

# **HVS-INSPIRED IMAGE PROCESSING : AN OVERVIEW**

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# Outline



1. Introduction
2. Contrast
3. CSF
4. Masking Effect
5. Pooling (Fusion, Spatial Aperture)

# 1. HVS-Inspired Quality Measures Applications

- Different Technologies:  
fingerprints, mammography, digital cinema,  
close-circuit television, video on demand.  
HDR, mobile phone (camera/screen)
- Different Aims :  
quality control, compression, watermarking,  
image enhancement, segmentation, denoising,  
image retrieval.

=> Can there be a *unique* benchmark ?

# Quality Metrics : State-of-the-art

- Distortion-oriented:
  - PSNR
  - ITS Metric (Webster et al. 1993)
  - Picture Quality Scale (Miyahara et al. 1998)
  - Blockwise distortion measure (Franti, 1998)
  - UIQI (Wang & Bovik 2002) -> SSIM (Z. Wang et al. IEEE-IP 2004)
  - W\_SNR (Beghdadi & Razvan 2001)
  - VIF (Visual Information Fidelity, C. Bovik, 2008)
- Human Visual System Modelling-Based:
  - The Visible Difference Predictor (Daly, 1993)
  - Sarnoff JND Vision Model (J. Lubin, 1997)
  - Metrics developed at NASA Vision Group (Watson & Co. - 1993 to 98)
  - Metrics developed at EPFL (Switzerland)

VQEG : Video Quality Expert Group (created in 1997)

# Different Kind of Knowledge

Plausible  
Explanation

HVS

VS seen as a  
Communication Channel

Gestalt

Experiment

Modelfest

Retinex

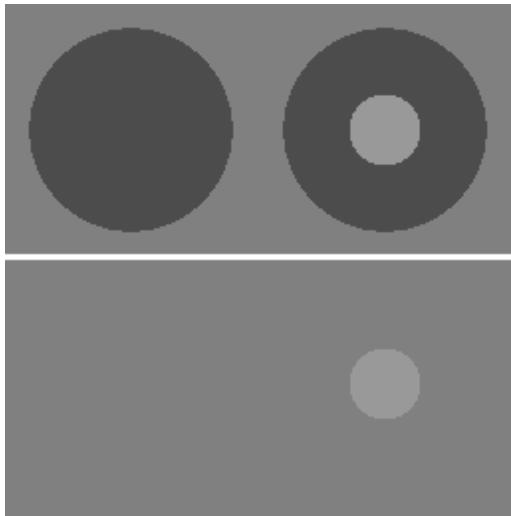
Image Databases

Expertise

Calibration  
( $\Delta E$ )

Gamut Mapping  
(color constancy)

## 2. Contrasts Versus Perceptual Spaces



Weber's Contrast  $\frac{L - L_b}{L_b}$

Peli  $\frac{BP_i(x, y)}{LP_i(x, y)} \left( = \frac{g * L}{\delta + h * L} \right)$

Weber F.  $\frac{\Delta L}{\langle L \rangle}$

Gamma Correction

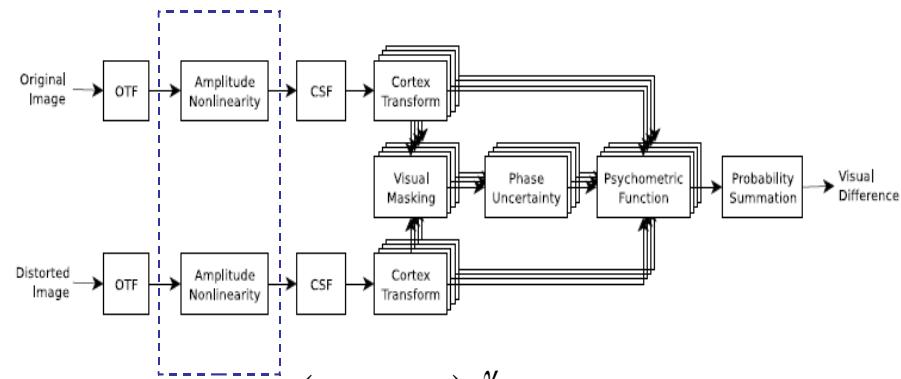
$$L^*a^*b^*$$

$$\Delta E \quad L^* = 116 * \left( \left( \frac{Y}{Y_n} \right)^{1/3} - 16 \right), qd \frac{Y}{Y_n} > 0.009$$

