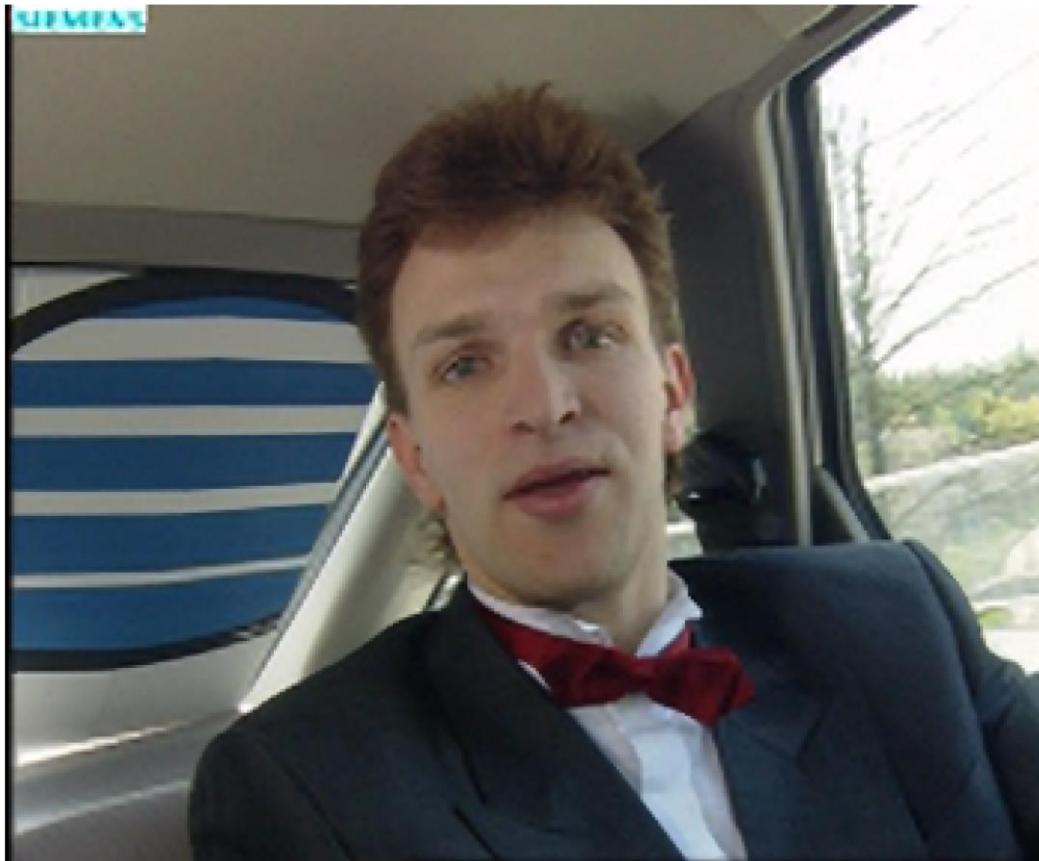


Билинейная интерполяция  
(несжатое видео)

Fast super-resolution reconstructions of mobile video using warped transforms  
and adaptive thresholding, Sandeep Kanumuri, Onur G. Guleryuz, M. Reha  
Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007

# SWAT

## Результаты

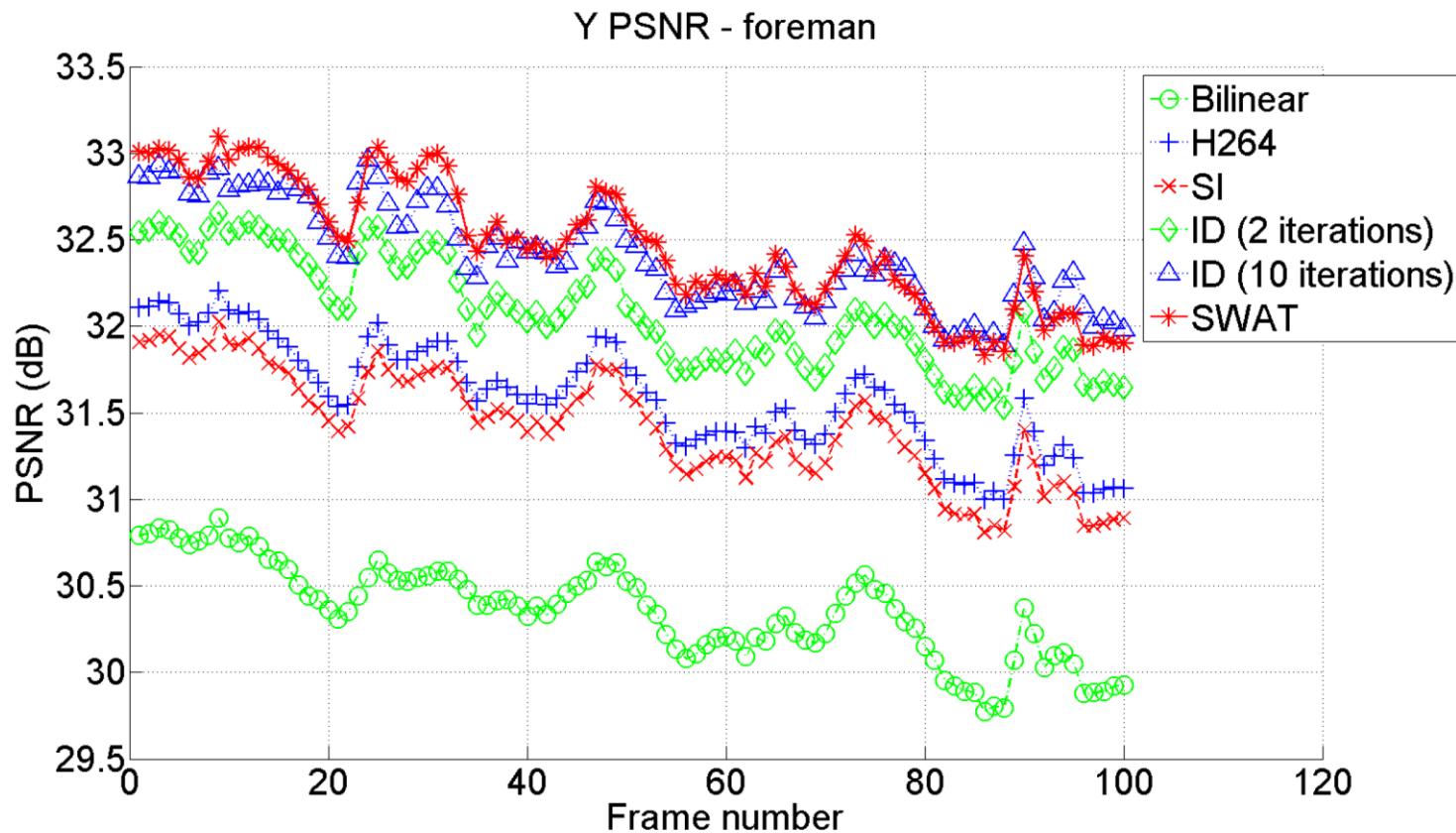


Результат обработки  
(несжатое видео)

