

# Real-time noise-aware tone mapping

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# Video tone mapping Applications

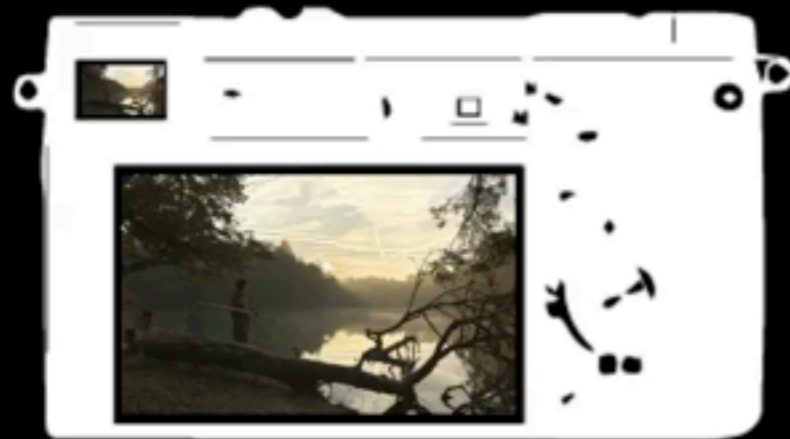
Viewfinders

Display adaptation

In-camera processing stacks

Video games

Video post processing  
etc.





# Video tone mapping

Problems with previous methods

Amplified noise

Noise-aware processing

Loss of contrast

Minimum contrast distortion  
local tone-curves

Visible artifacts

Fast detail extraction diffusion

Limited creative control

Display model

No display adaptation

Real-time algorithms

Computational expense



Edge pres. filter: *Bilateral filter*

Tone-curve: *Sigmoid S-curve*



# Filtering for tone mapping

Problem statement

## Filter purpose

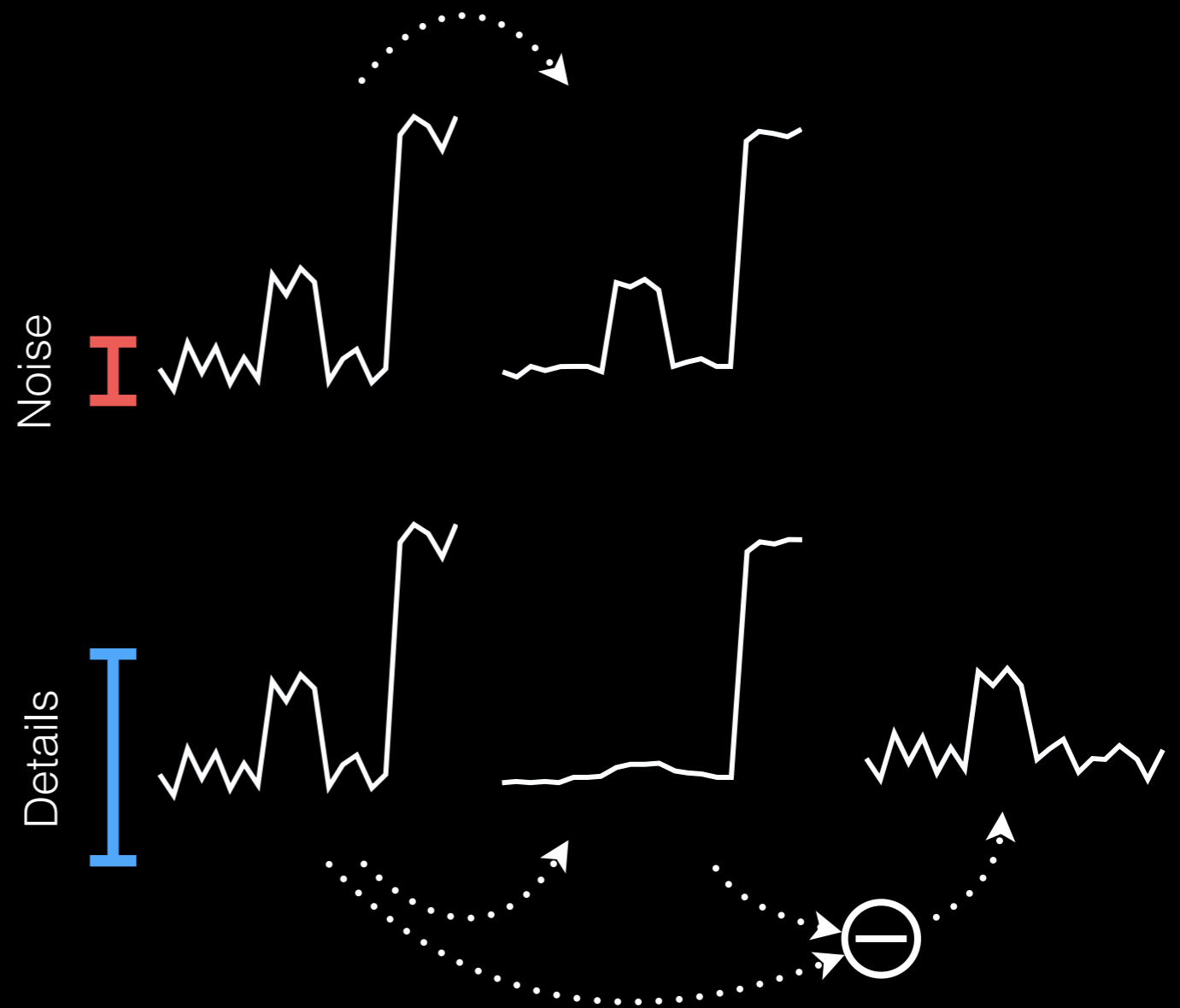
- Noise reduction, etc.
- Tone mapping is different

