Art-Photographic Detail Enhancement

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Image Detail Enhancement

- Enhancement of fine-scale intensity variations
- Clarity in conveying shape and structure information
- Common approach
 - Based on base and detail decomposition
 - Detail scaling and recombining to base layer



Input



Base layer [Gastal11]



Scaled detail layer



Detail enhancement

Previous Approaches

Detail enhancement methods with edge-preserving smoothing



Weighted least squares [Farbman08]



Extrema-based multiscale decomposition [Subr09]



Laplacian pyramid [Paris11]



Domain transform method [Gastal11]



LO gradient minimization [Xu11]

Previous Approaches

- Detail enhancement methods with edge-preserving smoothing
- Limited enhancement because of dynamic range
 - Increased details bounded by the dynamic range of the display device
 - Impossible to capture sufficient details in very dark or bright regions



Input



Base layer [Xu11]



Scaled detail layer



Limited enhancement

Art Photography

- Aesthetics with exaggerated depiction of fine-scale details
- Hyper-realistic look by combining multiple images carefully
 - Handling lighting conditions of individual regions/objects separately
 - Region-specific control to increase dynamic rage of each region



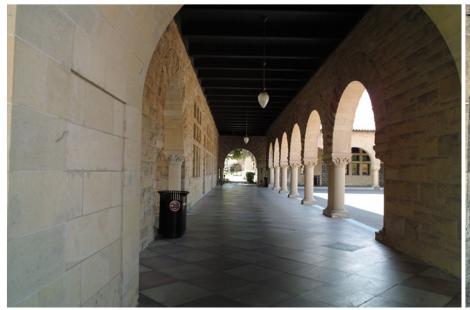
HDR imaging by Trey Ratcliff using multiple exposure images



Synthesized by Dave Hill using multiple pictures of scene components under diff. light conditions

Our Approach

- Single-image detail enhancement inspired by art photography
 - Tone transform model with base shift as well as detail scaling
 - Region-specific detail exaggeration: piecewise smooth tone transform
 - Optimization framework aiming to bring out extreme details in each region





Input single image

Output

- Base shifting as well as detail scaling for each pixel
 - ${\scriptscriptstyle \square}$ For base B and detail D=I-B ,

$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I_i' = B_i' + D_i' = (B_i + t_i) + s_i D_i$$







Input

Previous detail enhancement [Xu11]

Our result

- · Base shifting as well as detail scaling for each pixel
 - $^{\scriptscriptstyle \square}$ For base B and detail D=I-B ,

$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I'_i = B'_i + D'_i = (B_i + t_i) + s_i D_i$$

- Smoothness constraint
 - Smoothly varying s and t for scene structure preservation
 - Piecewise smooth transform for region-based control



Input

- Base shifting as well as detail scaling for each pixel
 - For base B and detail D = I B ,

$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I'_i = B'_i + D'_i = (B_i + t_i) + s_i D_i$$

- Smoothness constraint
 - Smoothly varying s and t for scene structure preservation
 - Piecewise smooth transform for region-based control



Input



Globally smooth scaling s

- Base shifting as well as detail scaling for each pixel
 - $^{\square}$ For base B and detail D=I-B ,

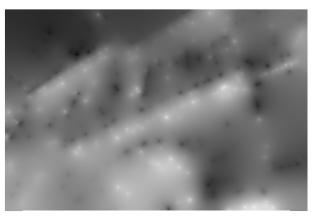
$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I'_i = B'_i + D'_i = (B_i + t_i) + s_i D_i$$

- Smoothness constraint
 - Smoothly varying s and t for scene structure preservation
 - Piecewise smooth transform for region-based control



Input



Globally smooth shift t

- Base shifting as well as detail scaling for each pixel
 - For base B and detail D = I B ,

$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I'_i = B'_i + D'_i = (B_i + t_i) + s_i D_i$$

- Smoothness constraint
 - Smoothly varying s and t for scene structure preservation
 - Piecewise smooth transform for region-based control



Input



Globally smooth transform

- Base shifting as well as detail scaling for each pixel
 - For base B and detail D = I B ,

$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I'_i = B'_i + D'_i = (B_i + t_i) + s_i D_i$$

- Smoothness constraint
 - Smoothly varying s and t for scene structure preservation
 - Piecewise smooth transform for region-based control



