

# Efficient Implementation of Foveation Filtering



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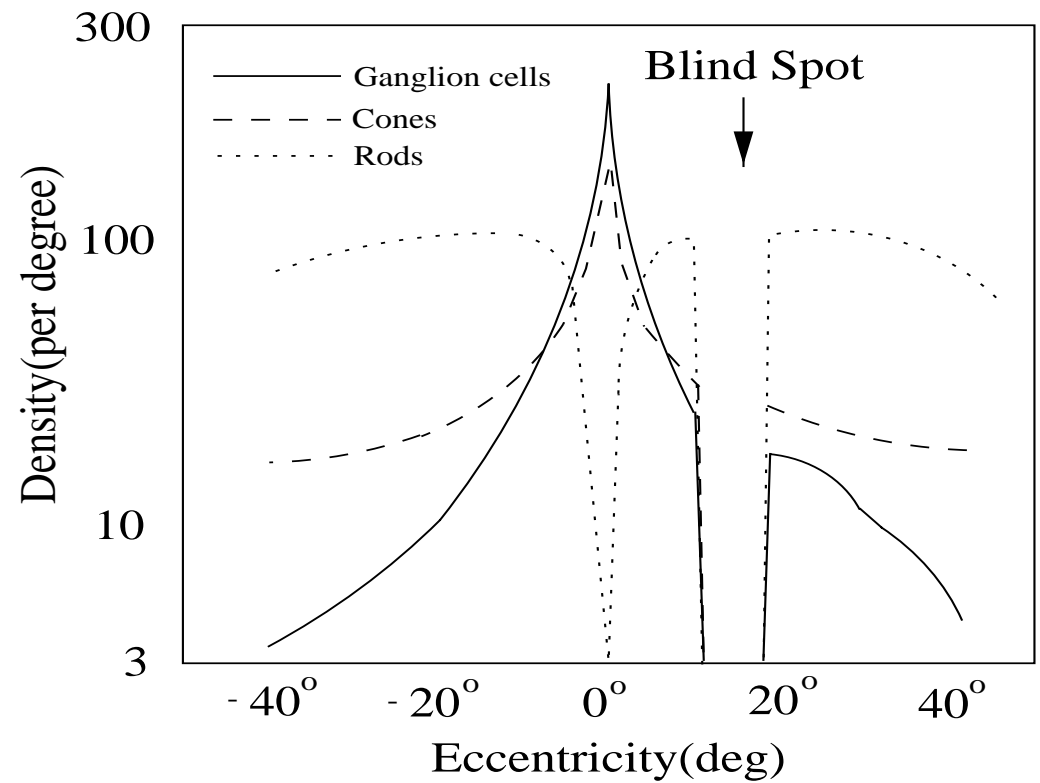
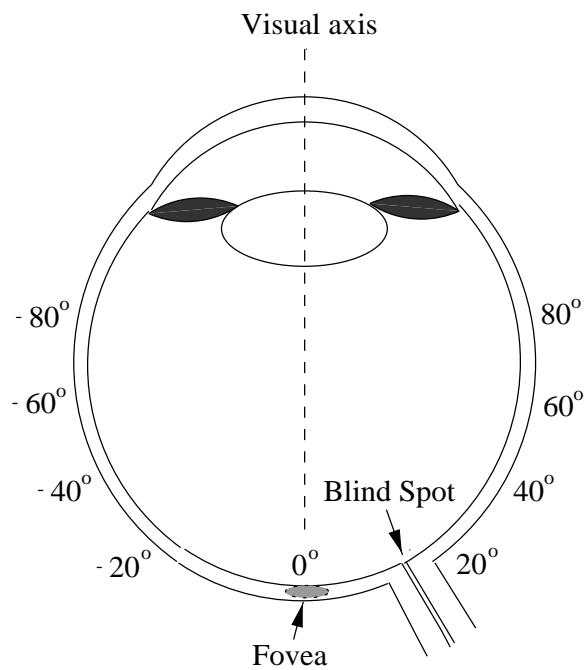
**<http://anchovy.ece.utexas.edu>**



# Motivation

- Fast foveation filter design
  - Reduce the number of operations (additions and multiplications)
  - Obtain the high visual quality of foveated images

# Human eye and photoreceptor density



Foveated image: *news* (352 x 28 )