Fast super-resolution reconstructions of mobile video using warped transforms  
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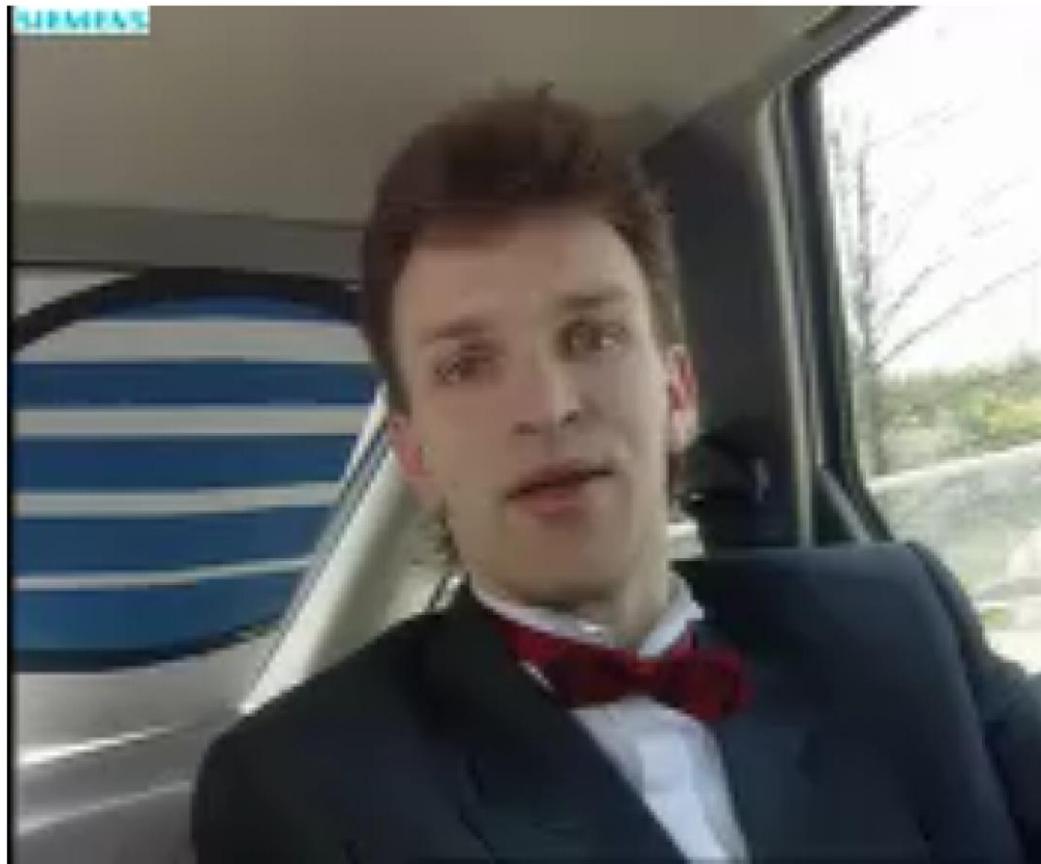


(несжатое видео)

Fast super-resolution reconstructions of mobile video using warped transforms and adaptive thresholding, Sandeep Kanumuri, Onur G. Guleryuz, M. Reha Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007

# SWAT

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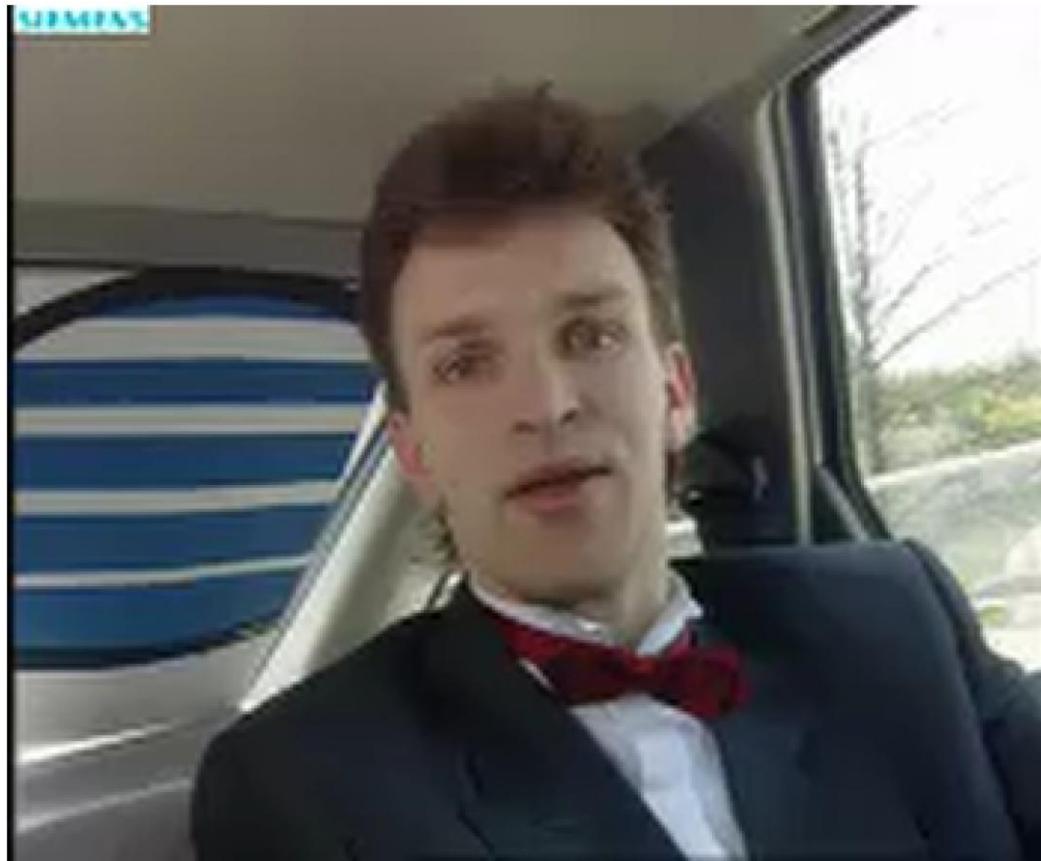