Input



Globally smooth transform



Piecewise smooth scaling s

- Base shifting as well as detail scaling for each pixel
 - For base B and detail D = I B ,

$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I'_i = B'_i + D'_i = (B_i + t_i) + s_i D_i$$

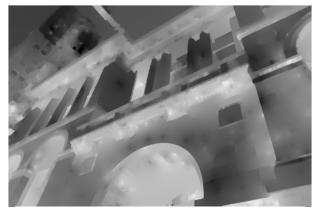
- Smoothness constraint
 - Smoothly varying s and t for scene structure preservation
 - Piecewise smooth transform for region-based control



Input



Globally smooth transform



Piecewise smooth shift t

- Base shifting as well as detail scaling for each pixel
 - For base B and detail D = I B ,

$$I_i' = B_i + D_i' = B_i + s_i D_i$$

$$I_i' = B_i' + D_i' = (B_i + t_i) + s_i D_i$$

- Smoothness constraint
 - Smoothly varying s and t for scene structure preservation
 - Piecewise smooth transform for region-based control



Input



Globally smooth transform



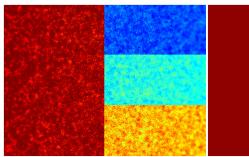
Piecewise smooth transform

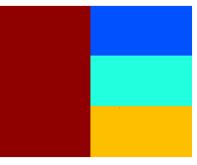
Detail and Base Decomposition

- Necessary properties for base layer
 - Piecewise constant within homogeneous region

- Image smoothing via L₀ gradient minimization [Xu11]
 - Best for piecewise constant base layer
 - Global strategy based on sparsity measure
 - Sparsity measure: $C(B) = \#\{i \mid |\partial_x B_i| + |\partial_y B_i| \neq 0\}$
 - Objective function: $\min_{B} \left\{ \sum_{i} (B_i I_i)^2 + \lambda \cdot C(B) \right\}$











Detail and Base Decomposition

- Necessary properties for base layer
 - Piecewise constant within homogeneous region

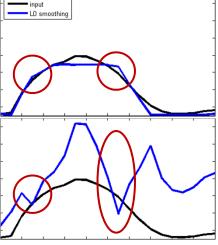
- Image smoothing via L₀ gradient minimization [Xu11]
 - Best for piecewise constant base layer
 - Problems around edges with extreme scaling and shift



Input

Base layer using LO smoothing





Result

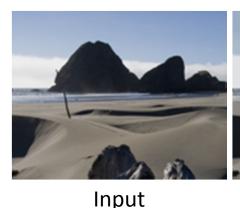
Detail and Base Decomposition

- Necessary properties for base layer
 - Piecewise constant within homogeneous region
 - Matching original edges in boundary region
- Our solution: modified L₀ smoothing [Xu11]

□ 1st step: Original L₀ smoothing: $\min_{B} \left\{ \sum_{i} (B_i - I_i)^2 + \lambda \cdot C(B) \right\}$

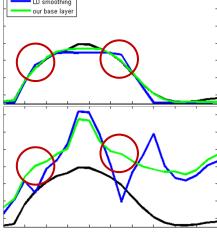
2nd step: Additional edge matching with adaptive λ

3rd step: Edge adjustment with adaptive Gaussian blur



Base layer using our method





Result

$$I_i' = (B_i + t_i) + s_i D_i$$

• Detail measure

$$\sum_{i} \|s_i D_i\|^2$$







Input

Base layer

Detail layer

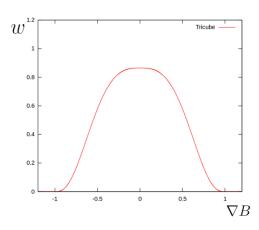
$$I_i' = (B_i + t_i) + s_i D_i$$

Detail measure

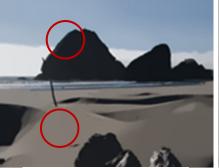
$$\sum_{i} \|s_i D_i\|^2$$

Constraint for piecewise smooth transform

$$\sum_{i} w_i \|\nabla s_i\|^2, \sum_{i} w_i \|\nabla t_i\|^2 \text{ with } w_i = K(\nabla B_i)$$