$\log \Delta L$

W-F zone

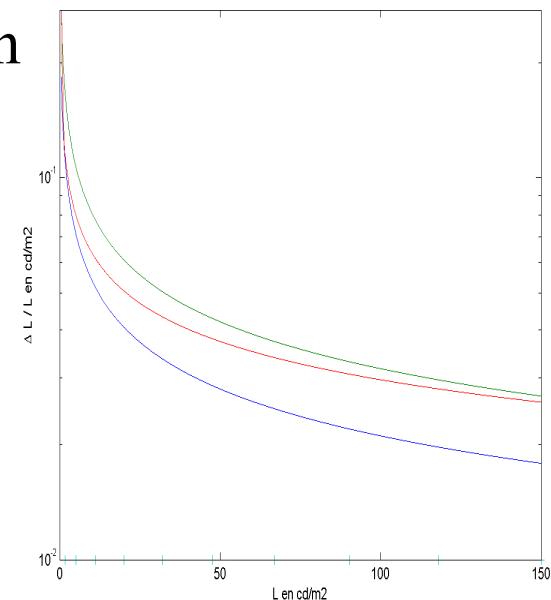
De V-R  
Zone



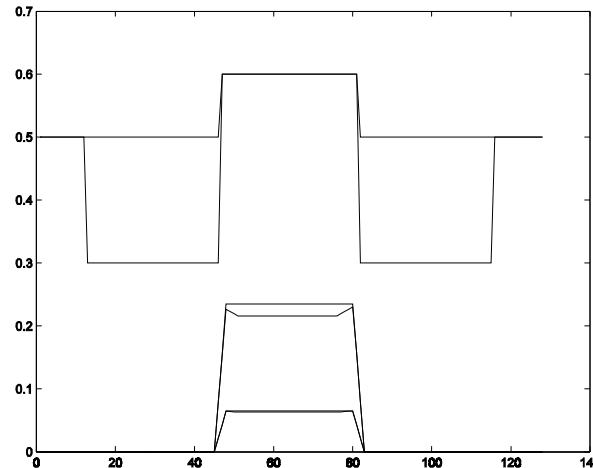
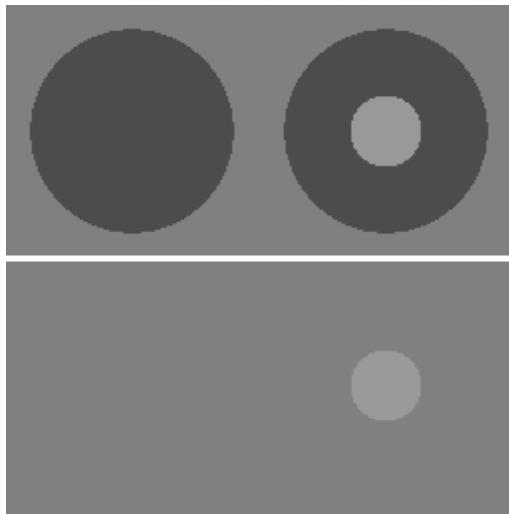
$$L = L_0 \left( \frac{g}{g_M} \right)^\gamma \quad \gamma \approx 2.3$$