## Detail extraction

- Large scale
- Different intent

## Problems

- Ringing/banding artifacts
- Computationally expensive

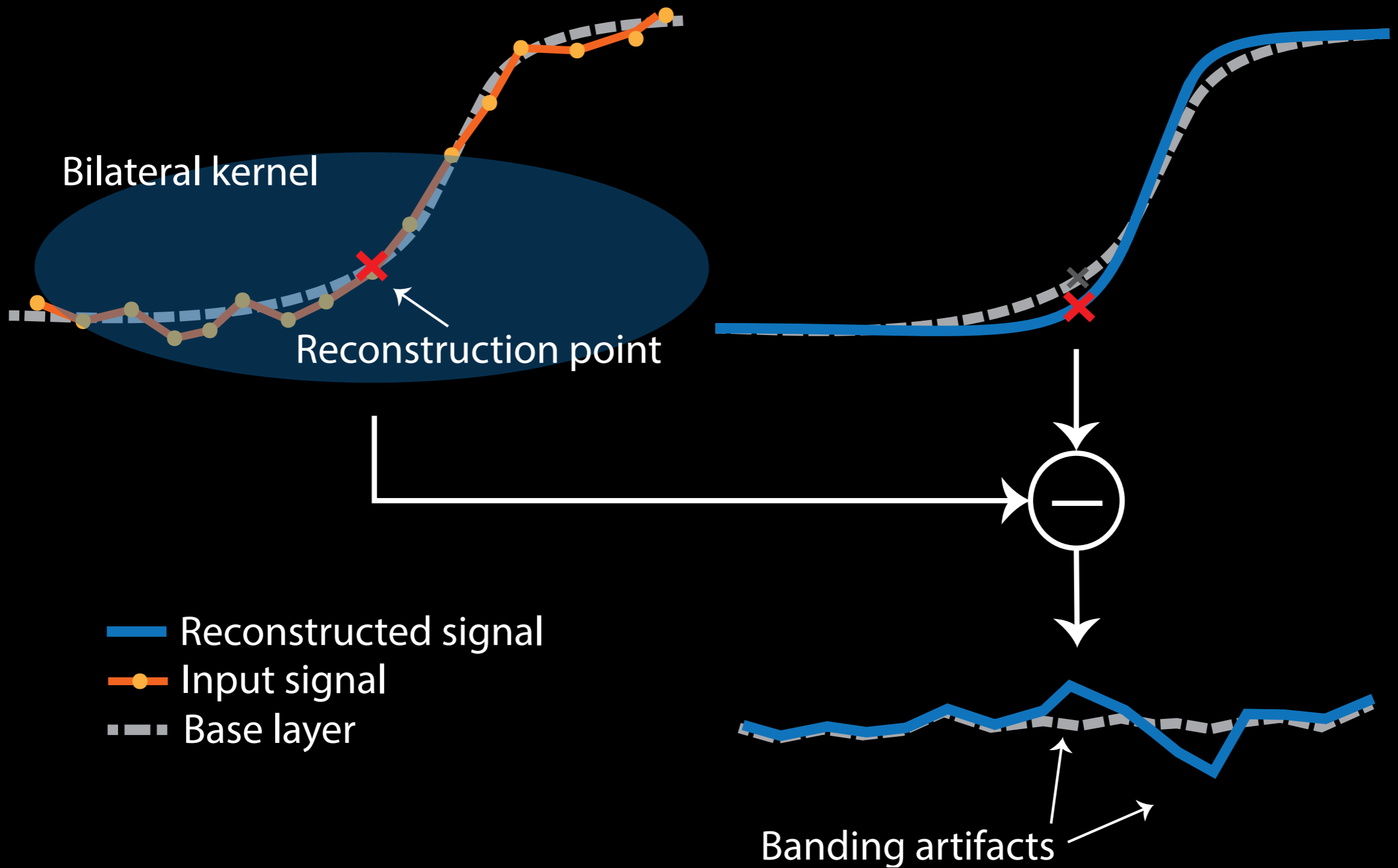


• TOMASI, C., AND MANDUCHI, R. 1998. *Bilateral filtering for gray and color images*. In *Proc. International Conference on Computer Vision* 6, 839–846

• PERONA, P., AND MALIK, J. 1990. *Scale-space and edge detection using anisotropic diffusion*. *IEEE Trans. Pattern Analysis Machine Intelligence* 12, 7, 629–639.

# Filtering for tone mapping

Problem statement



# Filtering for tone mapping

Fast detail extraction diffusion

$$I(I, \mathbf{p}) = \alpha \sum_{\mathbf{q} \in \Omega_{\mathbf{p}}} \omega_s(\|\mathbf{q} - \mathbf{p}\|) \omega_r(I(\mathbf{q}) - I(\mathbf{p})) I(\mathbf{q})$$