# Foveated video vs. regular video



- PSNR = 30.10
- FPSNR = 29.54



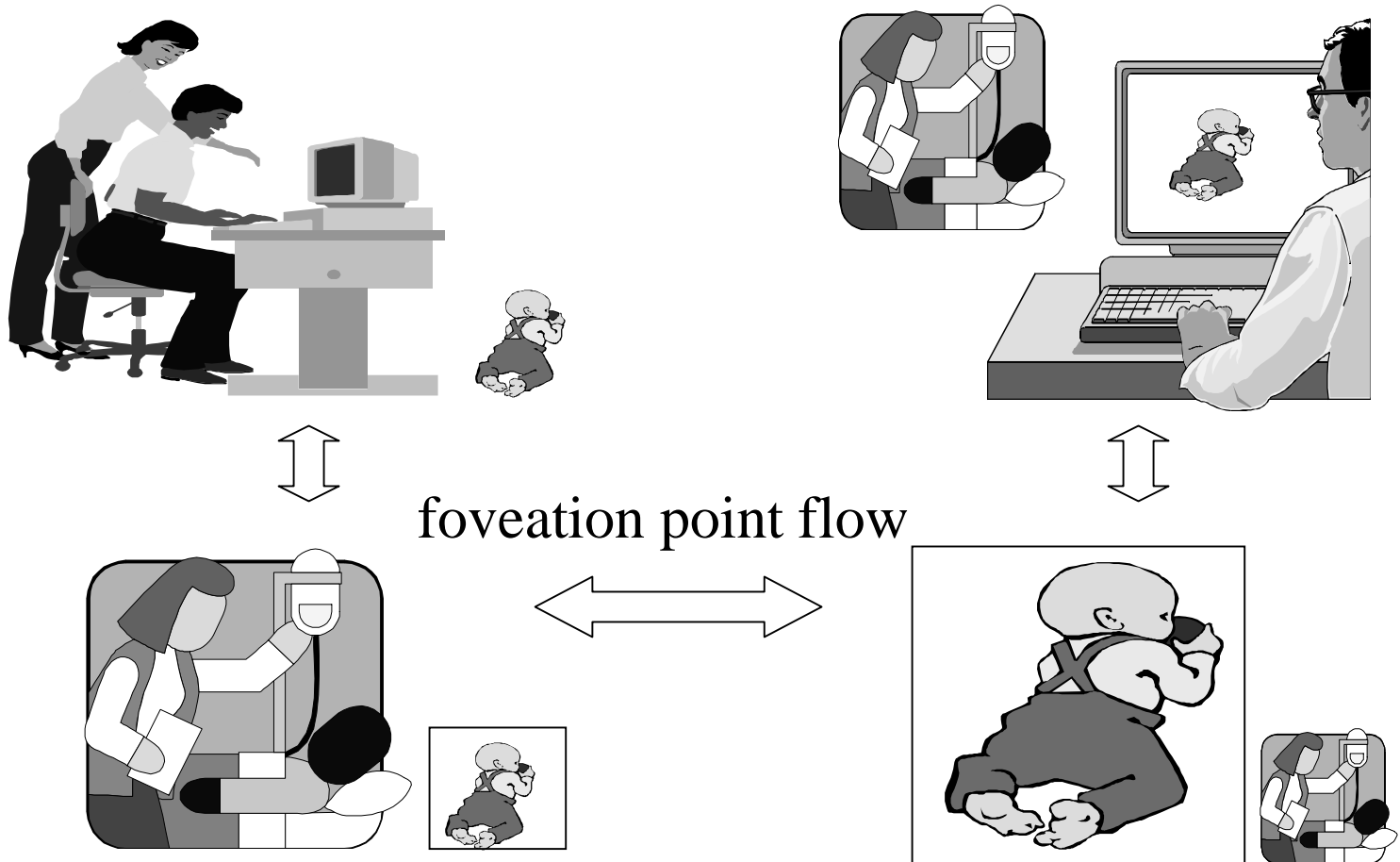
- PSNR = 33.92
- FPSNR = 35.01



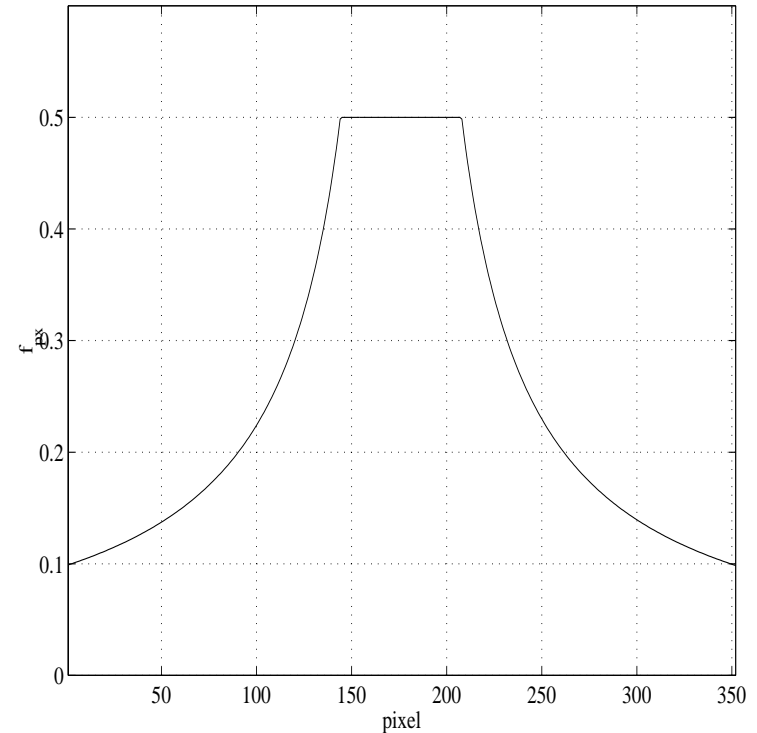
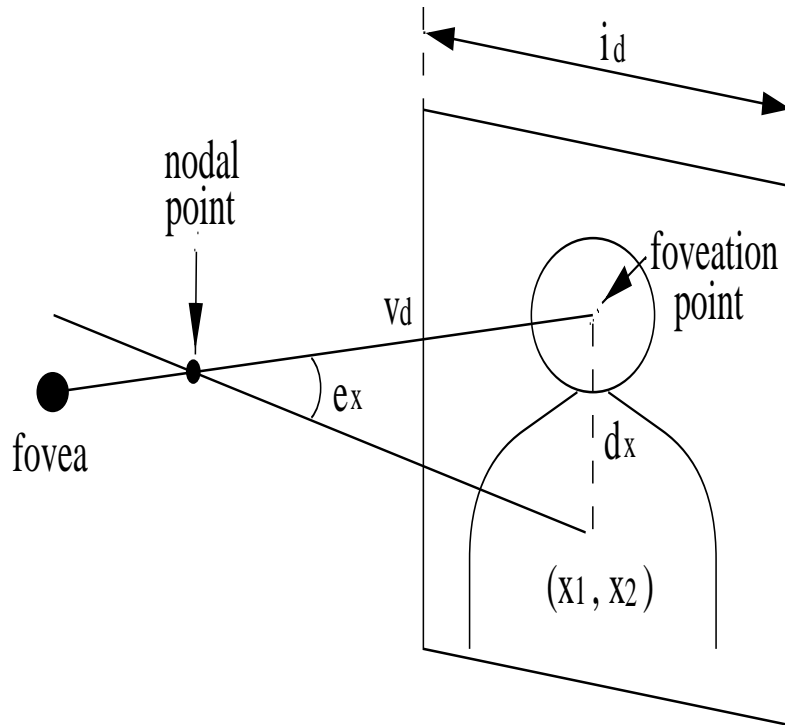
# Foveation point selection

- **Stored video application**
  - Web news: prior to video compression