Saturation zone

$\log L_B$



# Contrast // Perceptual Space



Mach Bands

Lateral Inhibition Contrast

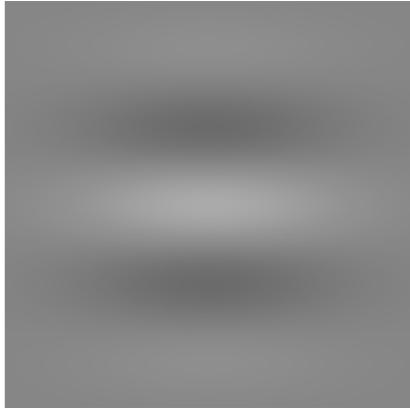
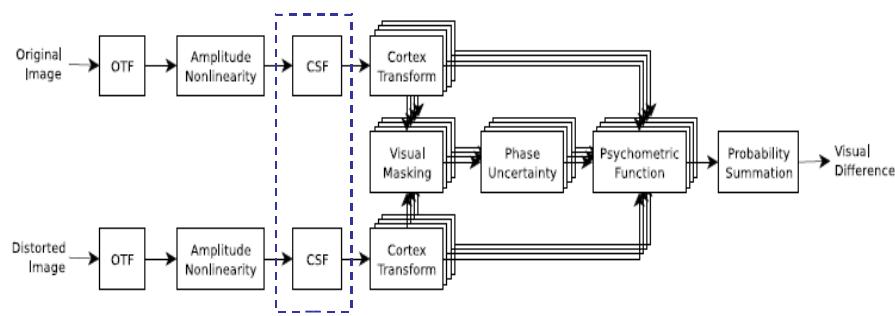
$$c = \frac{g * (L^0 - L^D)}{(\delta + h * L^O)^\alpha} \approx \frac{1}{1-\alpha} g * \left( (\delta + L^O)^{1-\alpha} - (\delta + L^D)^{1-\alpha} \right)$$

Gamma Correction  $1 - \alpha \approx 1/2.3 \Rightarrow \alpha \approx 0.57$

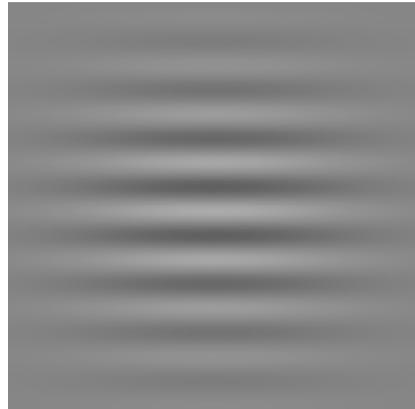
$L^*a^*b^*$   $1 - \alpha \approx 1/3 \Rightarrow \alpha \approx 0.67$

Hence,  $Q(g_0, g_0 + \Delta g \delta_{mn}) = Q(g_1, g_1 + \Delta g \delta_{mn})$

# 3. Contrast Sensitivity Function



1.12



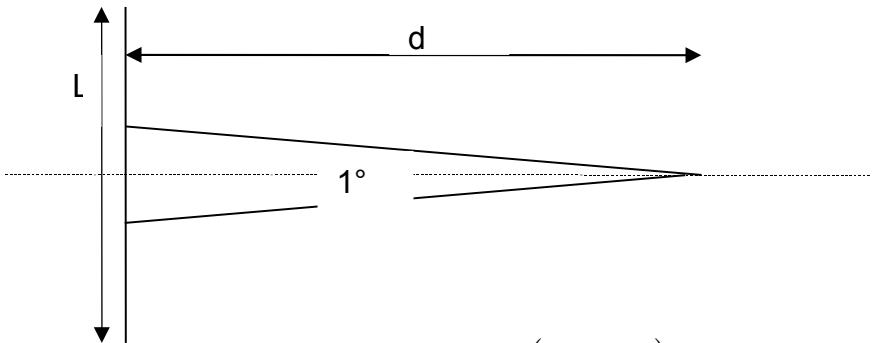
4



11.3

ModelFest (Watson)