Сжатое видео (H.264, QP=25)

Fast super-resolution reconstructions of mobile video using warped transforms and adaptive thresholding, Sandeep Kanumuri, Onur G. Guleryuz, M. Reha Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007

# SWAT

## Результаты

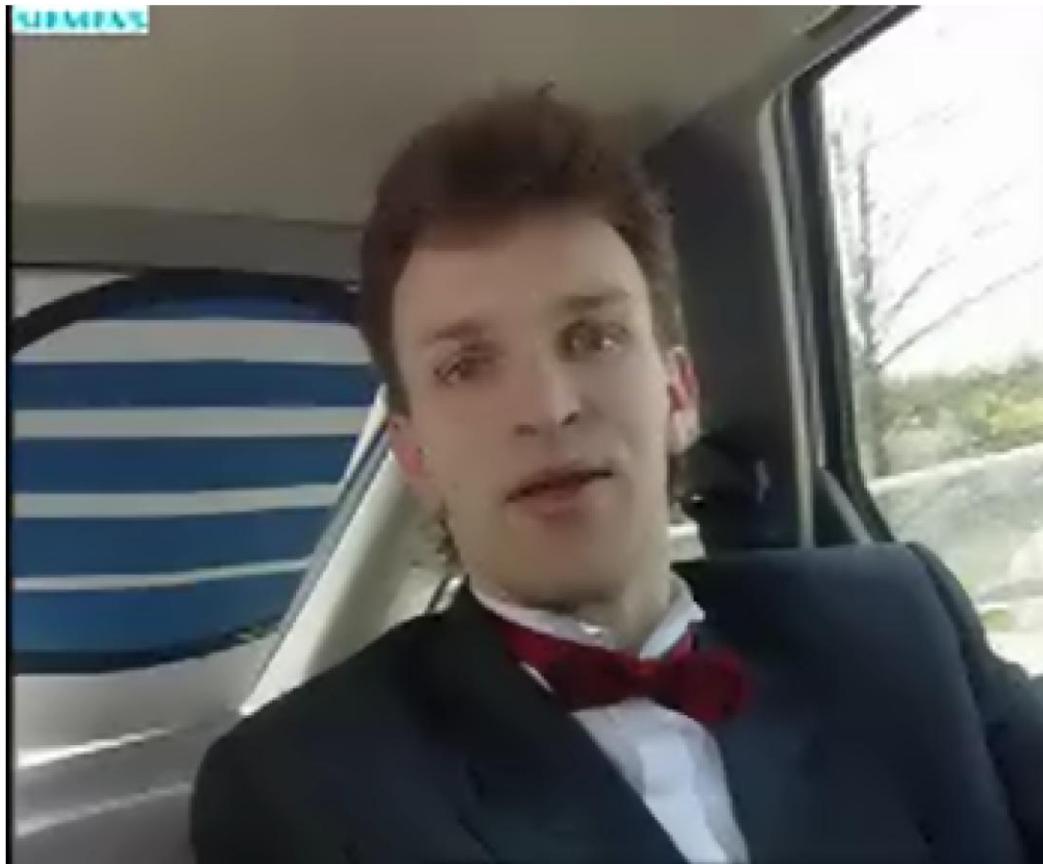


H.264 интерполяция

Fast super-resolution reconstructions of mobile video using warped transforms and adaptive thresholding, Sandeep Kanumuri, Onur G. Guleryuz, M. Reha Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007

# SWAT

## Результаты



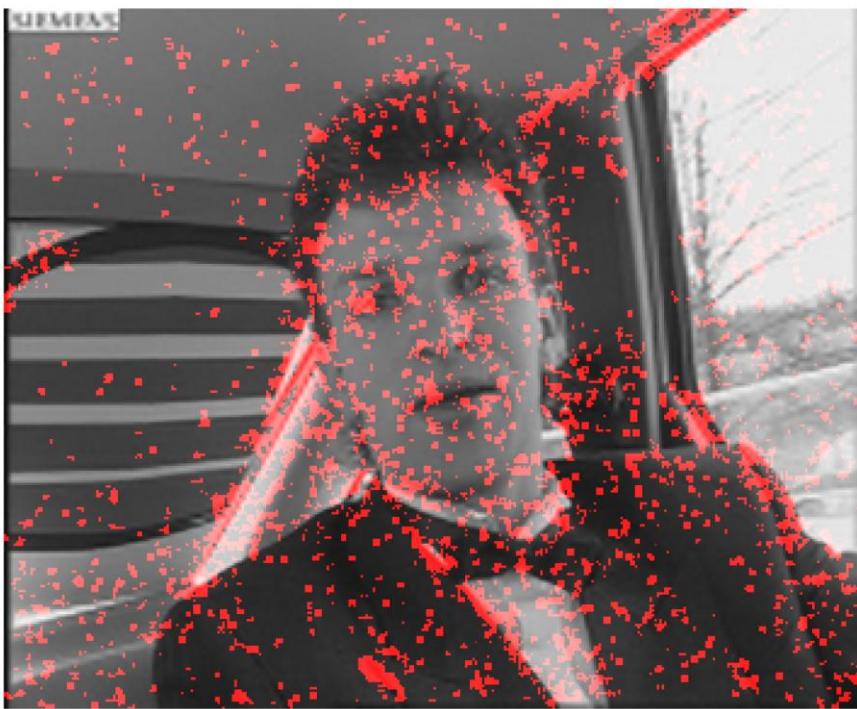
Предложенный метод

Fast super-resolution reconstructions of mobile video using warped transforms and adaptive thresholding, Sandeep Kanumuri, Onur G. Guleryuz, M. Reha Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007