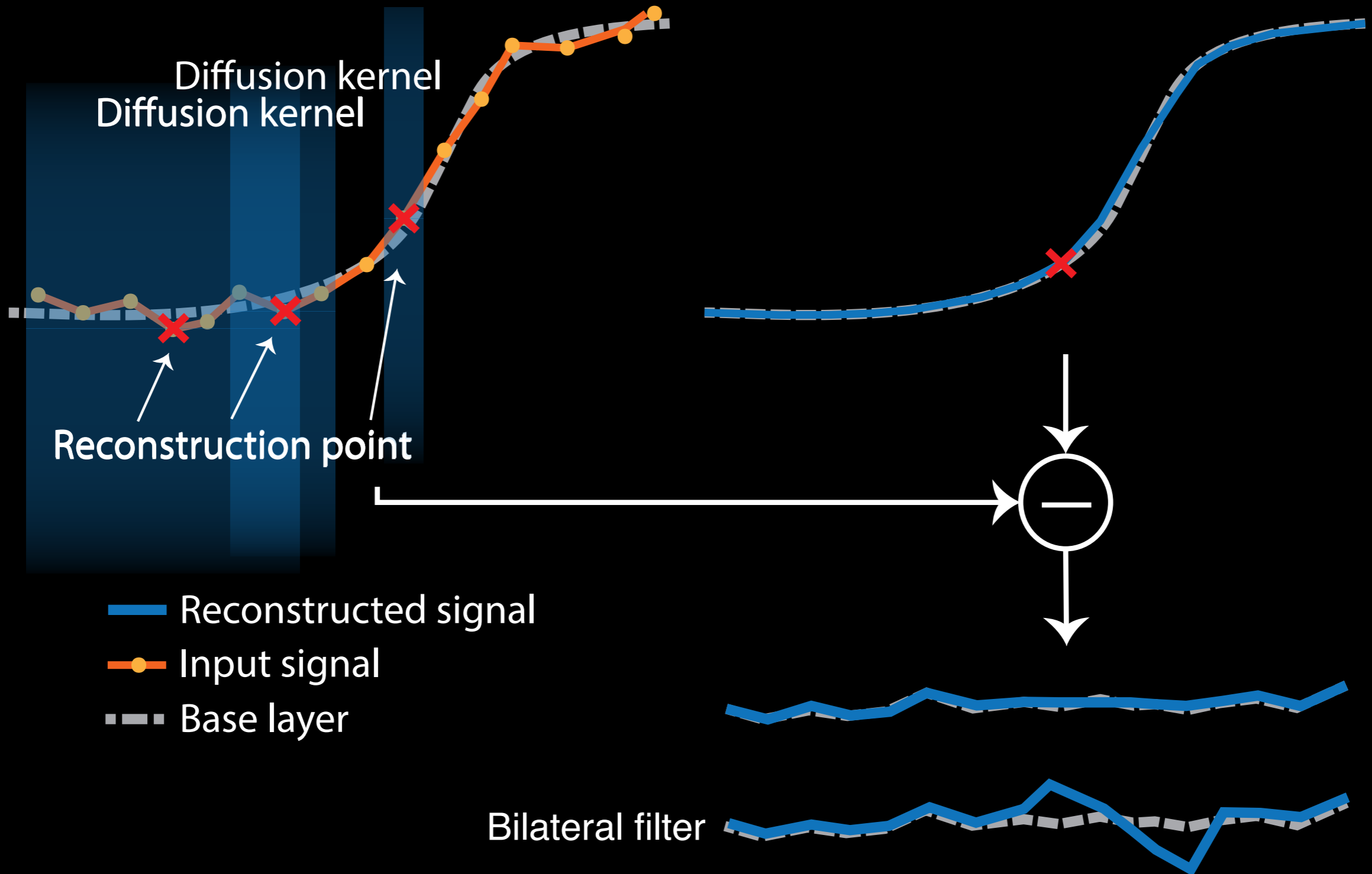
$$\left\{ \begin{array}{l} V(I, \mathbf{p}) = \sum_{\mathbf{q} \in \Omega_{\mathbf{p}}} \omega_s(\|\mathbf{q} - \mathbf{p}\|) \omega_r(I(\mathbf{q}) - I(\mathbf{p})) I(\mathbf{q}) \\ I^{k+1} = (1 - \omega_r) I^k(\mathbf{p}) + \frac{V(I^k, \mathbf{p})}{\omega_r(\|\nabla I^k(\mathbf{p})\|)} \end{array} \right.$$

- $\omega_s$  - Spatial filter
- $\omega_r$  - Edge-stop function
- $\mathbf{p}$  - Reconstruction point
- $\Omega_{\mathbf{p}}$  - Local neighborhood



# Filtering for tone mapping

Fast detail extraction diffusion



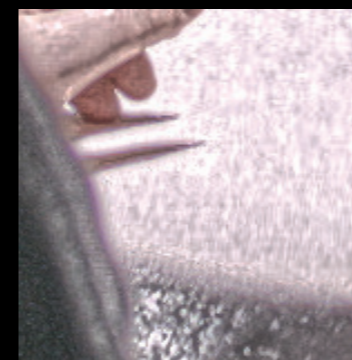




Bilateral filter

Anisotropic diffusion

Fast local laplacian



Permeability filter

Our approach

- AUBRY, M., PARIS, S., HASINOFF, S. W., KAUTZ, J., AND DU-RAND, F. 2014. *Fast local laplacian filters: Theory and applications*. *ACM Trans. Graphics* 33, 5, 167:1–167:14.

- AYDIN, T. O., STEFANOSKI, N., CROCI, S., GROSS, M., AND SMOLIC, A. 2014. *Temporally coherent local tone mapping of HDR video*. *ACM Trans. Graphics* 33, 6, 1–13.



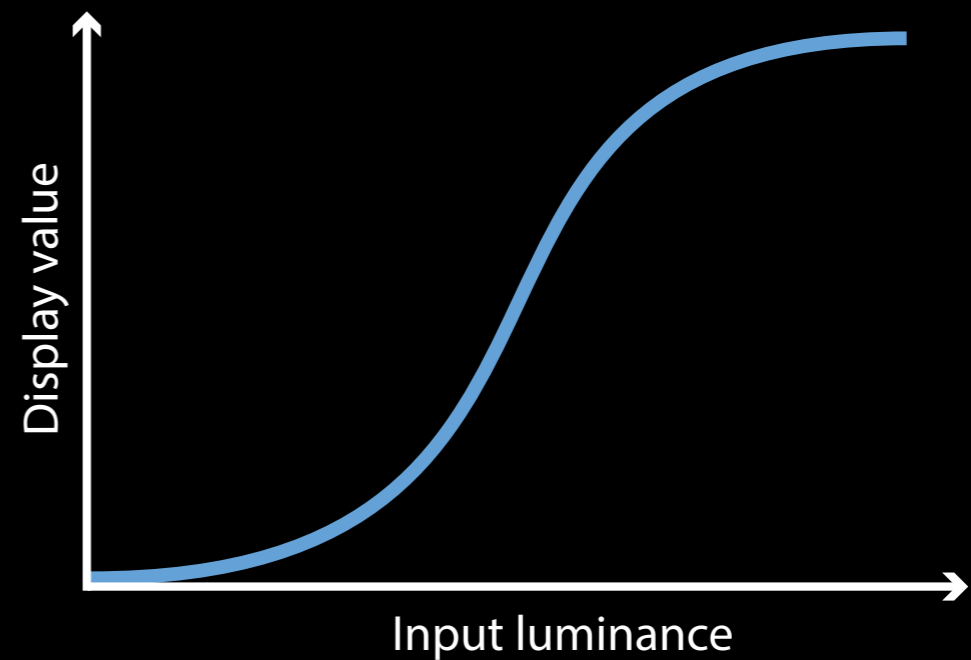


# Minimum contrast distortion

Definition

## Contrast distortion

- A tone-curve controls how much contrast is compressed at each luminance level
- Contrasts are distorted in the process