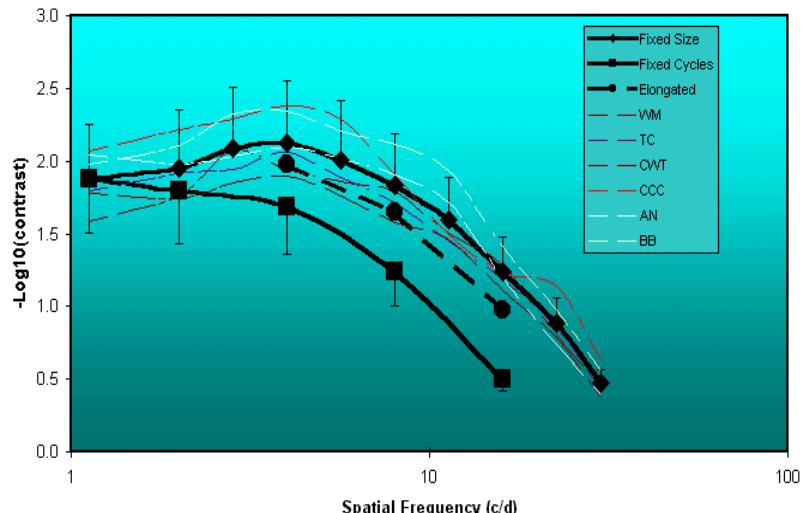
$$\sum_{i,j} \left( \frac{L_{ij}^O - L_{ij}^D}{\langle L^O \rangle} \right)^2 \leq c_T$$



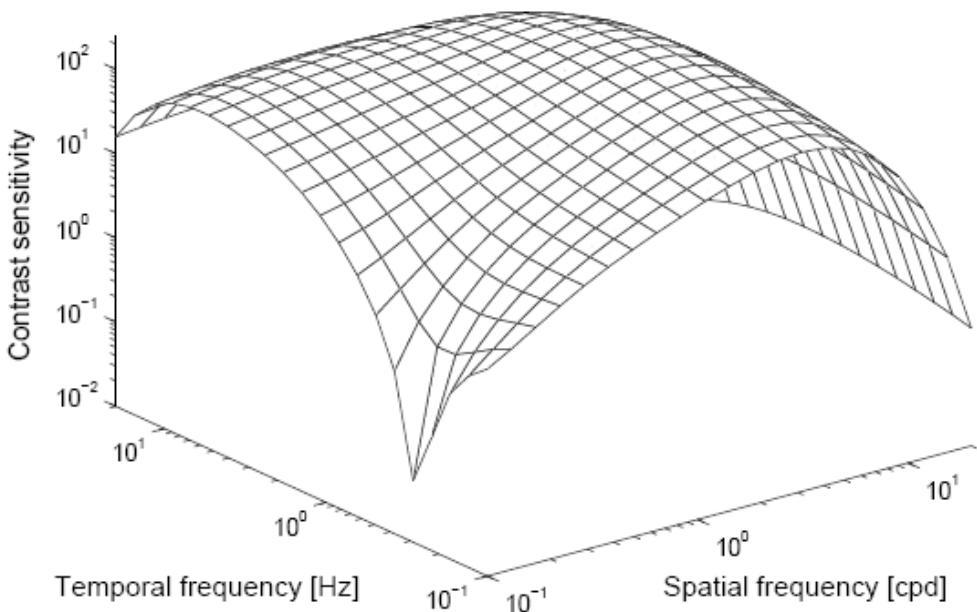
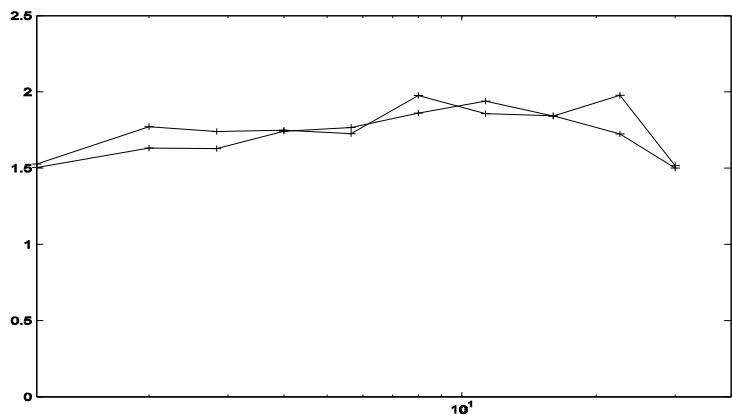
$$f_{c/d} = \frac{k2d}{L} \tan\left(\frac{\pi}{360}\right)$$

