

**Usableness improving for the nonlocal means  
image denoising algorithm to use it on  
low-powered embedded computing units**

**Vasiliev Boris**

2011

# Nonlocal means (NL-means) image denoising algorithm

2005г., A. Buades, B.Coll, and J.M.Morel, "A review of image denoising algorithms, with a new one", SIAM Interdisciplinary Journal, vol.4, no.2

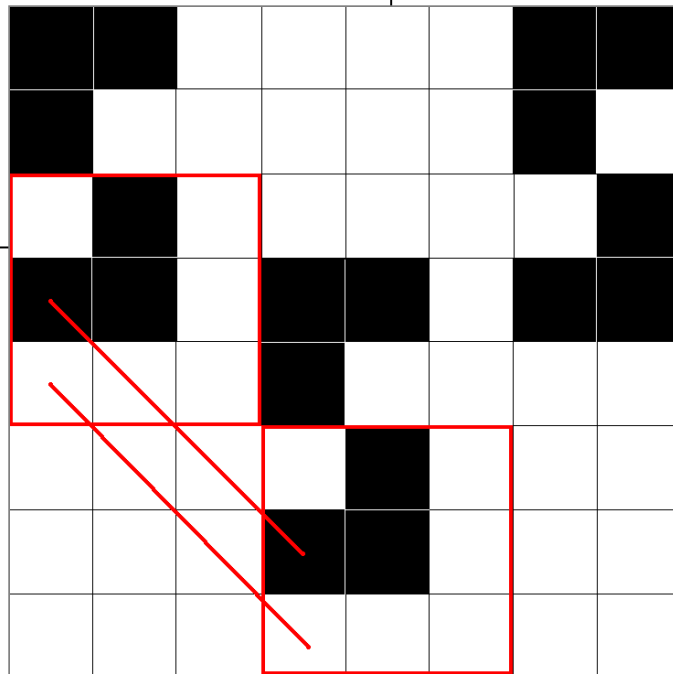


# NL-means principles

$$NL(v)(i) = \sum_{j \in I} \omega(i, j) v(j)$$

$$\omega(i, j) = \frac{1}{Z(i)} e^{-\frac{\|v(N_i) - v(N_j)\|_{2,a}^2}{h^2}}$$

$$Z(i) = \sum_j \omega(i, j)$$



# Benefits and problems

- High-effective denoising which save small details and textures
- Computationally Expensive

# Ways to solve this

- GPU – shaders using
- Masks using, weight symmetry using
- Patch preselecting

# Statistical patch preselecting



M. Mahmoudi and G. Sapiro, "Fast image and video denoising via nonlocal means of similar neighborhoods," *Signal Processing Letters*, vol. 12, no. 12, pp. 839–842, 2005.

Patch classification by the following features:

- Average mean
- Average gradient direction



# Patch preselecting by binary tree building

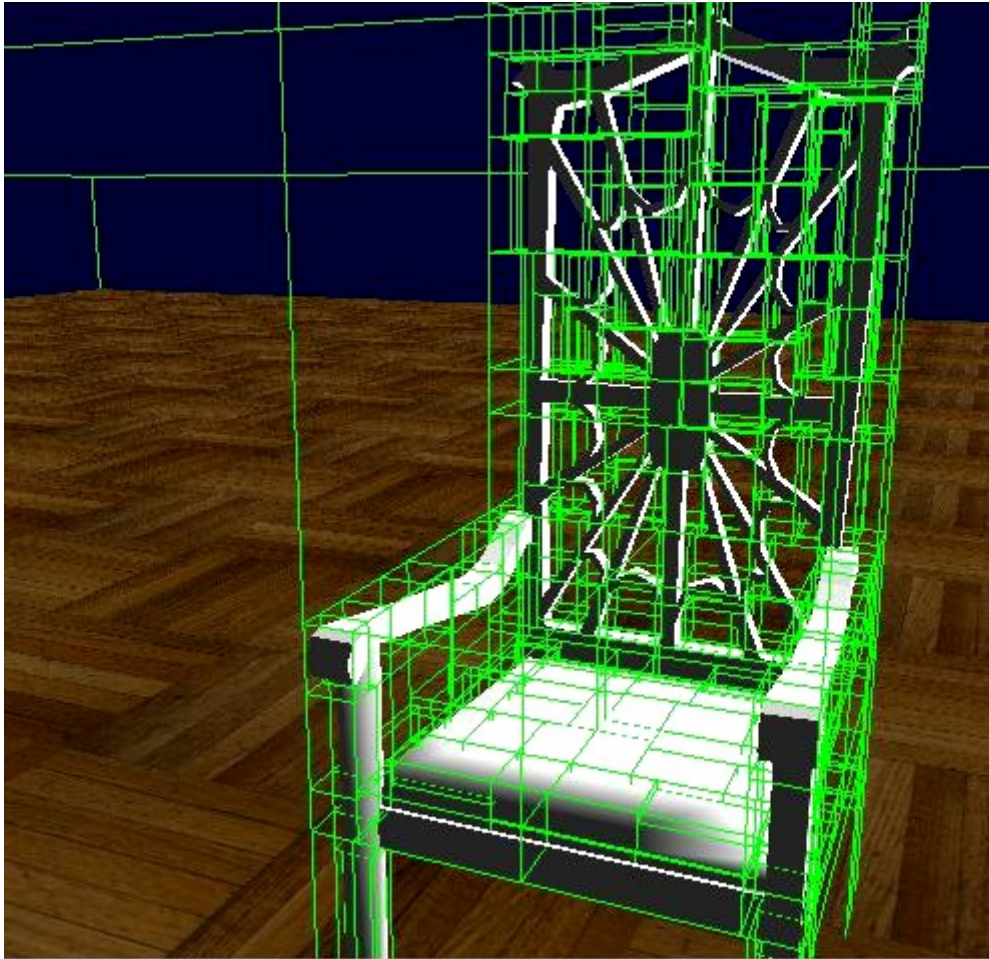
O. Kleinschmidt, T. Brox and D. Cremers,  
“Efficient nonlocal means for denoising of textural patterns,”  
IEEE Transactions on Image Processing, vol. 17, no. 7, July 2008.

- Proposed the iterational nonlocal means algorithm
- To accelerate the denoising process – build tree-like structure with patches which intended to further averaging. The tree build just **AT ONCE**