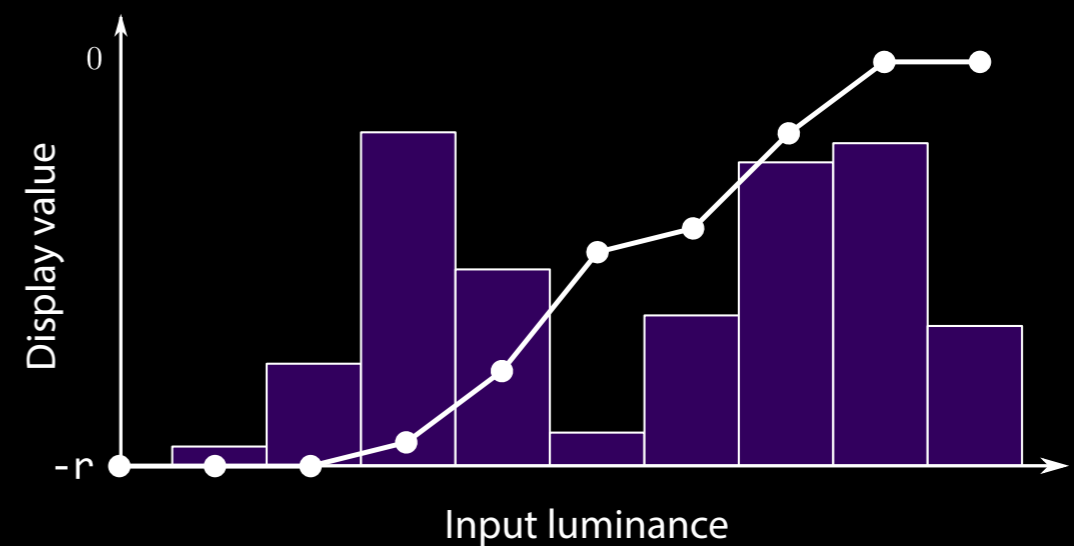
- HUNT, R. 2004. *The Reproduction of Colour in Photography, Printing and Television: 6th Edition*. John Wiley & Sons.



# Minimum contrast distortion Tone-curve derivation

## Minimizing contrast distortions

- General optimization problem
- Analytical solution
- Very fast solver



$$\arg \min_T \|G(I) - G(T(I))\|$$

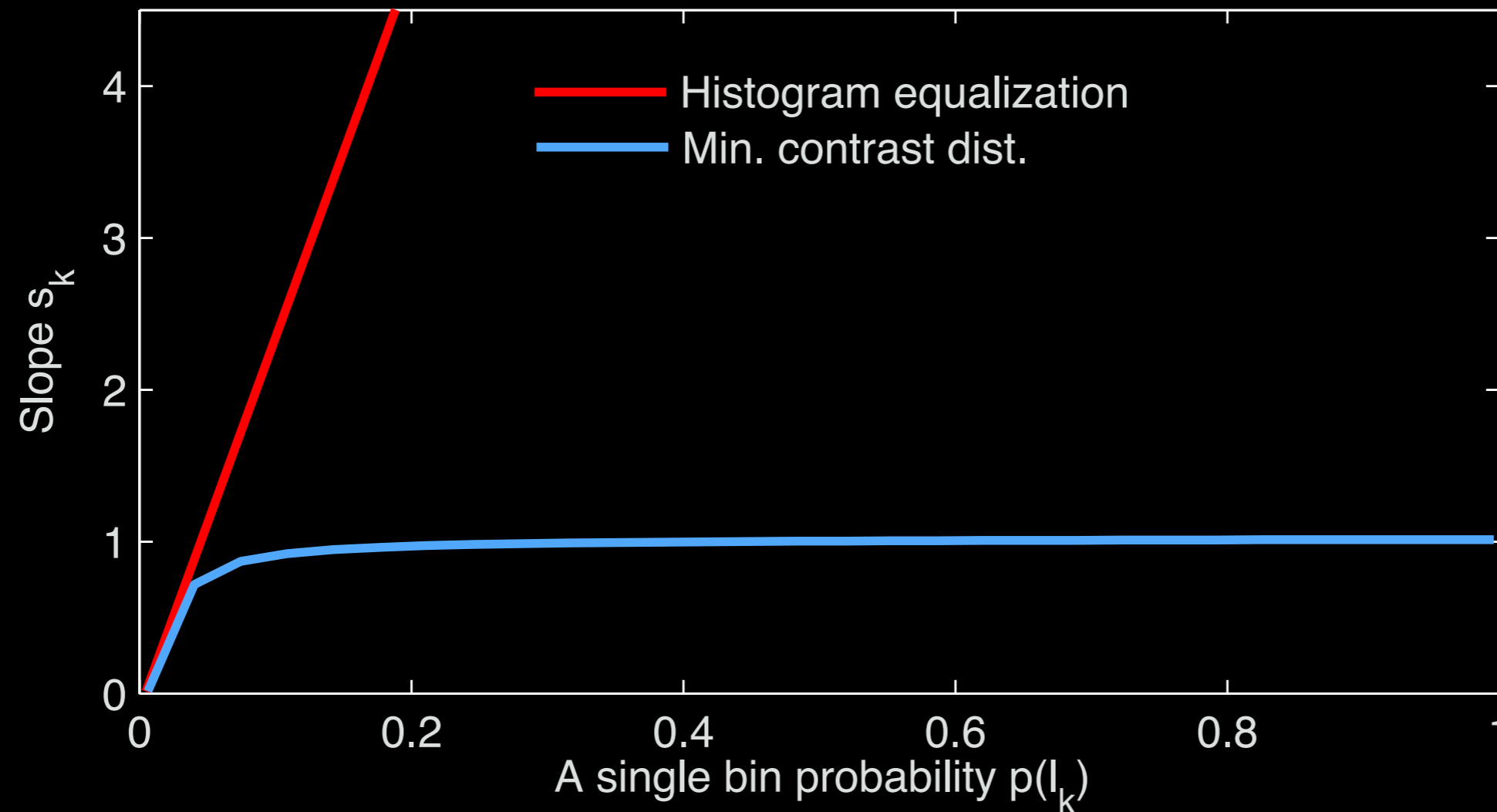
Subject to:  $T(I)$  within the dynamic range of the display

$I$	- HDR image
$G(I)$	- Image contrast
$T$	- Tone-curve



# Minimum contrast distortion

## Tone-curve comparison



- MAI, Z., MANSOUR, H., MANTIUK, R., NASIOPOULOS, P., WARD, R., AND HEIDRICH, W. 2011. Optimizing a tone curve for backward-compatible high dynamic range image and video compression. *IEEE Trans. Image Processing* 20, 6, 1558 – 1571.