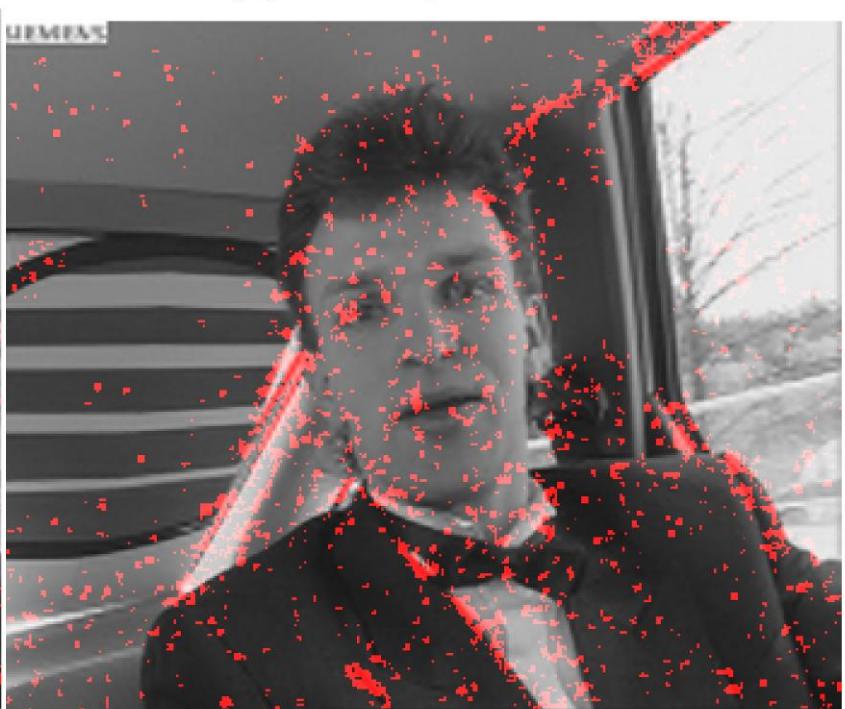
# SWAT

## Результаты

(a) 0.5dB improvement



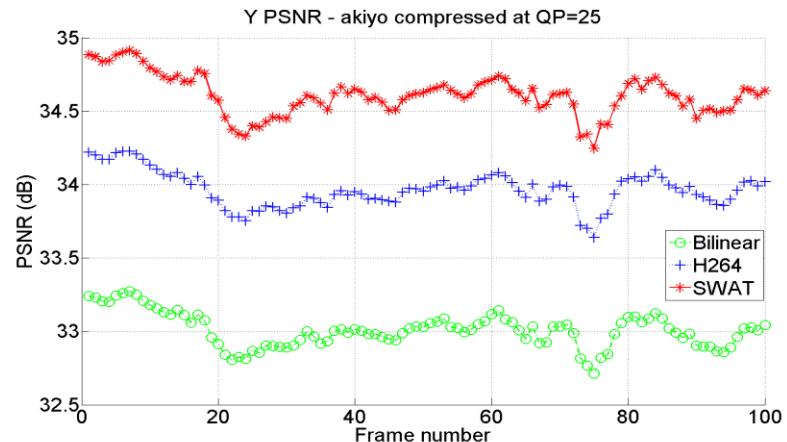
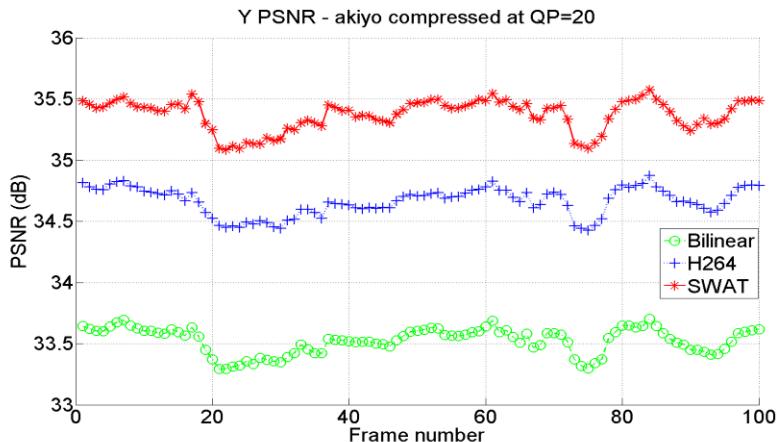
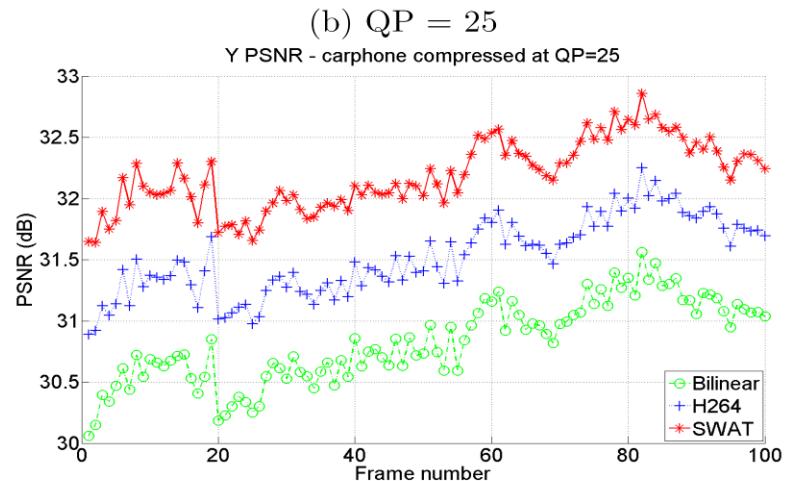
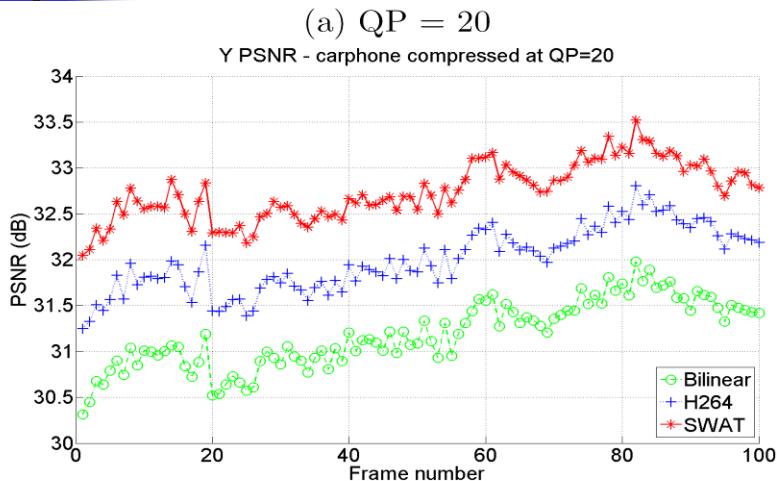
(b) 1dB improvement