Input

Base layer

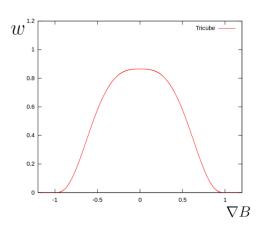
Detail layer

$$I_i' = (B_i + t_i) + s_i D_i$$

Detail measure

$$\square \sum_{i} \|s_i D_i\|^2$$

- Constraint for piecewise smooth transform
 - $\sum_{i} w_i \|\nabla s_i\|^2, \ \sum_{i} w_i \|\nabla t_i\|^2 \text{ with } w_i = K(\nabla B_i)$



- Objective function
 - Minimizing

$$f(s,t) = -\sum_{i} ||s_{i}D_{i}||^{2}$$

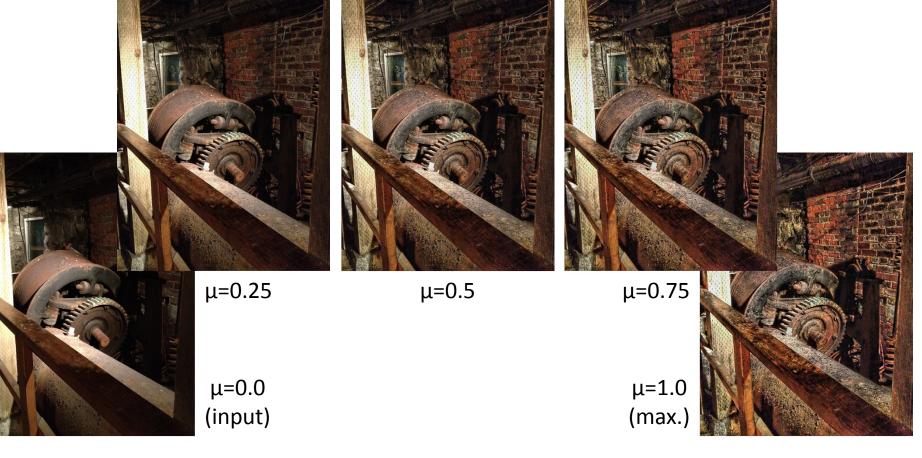
$$+ r_{1} \sum_{i} w_{i} ||\nabla s_{i}||^{2} + r_{2} \sum_{i} w_{i} ||\nabla t_{i}||^{2},$$

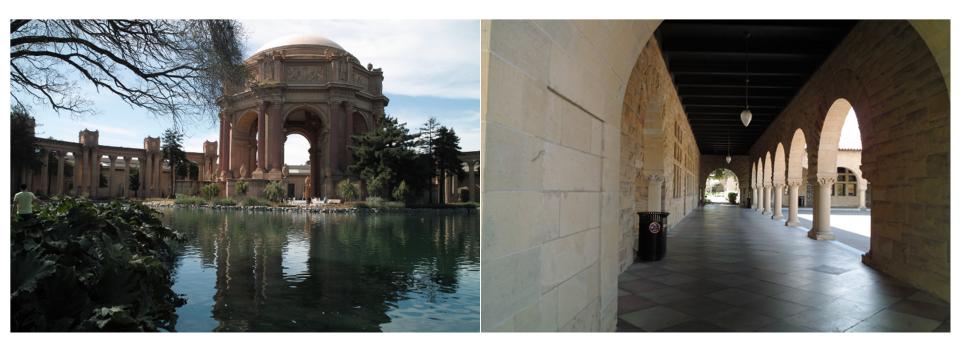
with range constraint $0 \leq I_i' = (B_i + t_i) + s_i D_i \leq 1$



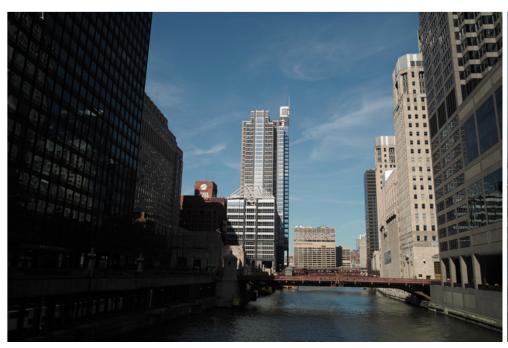
Detail control via interpolation

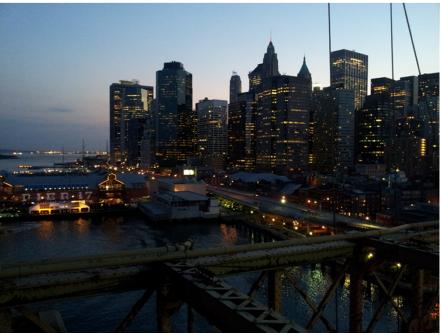
$$I_{\mu} = \mu I' + (1 - \mu)I = (\mu s + (1 - \mu))D + B + \mu t$$