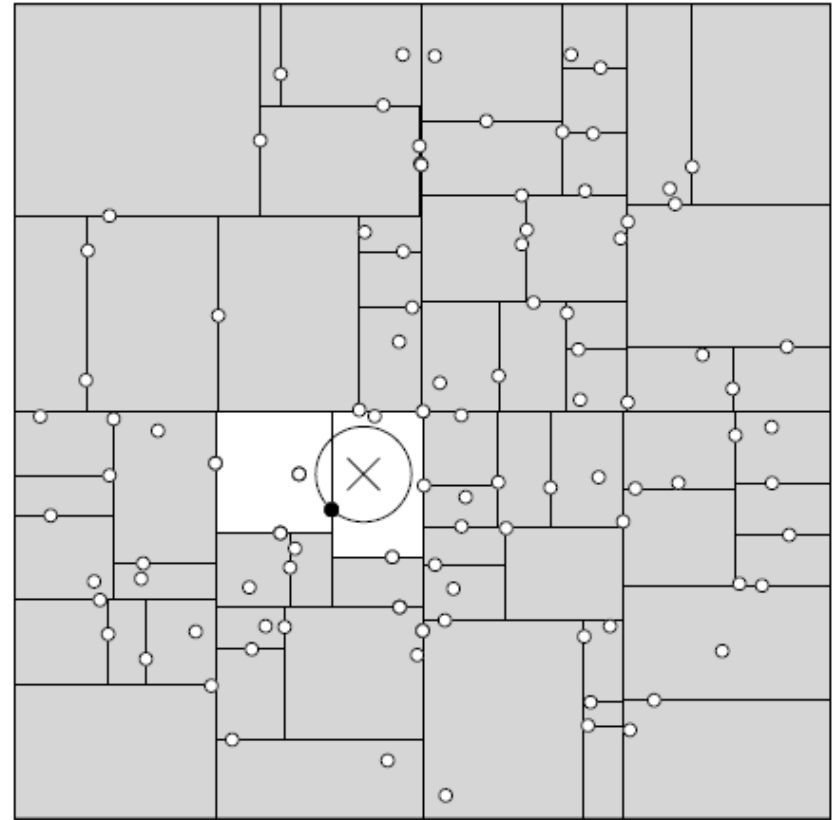




Kd-tree



3D

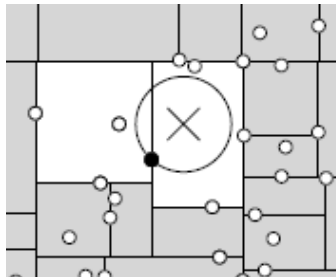


2D



# kd-tree usage effect

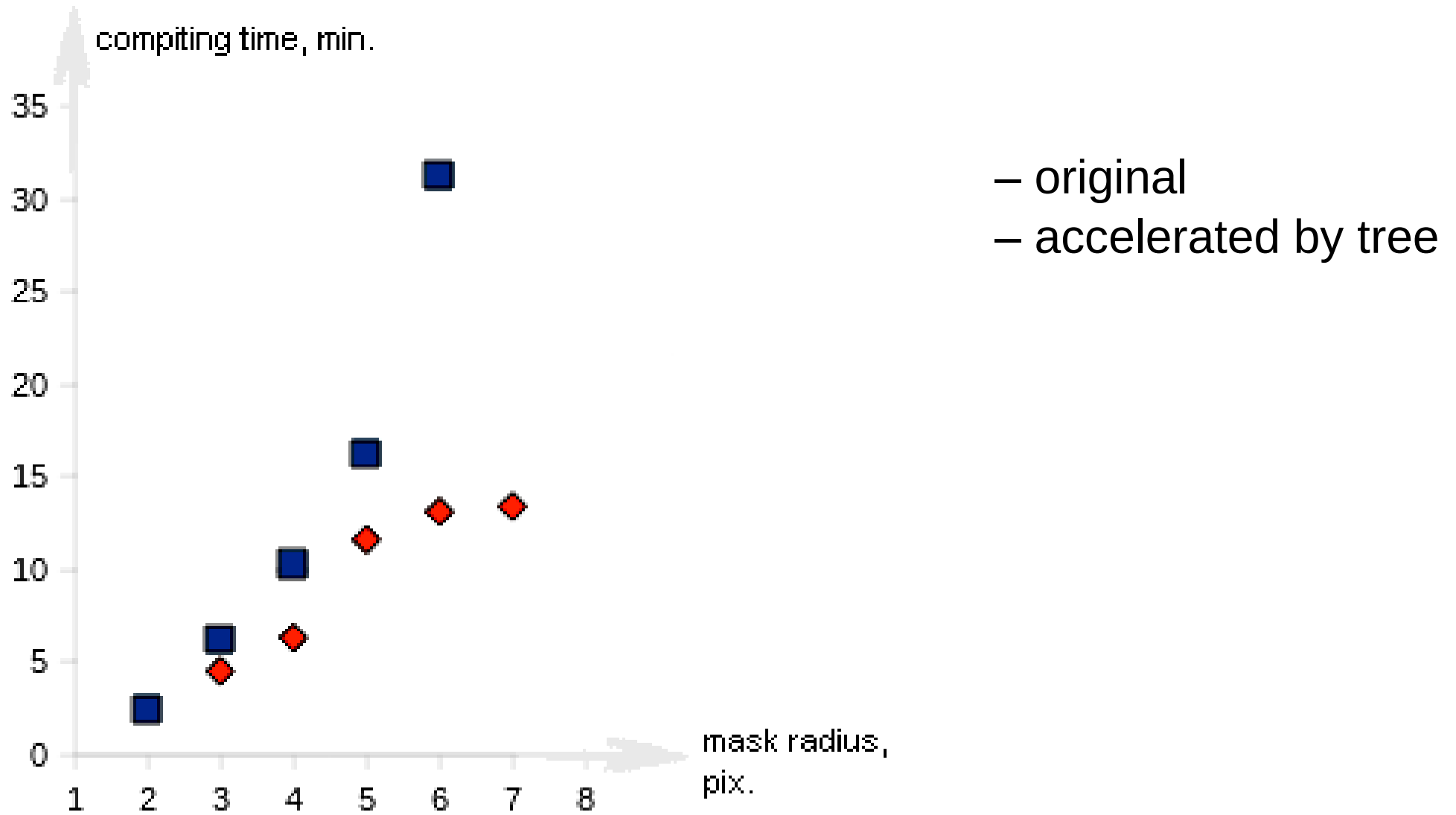
- We have separated small patches groups
- We have not more than 2d leafs patches to average mutually