- **Real-time visual communications**
  - Selected by both sender and receiver
  - Automatic detection for face-to-face communications
- **Remote navigation or emergency vehicles: eye tracker**

# Human interactive multimedia



# Human visual system modeling



Viewing parameter

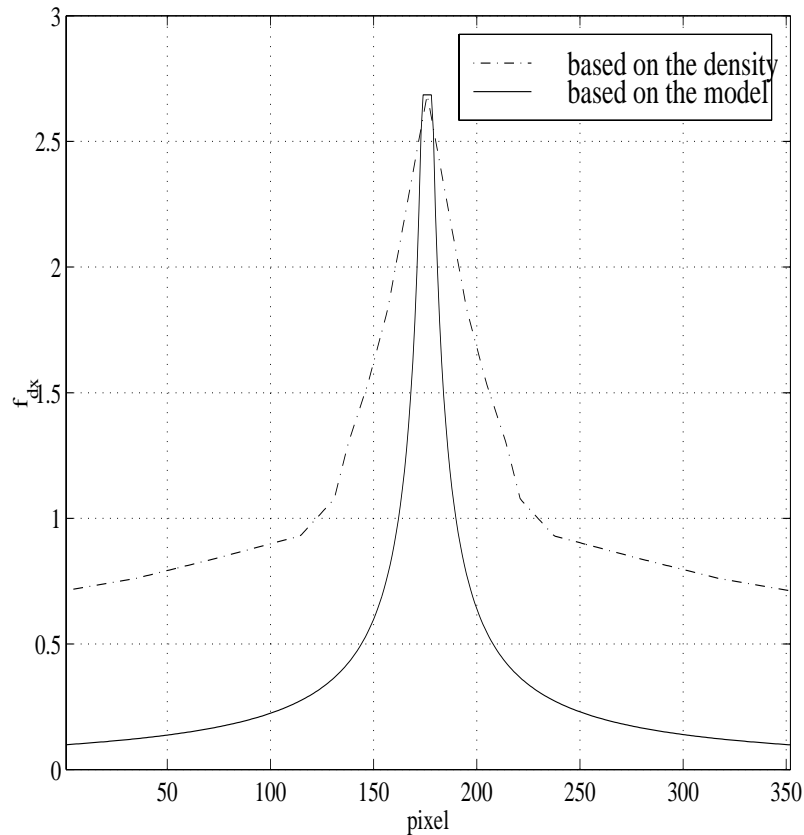
Spatial frequency (cyc/deg)