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Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007

# SWAT

## Результаты



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# Содержание

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- **Adaptive Fuzzy Filtering**
- Заключение

# Adaptive Fuzzy Filtering

Обычный фильтр:

$$y[m, n] = \sum_{[m', n'] \in \Omega} h(x[m + m', n + n'], x[m, n]) \times x[m + m', n + n']$$

х — исходное изображение

у — результат

h — весовая функция

$$y[m, n] = \frac{\sum_{[m', n'] \in \Omega} h(x[m + m', n + n'], x[m, n]) x[m + m', n + n']}{\sum_{[m', n'] \in \Omega} h(x[m + m', n + n'], x[m, n])}$$

# Adaptive Fuzzy Filtering

## ■ Свойства

$$\lim_{|x[m+m', n+n'] - x[m, n]| \rightarrow 0} h(x[m+m', n+n'], x[m, n]) = 1$$

$$\lim_{|x[m+m', n+n'] - x[m, n]| \rightarrow \infty} h(x[m+m', n+n'], x[m, n]) = 0$$

$$h(x[m + m'_1, n + n'_1], x[m, n]) \geq h(x[m + m'_2, n + n'_2], x[m, n])$$

$$\text{if } |x[m + m'_1, n + n'_1] - x[m, n]| \leq |x[m + m'_2, n + n'_2] - x[m, n]|$$

## ■ Пример

$$h(x[m + m', n + n'], x[m, n]) = \exp\left(-\frac{(x[m + m', n + n'] - x[m, n])^2}{2\sigma^2}\right)$$

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
 Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 21  
 on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

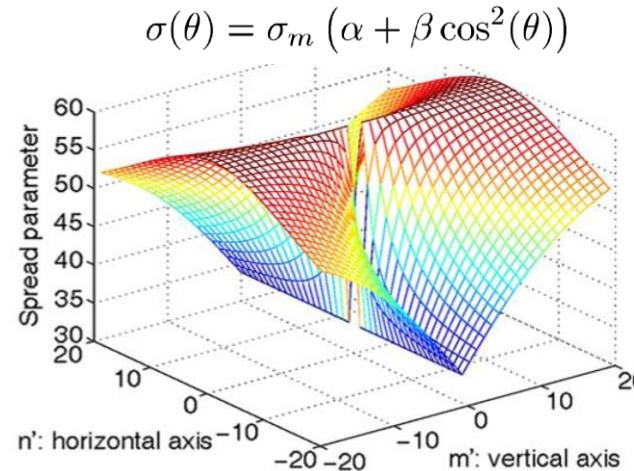
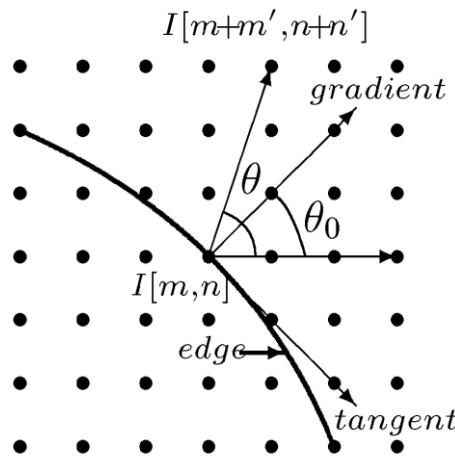
## Геометрическая зависимость