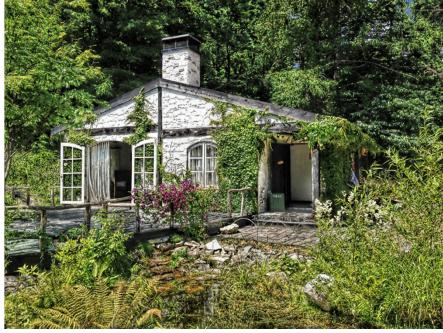


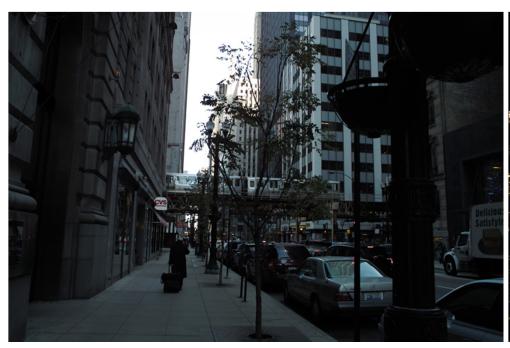






















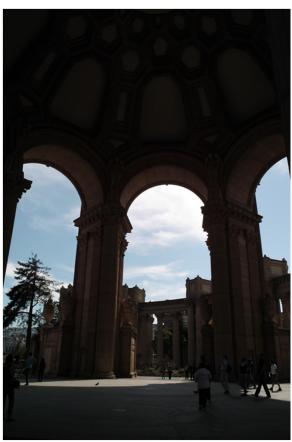








Image dehazing

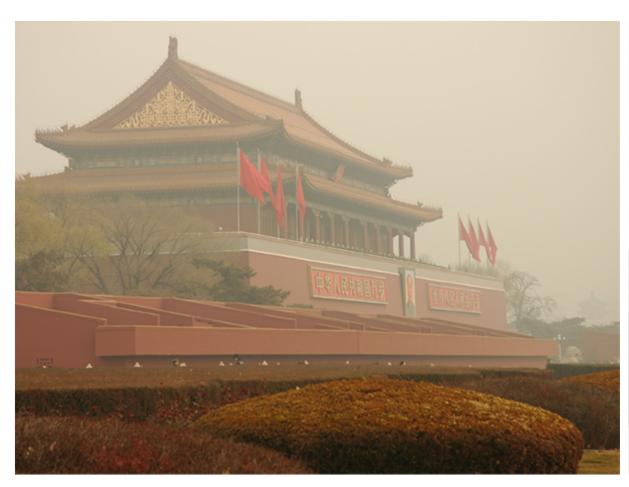
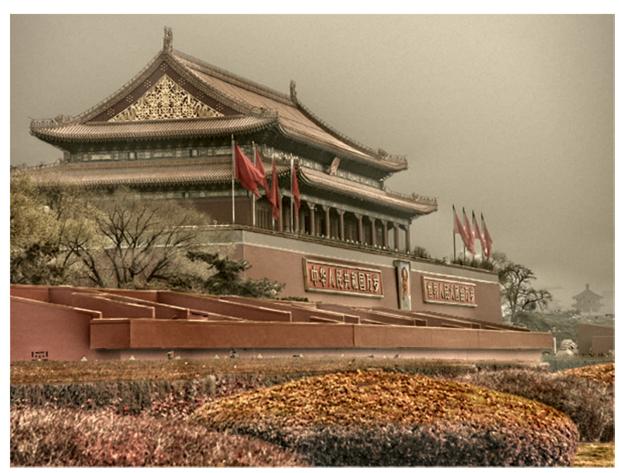