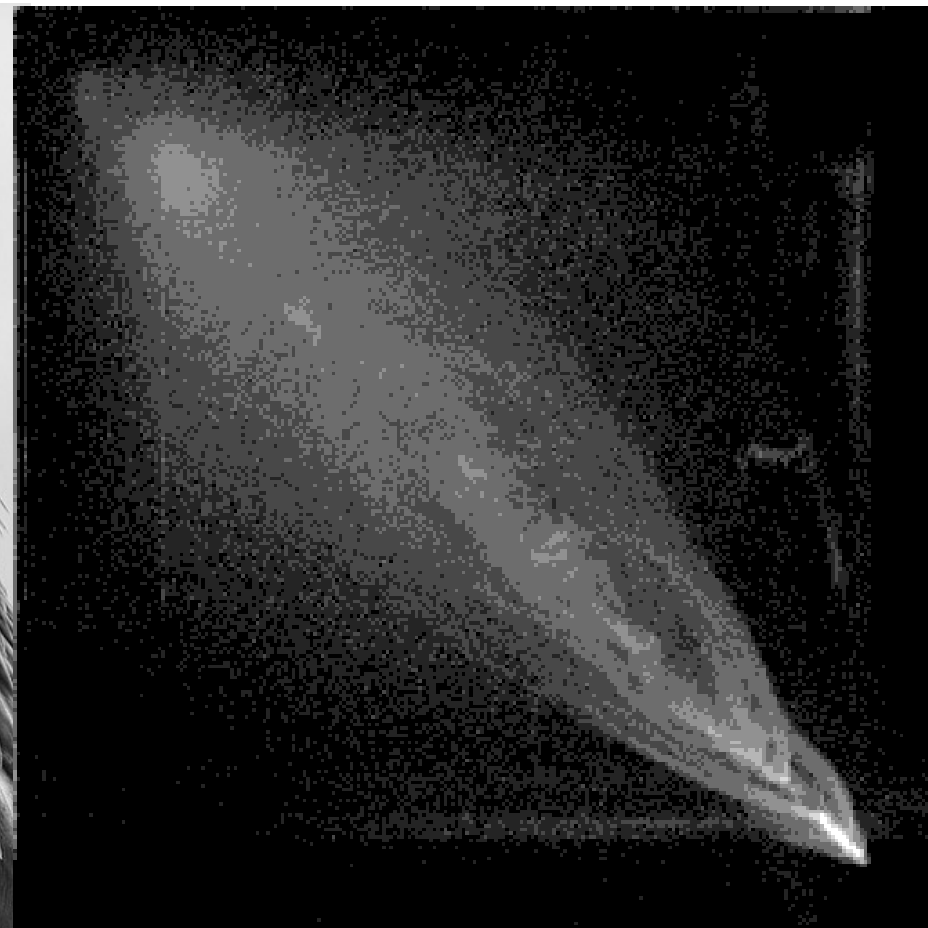
$$NL(v)(i) = \sum_{j \in I} \omega(i, j) v(j)$$

where  $I$  is similar patches subset

# Dependence computing time of mask radius



# kd-space projections



# Current plans

- rotate kd-space before kd-tree building
- use GPU
- revise tree-like structure to use

This project has suggested for the Y.M.H.I.K. contest (improving photographing quality for mobile phones).

Thank you!

Q & A