$$\sigma(x[m + m', n + n'], x[m, n]) = K[m + m', n + n'] \times \sigma_m[m, n]$$

$\sigma$  — вес

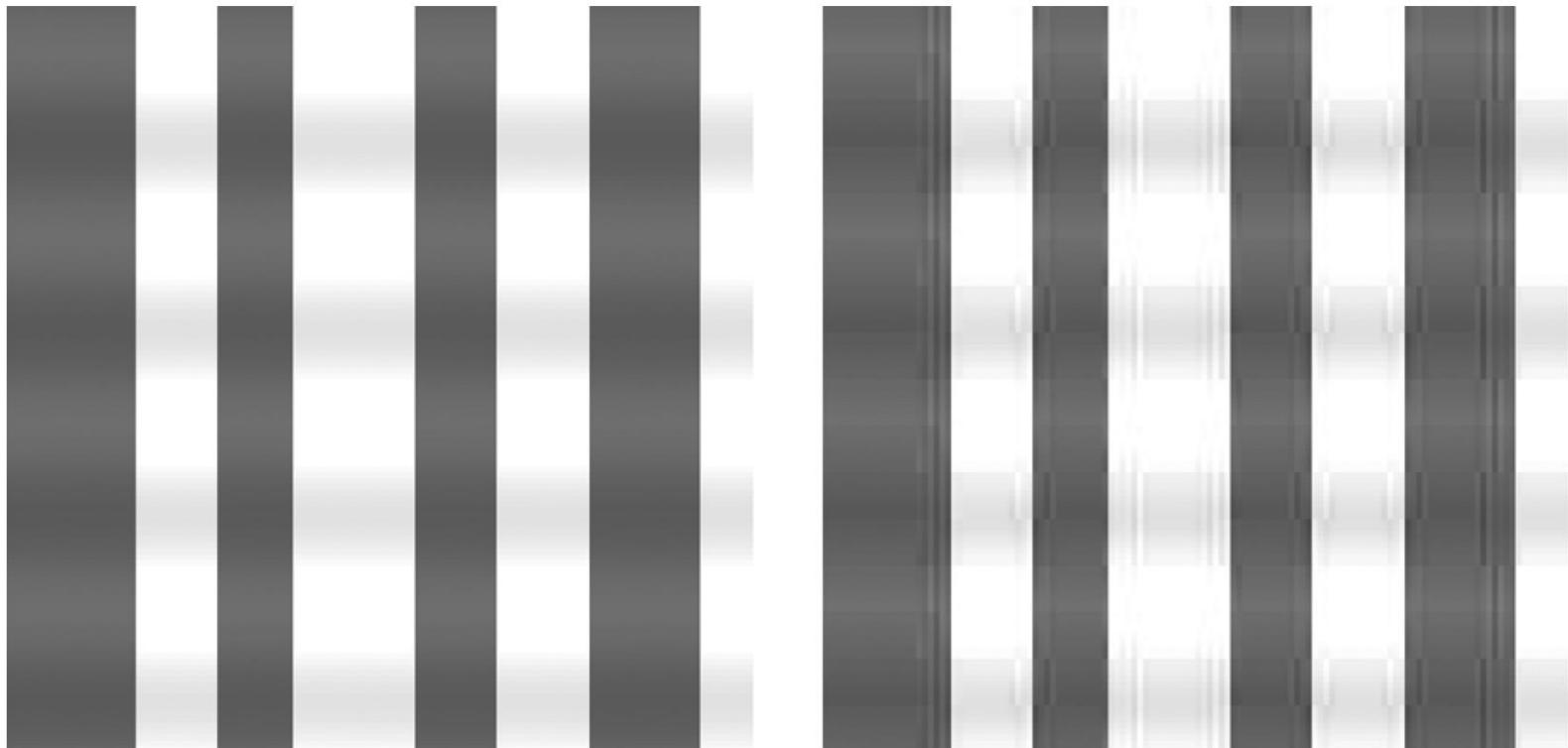
$\sigma_m$  — зависимость от положения

$K$  — зависимость от направления



# Adaptive Fuzzy Filtering

## Пример



исходное  
изображение

сжатое  
изображение

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 23  
on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

$$\sigma(x[m + m', n + n'], x[m, n]) = K[m+m', n+n'] \times \sigma_m[m, n]$$

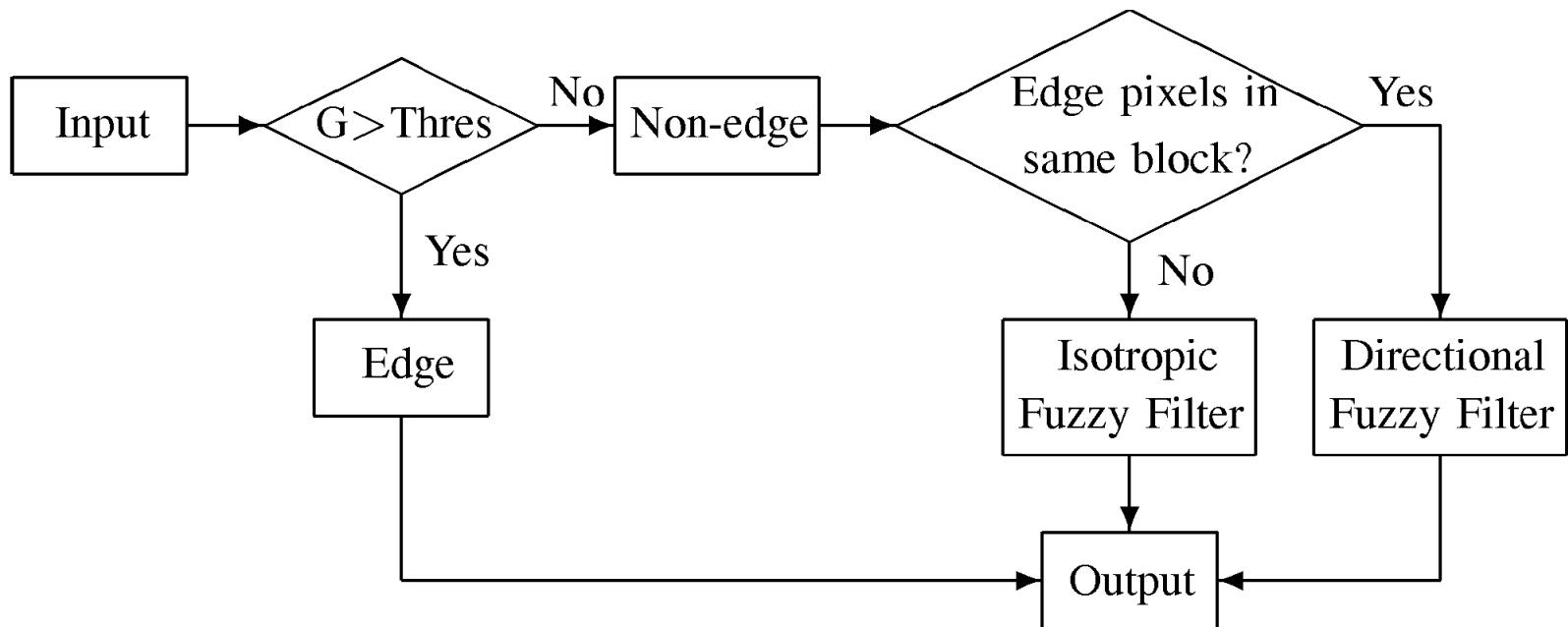
ЗАВИСИМОСТЬ ОТ ПОЛОЖЕНИЯ:

$$\sigma_m[m, n] = \sigma_0 \left( (1 - \gamma) \left( \frac{STD(I[m, n]) - STD_{\min}}{STD_{\max} - STD_{\min}} \right) + \gamma \right)$$