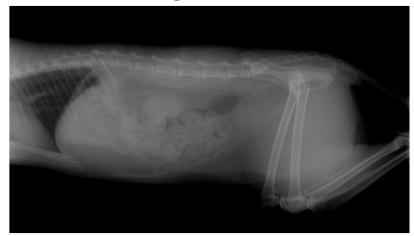


Image dehazing





Medical image enhancement



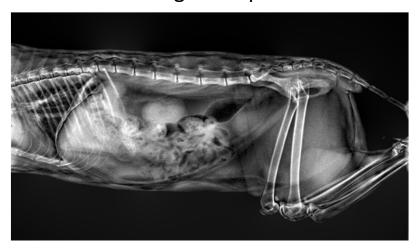
Input



Photoshopped (sharpen filter)

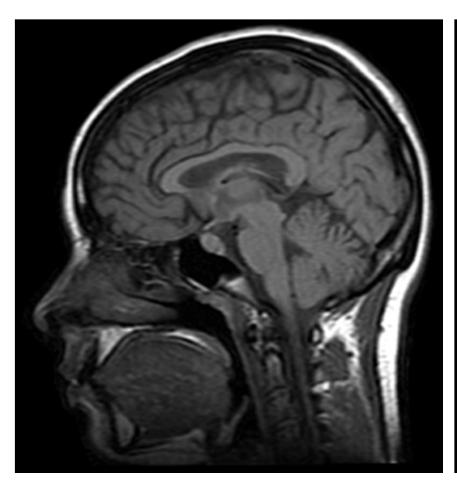


Local histogram equalization



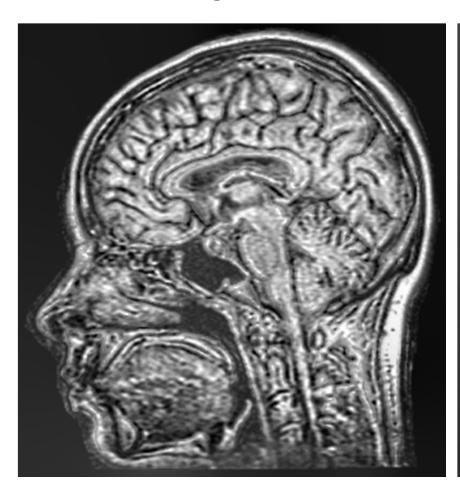
Our result

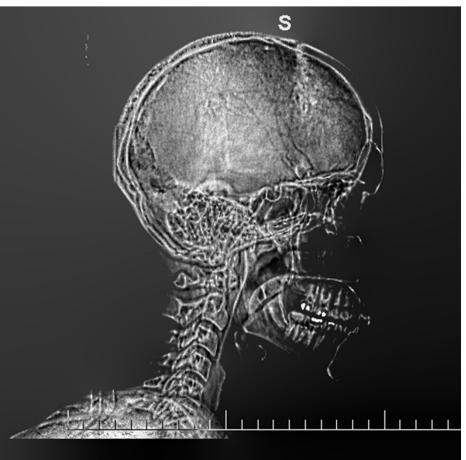
Medical image enhancement





Medical image enhancement





Comparison



Detail enhanced [Xu11]



Detail enhanced + tone mapping [Paris11]



Input



Detail enhanced + tone mapping [Farbman08]



Our result

Comparison with art photography



Input LDR image



Detail enhanced + tone mapping [Paris11]



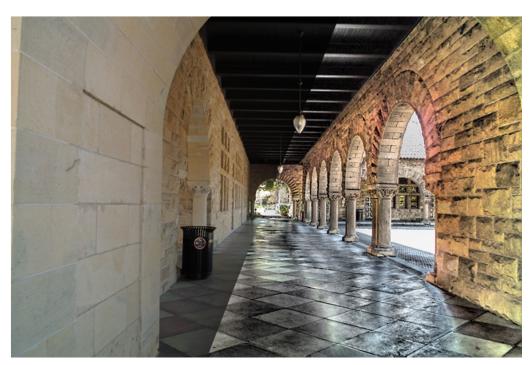
HDR imaging by Trey Ratcliff



Our result

Conclusion

- Extreme detail enhancement inspired by art photography
 - Tone transform model with base shift as well as detail scaling
 - Region-specific detail exaggeration using piecewise smooth transform
 - Optimization framework aiming to bring out extreme details in each region
- Interpolation-based level-of-detail control





Conclusion

Limitations

- Highly relying on soft region segmentation
- Possibility of brightness reversal
- Noise amplification
- 4 minutes for 512x512 size image

Future work

- Multi-level approach
- Semantic segmentation
- Specialized optimization
- Extension to color channels