# Experimentations => CSF

MODELFEST

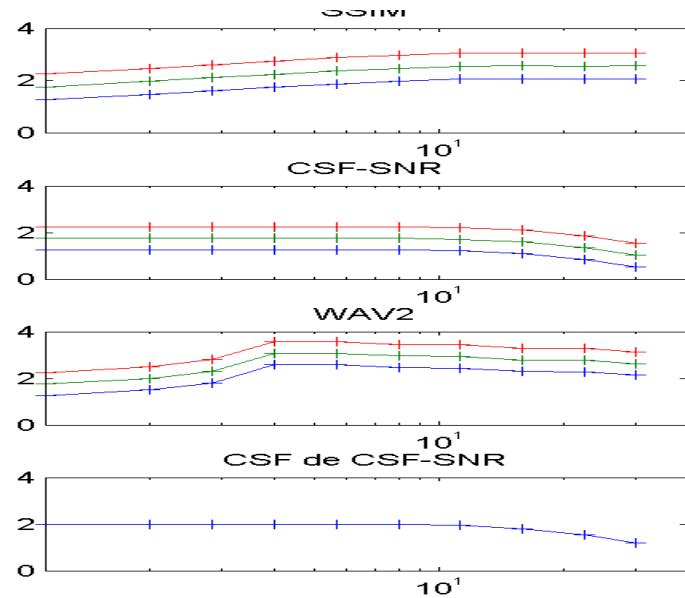
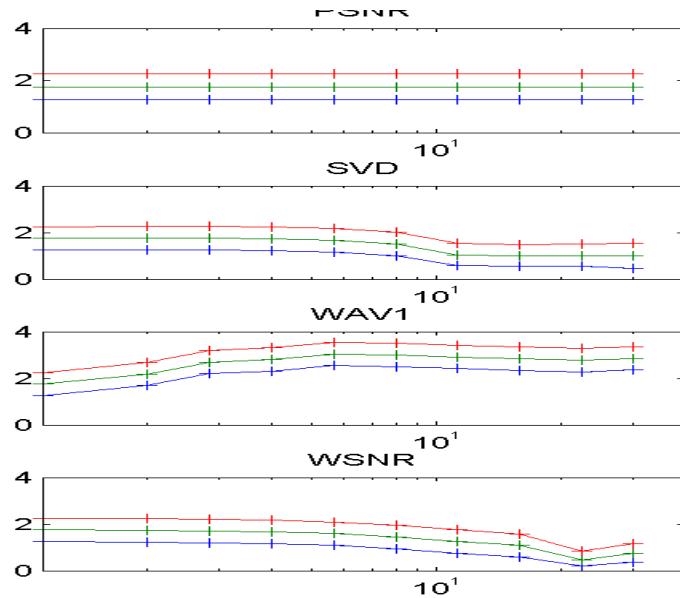