$v_d$  visual distance,  $e_x$  eccentricity,  $i_d$  image size

$$e_x = \tan^{-1} ( i_d d_x / (i_p v_d) )$$



# Local bandwidth acquisition



- Calculate eccentricity at each pixel by
$$e_x = \tan^{-1} ( i_d d_x / (i_p v_d) )$$
- Derive detectable frequency from the spatial mosaic of cones based on the sampling theorem
$$f_d = \gamma / (e_x + \eta) - \zeta$$
- Obtain the local bandwidth from the detectable frequency
- Use the local bandwidth as the cutoff frequency in the filter design

# Ideal foveation filter design

## ■ Parseval's theorem

$$\sum_{i=-\infty}^{\infty} h^{*2}(i) = \frac{1}{2\pi} \int_{-\pi}^{\pi} |H^*(e^{i\omega})|^2 d\omega = \frac{\omega_c}{\pi}$$

where  $H^*(e^{i\omega}) = 1$ ,  $|\omega| < \omega_c$  and  $0$ ,  $\omega_c < |\omega| < \pi$

- If  $\omega_c$  is changed according to each pixel such as  $\omega_c = 2\pi f_{pn}$ , then the ideal low pass filter  $H^*(\cdot, f_{pn})$  is used to create foveated images

# Practical foveation filter design

- Let  $h(i)$  and  $H(e^{i\omega})$  be the Fourier transform pair of low pass filter with the filter length  $N$
- Then, the total energy of the error signal becomes
$$e = \sum_{i=-\infty}^{\infty} [h^*(i) - h(i)]^2$$
- The error ratio  $\tau = e\pi / \omega_c$  is inversely proportional to the cutoff frequency
- We can decide the filter length  $N$  while  $\tau$  is less than a constant associated with the cutoff frequency at each pixel

# Separable even symmetric filter

- To reduce the number of multiplications, we use a separable even symmetric low pass filter  $l_n(i_1, i_2) = l_n(i_1)l_n(i_2)$ , if  $-N_n/2 \leq i_1, i_2 \leq N_n/2$

$$= 0, \quad \text{otherwise}$$

– where  $N_n$  is the filter length at the  $n^{\text{th}}$  pixel

- For the separable even symmetric filter, the number of operations is reduced to

$$2(N_n / 2 + 1)$$

for additions and multiplications for each pixel



# Circularly symmetric filter

- Using circularly symmetric filters, we can obtain more symmetric frequency response associated with the local bandwidth
- The octal symmetry of circularly symmetric filters  $l_n(i_1, i_2) = l_n(\pm i_1)l_n(\pm i_2) = l_n(\pm i_2)l_n(\pm i_1)$
- The number of operations for each pixel
  - For additions  $7(N_n / 2 + 1)(N_n / 2 + 2) / 2 - 6$
  - For multiplications  $(N_n / 2 + 1)(N_n / 2 + 2) / 2 - 1$



# Simulation results

- The distribution of foveation points is assumed to be a Gaussian function

$$p(n_1, n_2) = \alpha e^{-2\pi^2 \sigma^2 r^2 / i_p^2}$$

where  $r$  is the distance from foveation point to pixel  $n$ ,  $i_p$  is the number of pixels in horizontal line,  $\sigma$  is selected by the half-peak radius

# Average number of multiplications at each pixel

	separable			circularly		
	$\tau$			$\tau$		
	0.15	0.1	0.05	0.15	0.1	0.05
$\sigma=0.38$	7.4	10.1	20.9	8.4	16.1	69.0
$\sigma=0.57$	7.2	9.8	20.8	7.9	15.2	63.9

Original image

Foveated image  
sep., adaptive  $N_r$ ,  $\tau = 0.1$







# Conclusions

- Implement very efficient real-time foveation filtering having low pass filters with continuously varying cutoff frequencies
- Obtain the cutoff frequency based on human visual modeling
- Reduce the computation complexity by changing the filter length according to the magnitude of cutoff frequencies

Foveated image

circular.,  $N=31$



Foveated image

circular, adaptive  $N$ ,  $\tau = 0.1$