$STD$  – стандартное отклонение в окрестности

# Adaptive Fuzzy Filtering

## Directional Fuzzy Filter



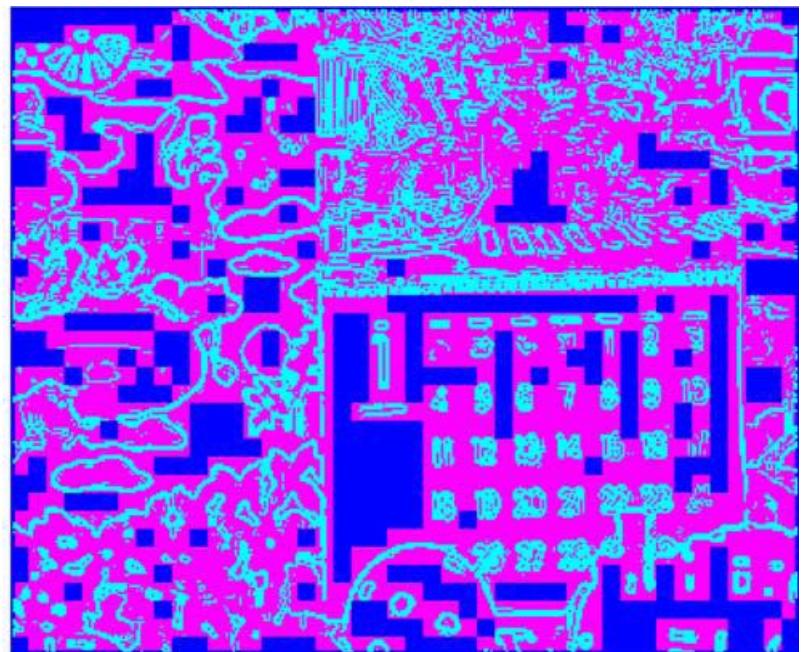
### Directional Fuzzy Filter

# Adaptive Fuzzy Filtering

## Directional Fuzzy Filter



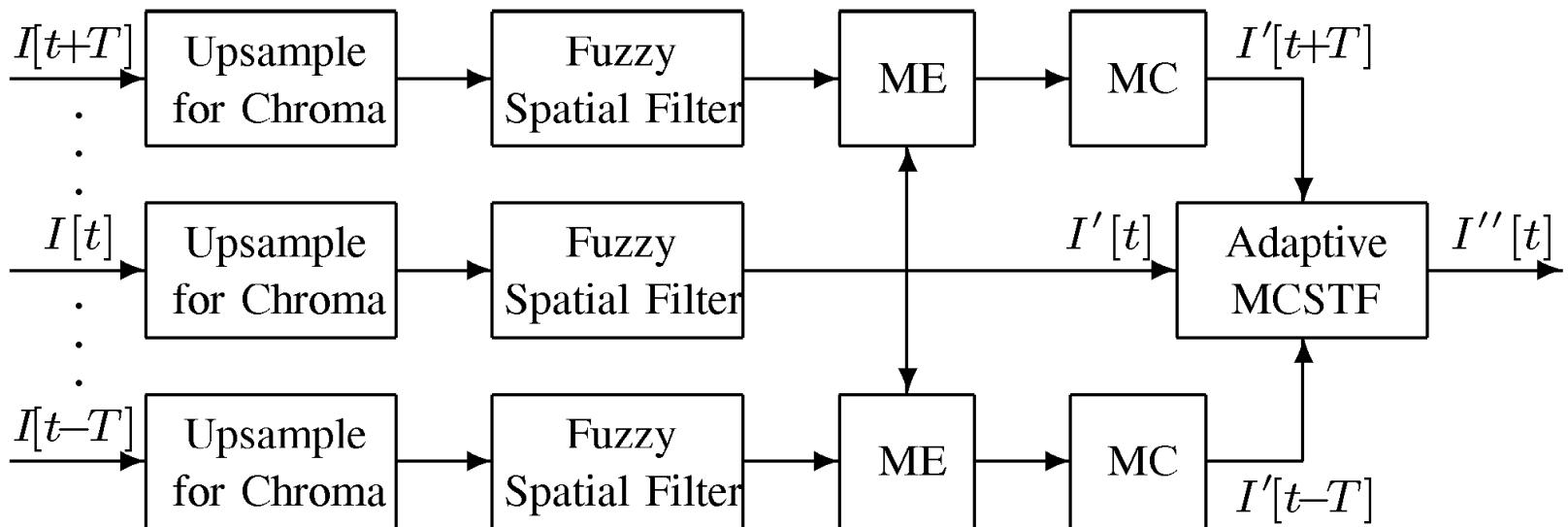
сжатое видео



классификация блоков

# Adaptive Fuzzy Filtering

## Spatiotemporal Filter



Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 27  
on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Spatiotemporal Filter

$$I''[t, m, n] = \frac{\sum_{[t', m', n'] \in \Omega} h[t', m', n'] I'[t + t', m + m', n + n']}{\sum_{[t', m', n'] \in \Omega} h[t', m', n']}$$

$$h[t', m', n'] = \exp \left( -\frac{(I'[t + t', m + m', n + n'] - I'[t, m, n])^2}{2\sigma^2[t', m', n']} \right)$$

# Adaptive Fuzzy Filtering

## Spatiotemporal Filter

$$\sigma[t', m', n'] = K[t', m', n'] \times \sigma_m[m, n]$$

Корреляция  $K[t', m', n'] = \frac{\sigma_{12}}{\sigma_1 \sigma_2}$

$$\sigma_{12} = \frac{\sum_{[m_0, n_0] \in V} I'[t + t', m + m' + m_0, n + n' + n_0] \times I'[t, m + m_0, n + n_0]}{\sqrt{\sum_{[m_0, n_0] \in V} I'[t + t', m + m' + m_0, n + n' + n_0]^2}}$$

# Adaptive Fuzzy Filtering

## Результаты



PSNR:

Sequences	4Q	Chen	Liu	Conventional Fuzzy	Adaptive Fuzzy
News	27.48	27.58	27.55	27.94	<b>28.05</b>
Silent	27.84	28.37	28.33	28.33	<b>28.58</b>
Foreman	28.06	28.46	28.41	28.78	<b>28.87</b>
Mobile	21.22	20.96	21.13	21.50	<b>21.55</b>
Mother	31.02	31.83	31.62	31.77	<b>32.00</b>
Paris	23.38	23.25	23.31	23.80	<b>23.84</b>
Average gain		0.2433	0.2267	0.5200	<b>0.6483</b>

# Adaptive Fuzzy Filtering

## Результаты



Оригинал

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
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on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Результаты



Сжатое изображение

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
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on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Результаты