An Simple Experimentation

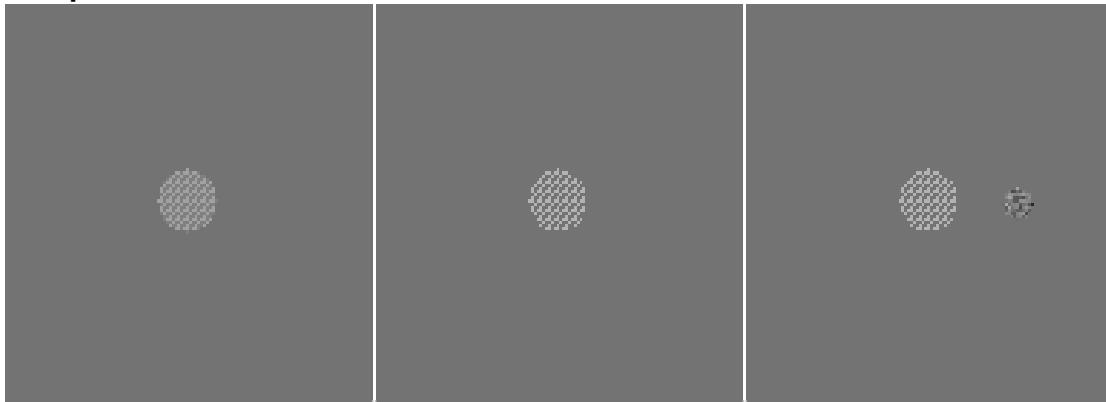


# Claimed CSF and Effective CSF

$$Q(g_0, g_0 + a(u, v) \cos(2\pi mu + nv)) = C^{te}$$



Practical Consequences:



# 5. Cortex Transform

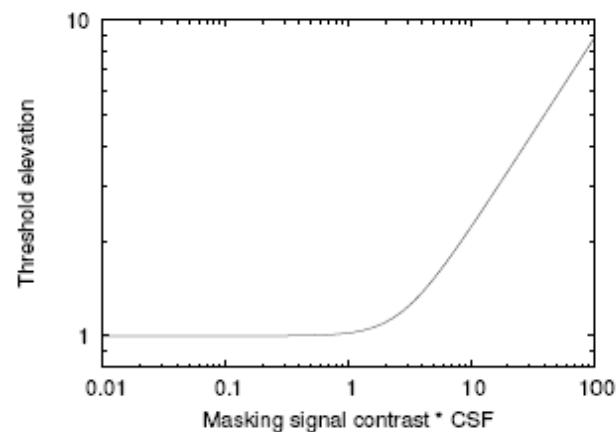
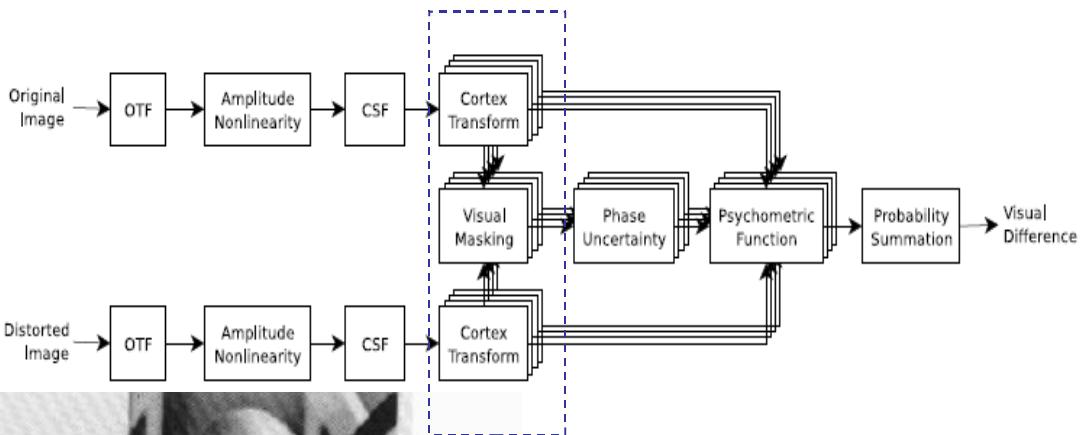
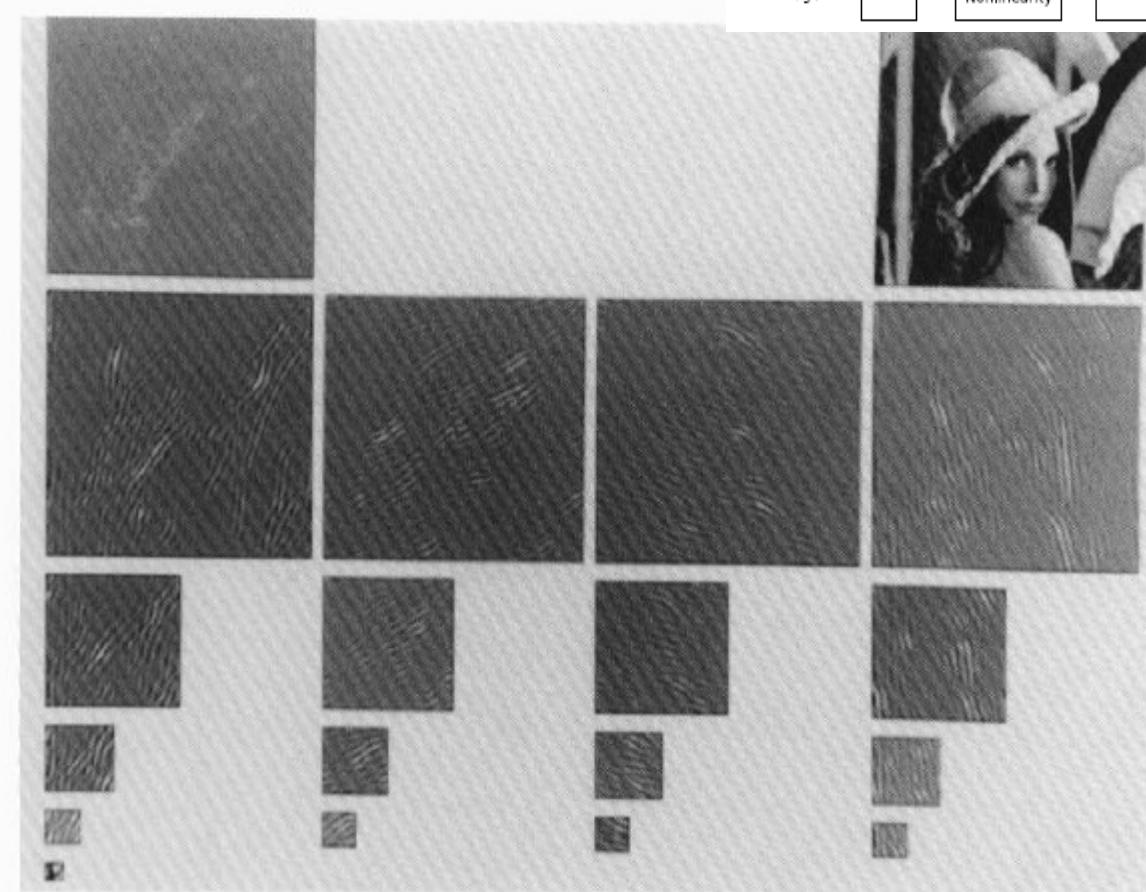
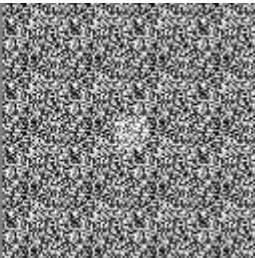


FIG. 12. Cortex transform of an image. Layers vary in resolution from row to row, and in orientation from column to column. The high and low frequency residues are also shown. All layers are scaled to full contrast to maximize visibility.