# Minimum contrast distortion

Spatial & temporal considerations

## Local tone-curves

- Local areas of 5 visual degrees
- Blended with global tone-curve
- Applied by interpolation

## Temporal filtering

- Prevents flickering
- IIR filter
- Edge-stop filter









# Noise-aware processing

Problem statement

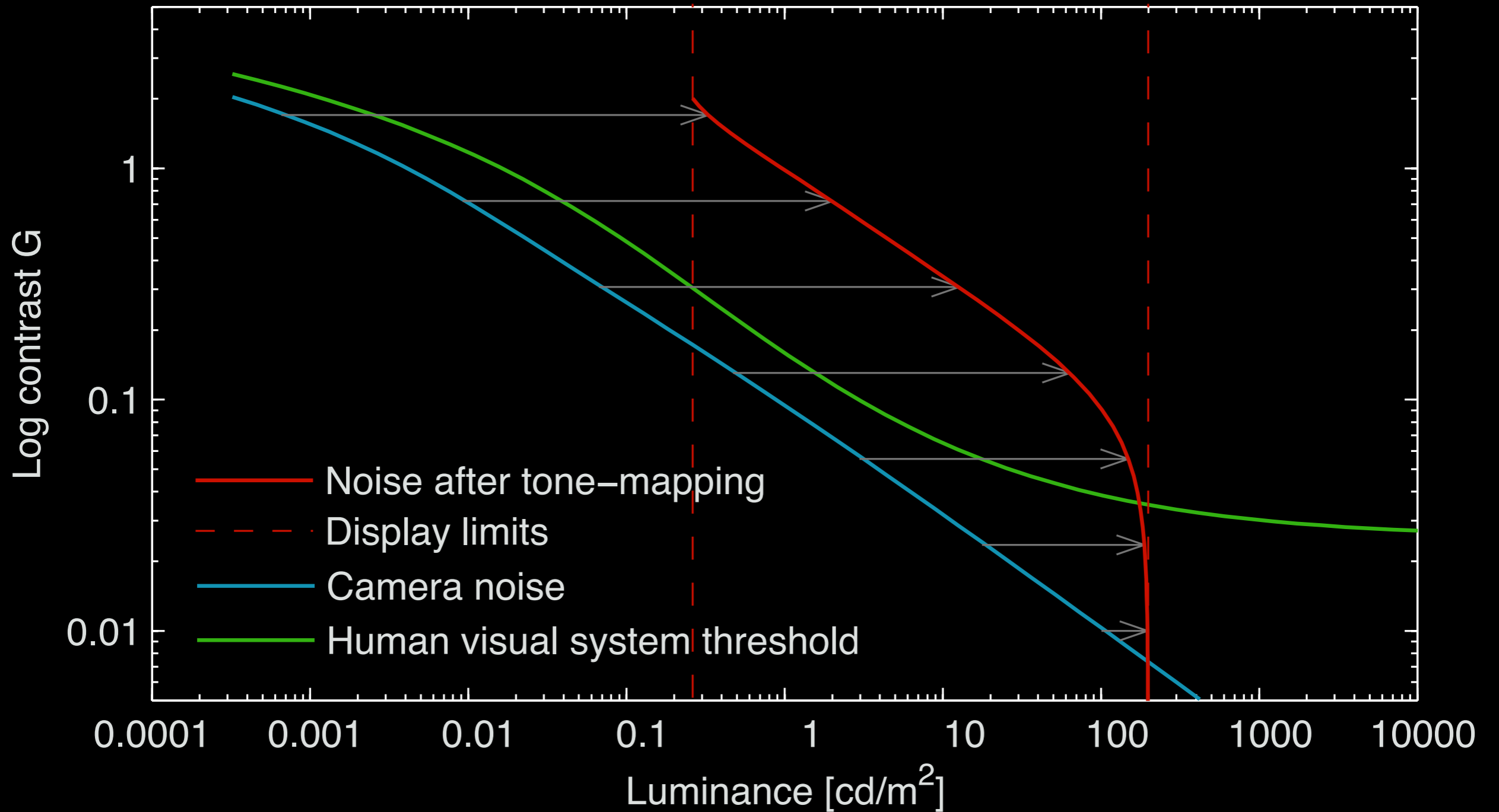


HDR input

Tone mapped output

# Noise-aware processing

Problem statement





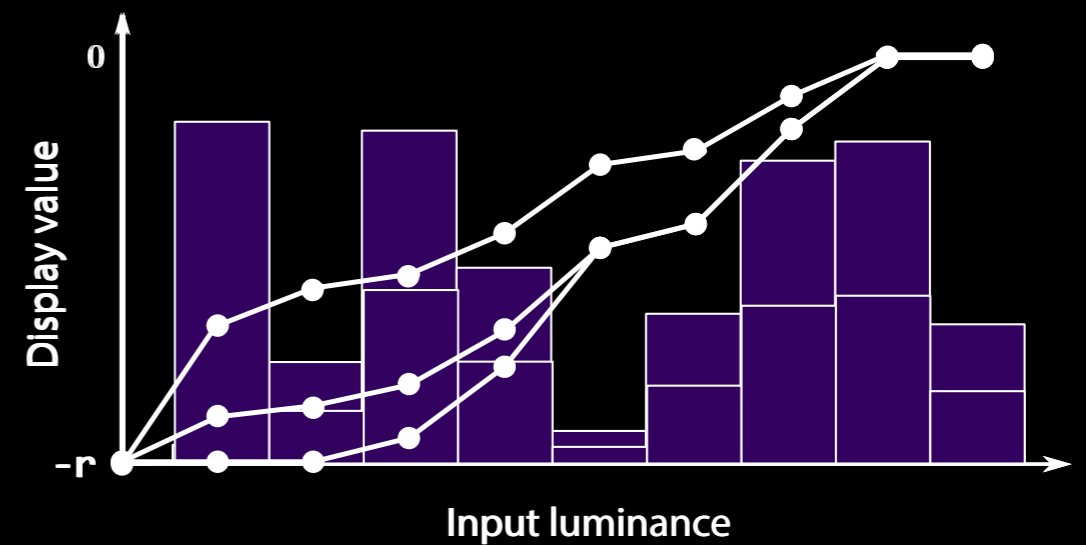