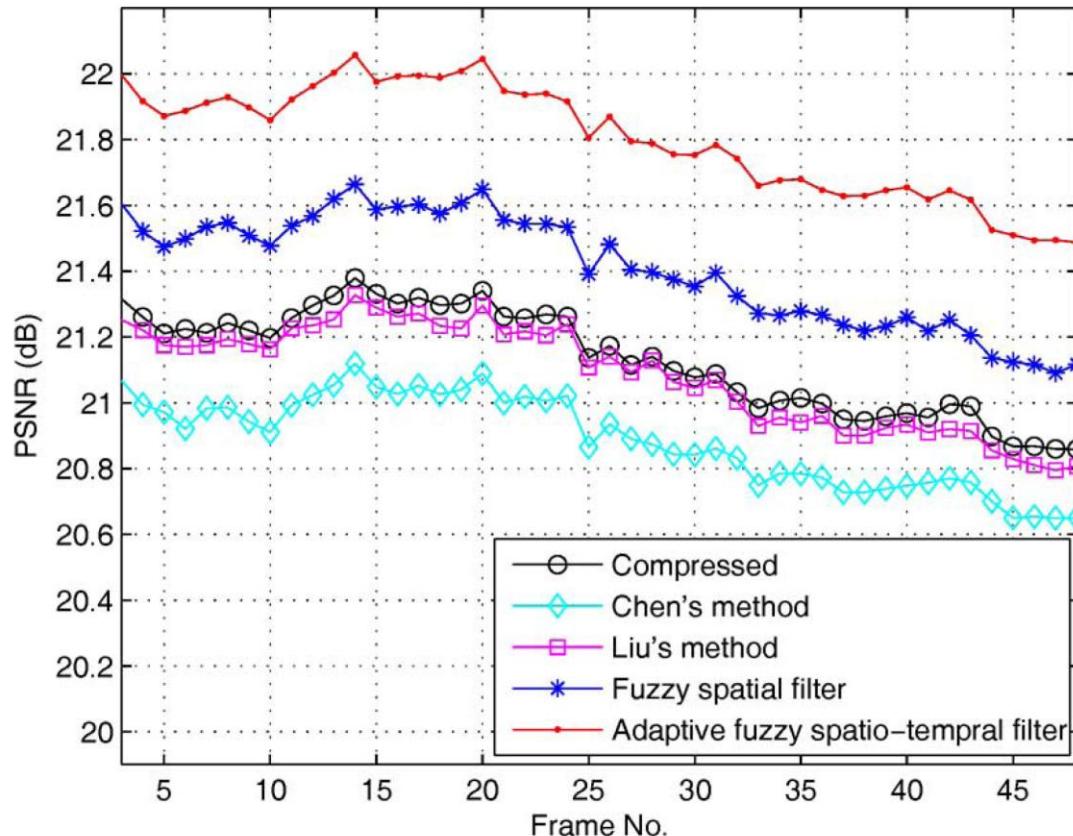


Восстановленное изображение

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 33  
on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Результаты



Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
 Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 34  
 on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Результаты



Оригинал

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 35  
on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Результаты



Сжатое изображение (30.77 dB)

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 36  
on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Результаты



Восстановленное изображение — Fuzzy Spatial Filter(30.9 dB)

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 37  
on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178

# Adaptive Fuzzy Filtering

## Результаты

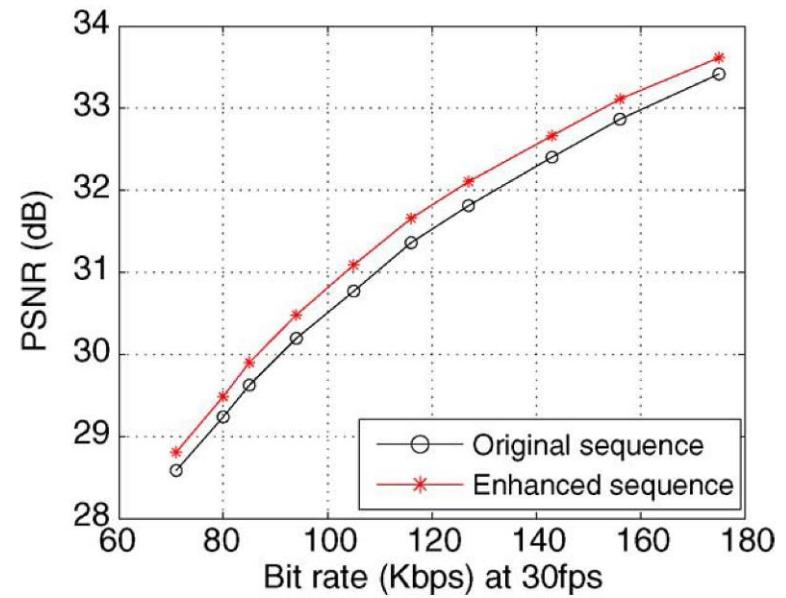
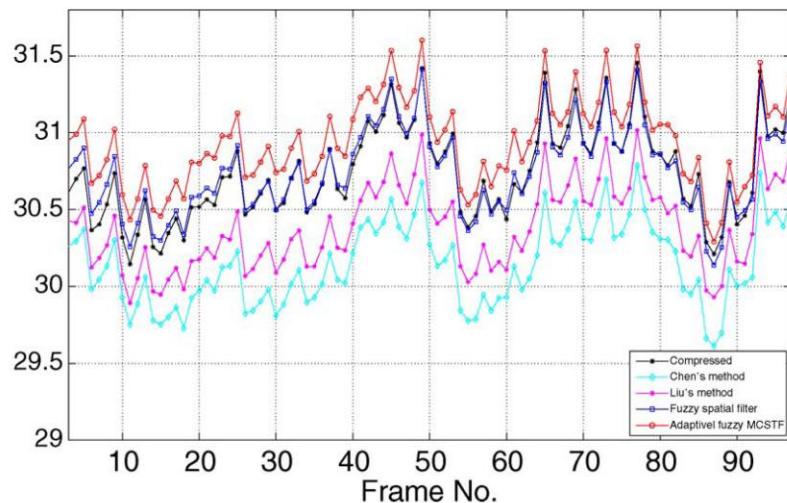


Восстановленное изображение — предложенный метод (31.09 dB)

Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 38  
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## Результаты



Adaptive fuzzy filtering for artifact reduction in compressed images and videos,  
Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions 39  
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# Содержание

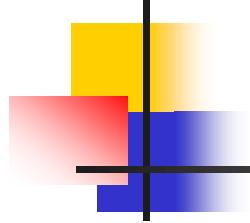
- Введение
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# Заключение

- Были рассмотрены два алгоритма
- Алгоритмы рассчитаны на высокую скорость работы

# Литература

- **Adaptive fuzzy filtering for artifact reduction in compressed images and videos**, Dung T. Võ, Truong Q. Nguyen, Sehoon Yea, Anthony Vetro, IEEE Transactions on Image Processing, Volume 18 , Issue 6 (June 2009), pp. 1166-1178
- **Fast super-resolution reconstructions of mobile video using warped transforms and adaptive thresholding**, Sandeep Kanumuri, Onur G. Guleryuz, M. Reha Civanlar, SPIE Conf. on Applications of Digital Image Processing XXX, 2007



# Вопросы