# Masking Effect



Yet for texture:

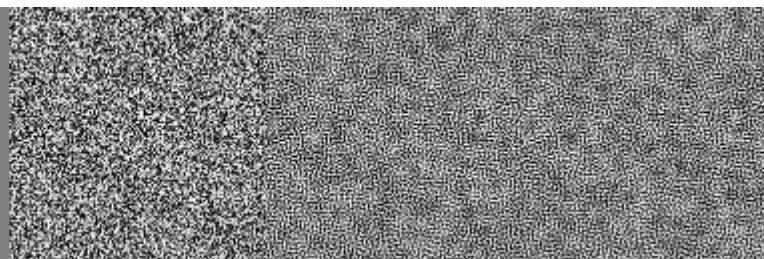
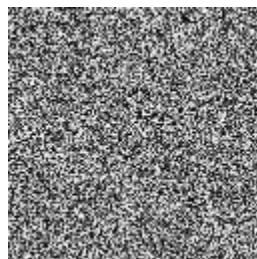
Source

Average

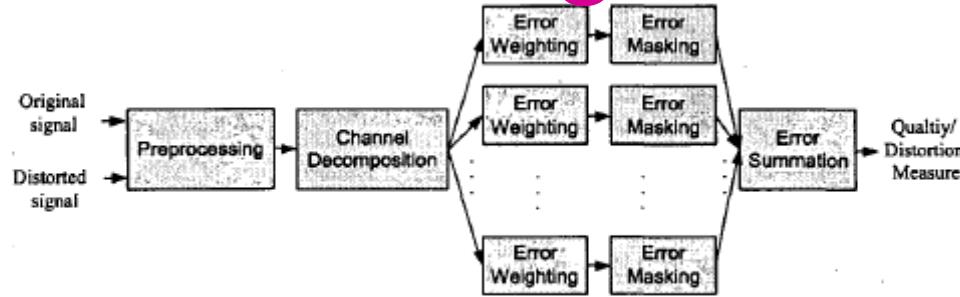
Reverse  
polarity

LF  
added

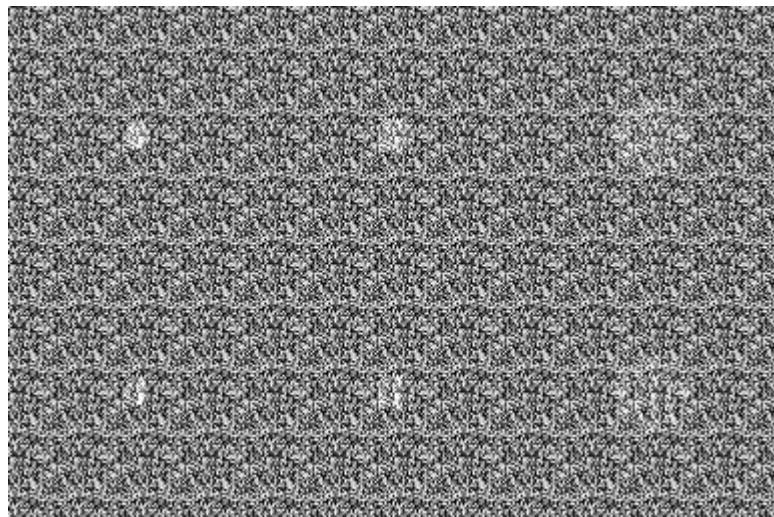
HF  
added



# 6. Pooling



- Area of Patch Versus Intensity of Patch



$$\Rightarrow \beta \approx 2, 3, 4$$

in the Minkowsky sum

There may be some interaction with spatial aperture.

$$Q(g_0, g_0 + b(\text{card}(A))\Delta g 1_A) = C^{te}$$

# Conclusion

- Different applications  
different technologies, different aims
- Different HVS-inspired quality measures
- How to choose ?  
(contrast, CSF, masking, fusion)  
-> Geometrical invariant properties ?