# Noise-aware processing Definition

Noise increased by tone mapping

Noise-aware tone-curves

Noise-aware detail manipulation

Complementary to denoising



HDR input



Tone mapping



Edge-pres. filter  
(fast detail extraction  
diffusion)

Base layer



Detail layer

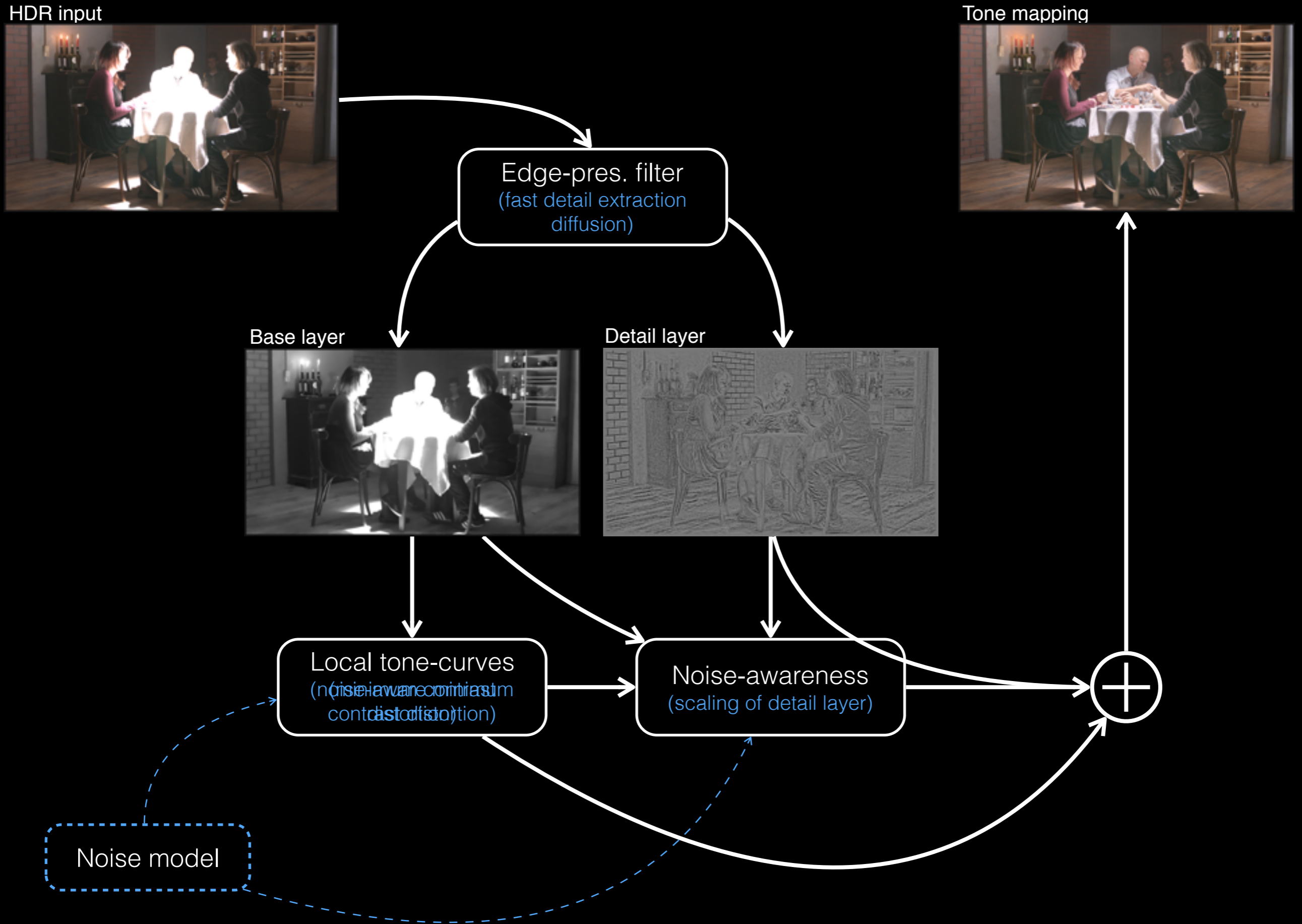


Local tone-curves  
(noise-aware combination  
of contrast and distortion)

Noise-awareness  
(scaling of detail layer)

+

Noise model









HDR input



Tone mapping



Edge-pres. filter  
(fast detail extraction  
diffusion)

Base layer



Detail layer

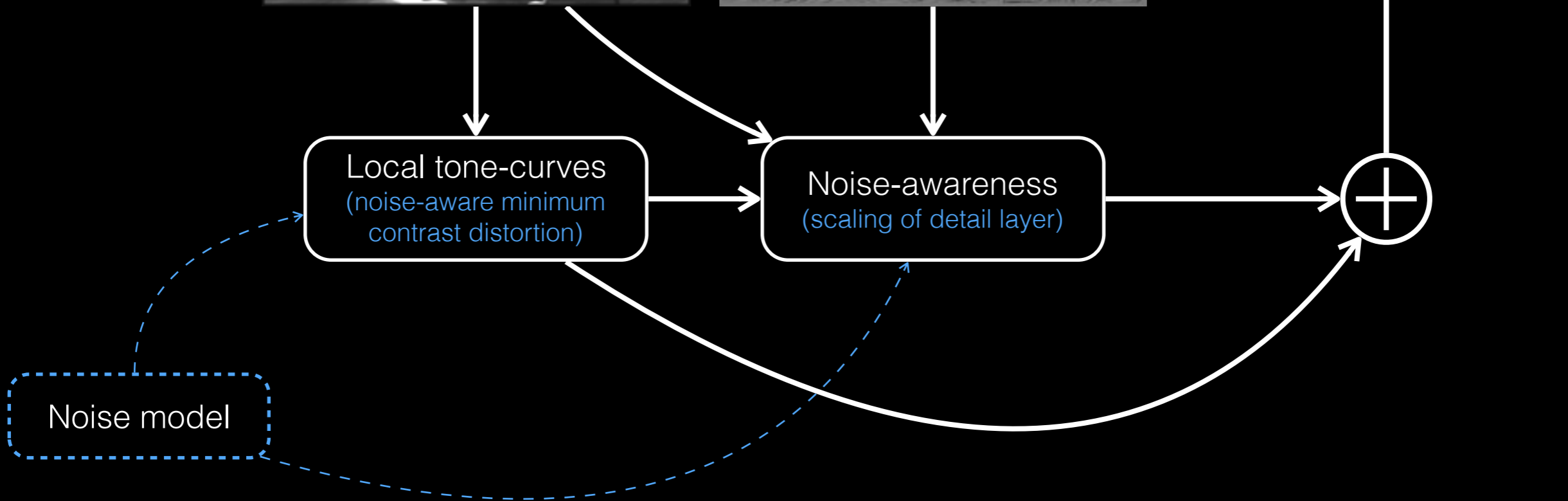


Local tone-curves  
(noise-aware minimum  
contrast distortion)

Noise-awareness  
(scaling of detail layer)

Noise model

Display adaptation  
(inverse display model)



# Demonstration

## Real-time screen capture

**General**

Details

Noise a

Noise b

Exposure

Threaded read  Timings

Write EXR  Write LDR  Write video

**Display**

Gamma

Peak lum

Black level

Ambient

Reflectivity

Simulate ambient light

**Spatial filtering**

$\sigma$

$\lambda$

N

Show detail layer

**Tone mapping**

Method  Min. contr. dist.  Sigmoid  Scaling

Global ratio

Tc size

Tc overlap

Tone prior

Display comp.  Contr. distortion

Temporal edge-stop  Show tc borders





# Conclusion

- Minimum contrast distortion
- Noise-awareness
- Fast detail extraction diffusion
- Display adaptation
- Real-time



Thanks to Fröhlich et al. for providing HDR video sequences

HDR videos available at: [hdr-2014.hdm-stuttgart.de](http://hdr-2014.hdm-stuttgart.de)

- FROEHLICH, J., GRANDINETTI, S., EBERHARDT, B., WALTER, S., SCHILLING, A., AND BRENDDEL, H. 2014. *Creating Cinematic Wide Gamut HDR-Video for the Evaluation of Tone Mapping Operators and HDR-Displays*. In *Proc. SPIE 9023, Digital Photography X*, 90230X–90230X–10.





<http://vcl.itn.liu.se>

<http://www.itn.liu.se/mit/research/computer-graphics-image-processing/real-time-noise-aware-tone-mapping>



HDR video sequences from:

<https://hdr-2014.hdm-stuttgart.de>

**li.u** LINKÖPING  
UNIVERSITY

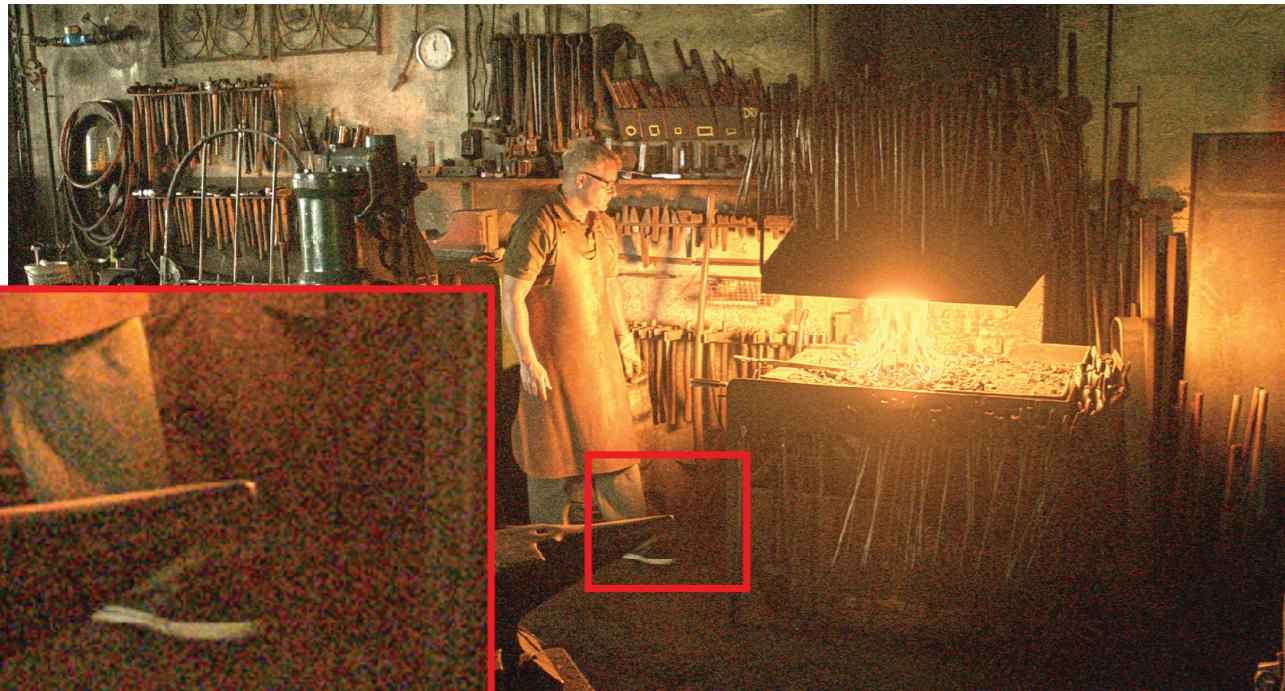
 PRIFYSGOL  
**BANGOR**  
UNIVERSITY

 **UNIVERSITY OF  
CAMBRIDGE**





Naïve tone mapping

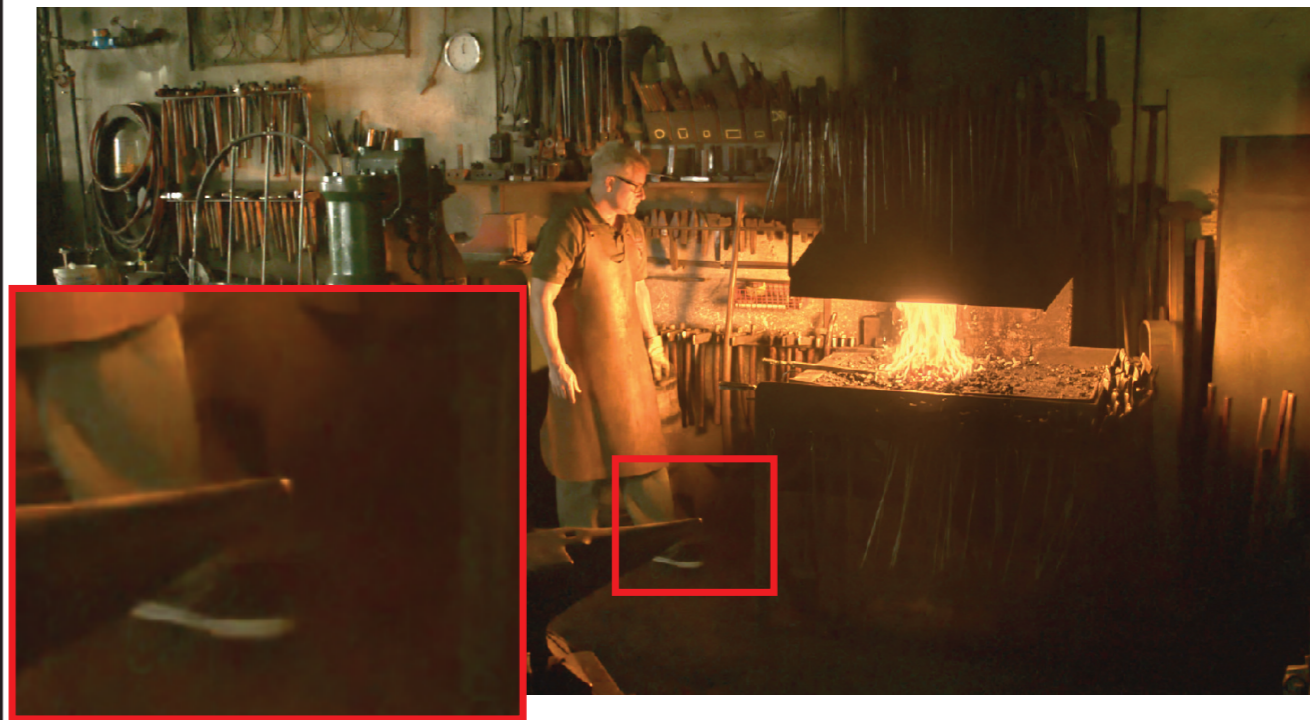


Noise-aware tone mapping



Without denoising

With denoising (V-BM4D)



- MAGGIONI, M., BORACCHI, G., FOI, A., AND EGIAZARIAN, K. 2012. Video denoising, deblocking, and enhancement through separable 4-d nonlocal spatiotemporal transforms. *IEEE Trans. Image Processing* 21, 9, 3952–3966.



Naive tone mapping



Noise-aware tone mapping





Global tone-curve



Local tone-curves





Ambient light: 1000 lux

Ambient light: 3000 lux

No compensation



Display-adaptive TMO



Our adaptive TMO







Our

Guided filter, 5x5

Guided filter, 10x10

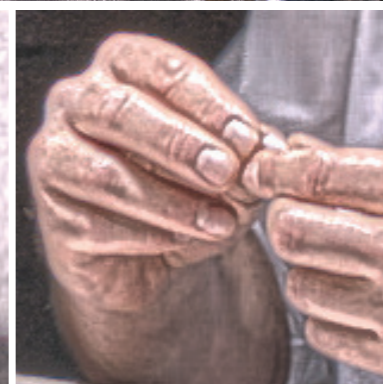
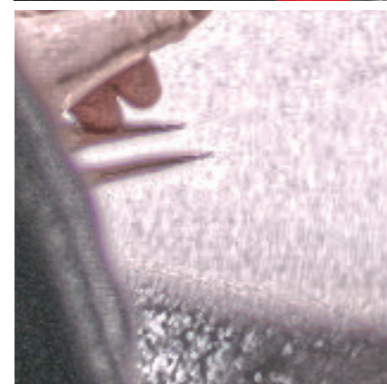
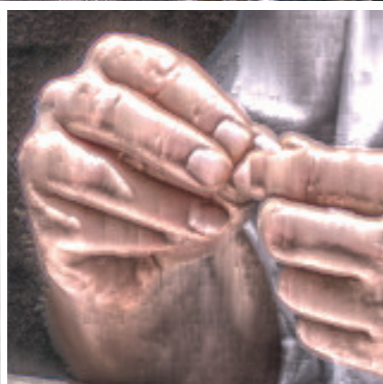
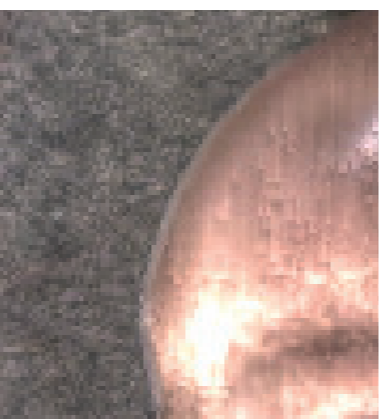




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