

Hierarchical Diffusion Curves for Accurate Automatic Image Vectorization

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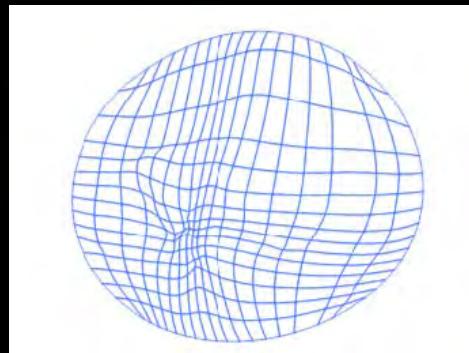
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Image Vectorization

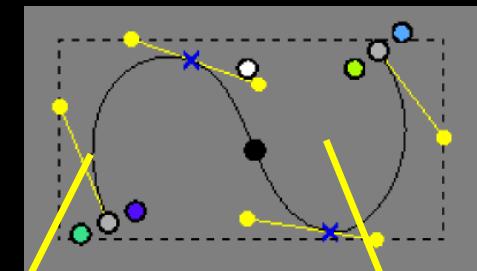
- Convert a raster image into a vector graphics
 - Vector primitives: points, curves, meshes
 - Compact, resolution-independent



Input and vector primitives [Sun et al. 07;Orzan et al. 08]

Diffusion Curves

- Definition [Orzan et al. 08]
 - Color defined on control curves
 - Non-zero Laplacian on the curves and zero Laplacian elsewhere
 - Smooth shading
- Advantage
 - Sparse control curves
 - Rich shading variations



Vectorization with Diffusion Curves

- High quality reconstruction
 - Sharp edges
 - Smooth variations
- Automatic extraction



→ Smooth variation
→ Sharp edge

Previous Work

- Manual extraction
 - [Orzan et al. 08; Jeschke et al. 11; Finch et al. 11; Sun et al. 12; Ilbery et al. 13; Sun et al. 14]
- Automatic extraction in the gradient domain
 - [Orzan et al. 07; Orzan et al. 08; Jeschke et al. 11]
 - Hard to extract curves for smooth variations



Manual extraction



Automatic extraction

Our Contribution

- Accurate automatic image vectorization
 - Hierarchical diffusion curve representation
 - Laplacian and bilaplacian diffusion curves



Key Idea

- Trace curves in the Laplacian domain instead of gradient domain
 - Capture both sharp and smooth image features



Input

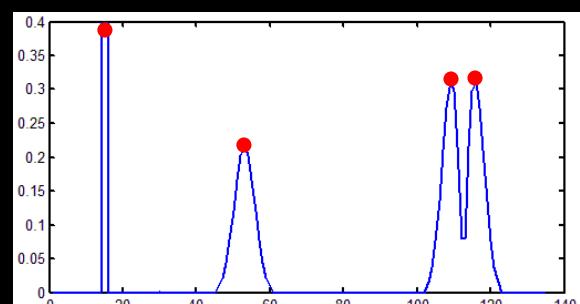
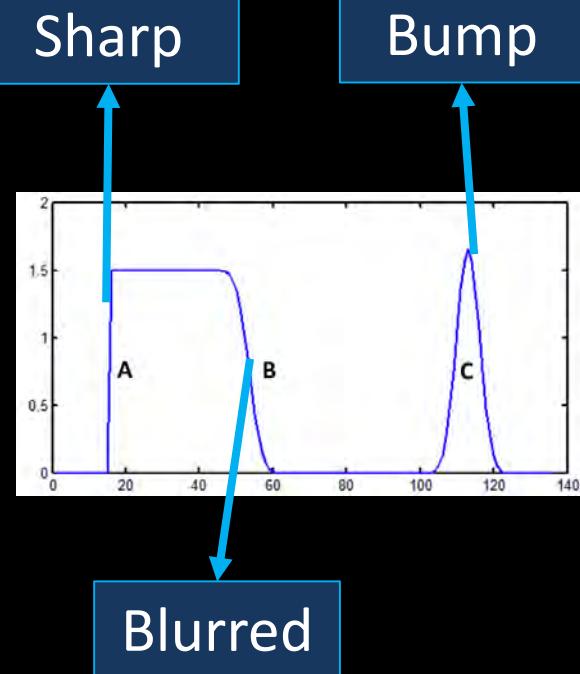


Gradient domain

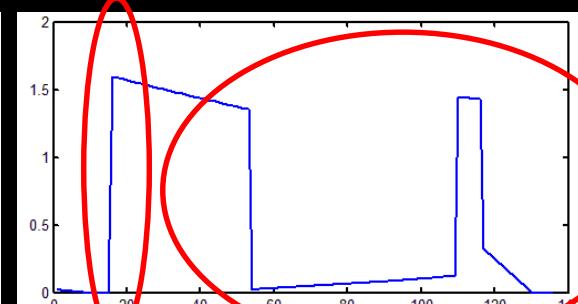


Laplacian domain

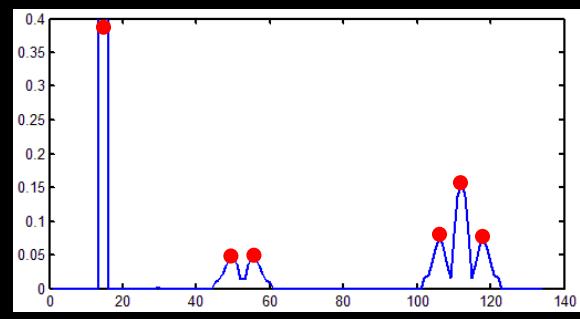
Curve Extraction (1D)



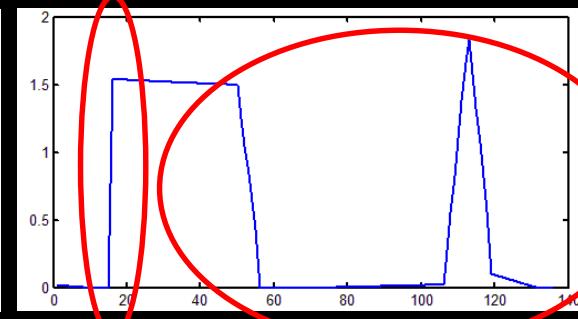
Gradient domain



Reconstruction

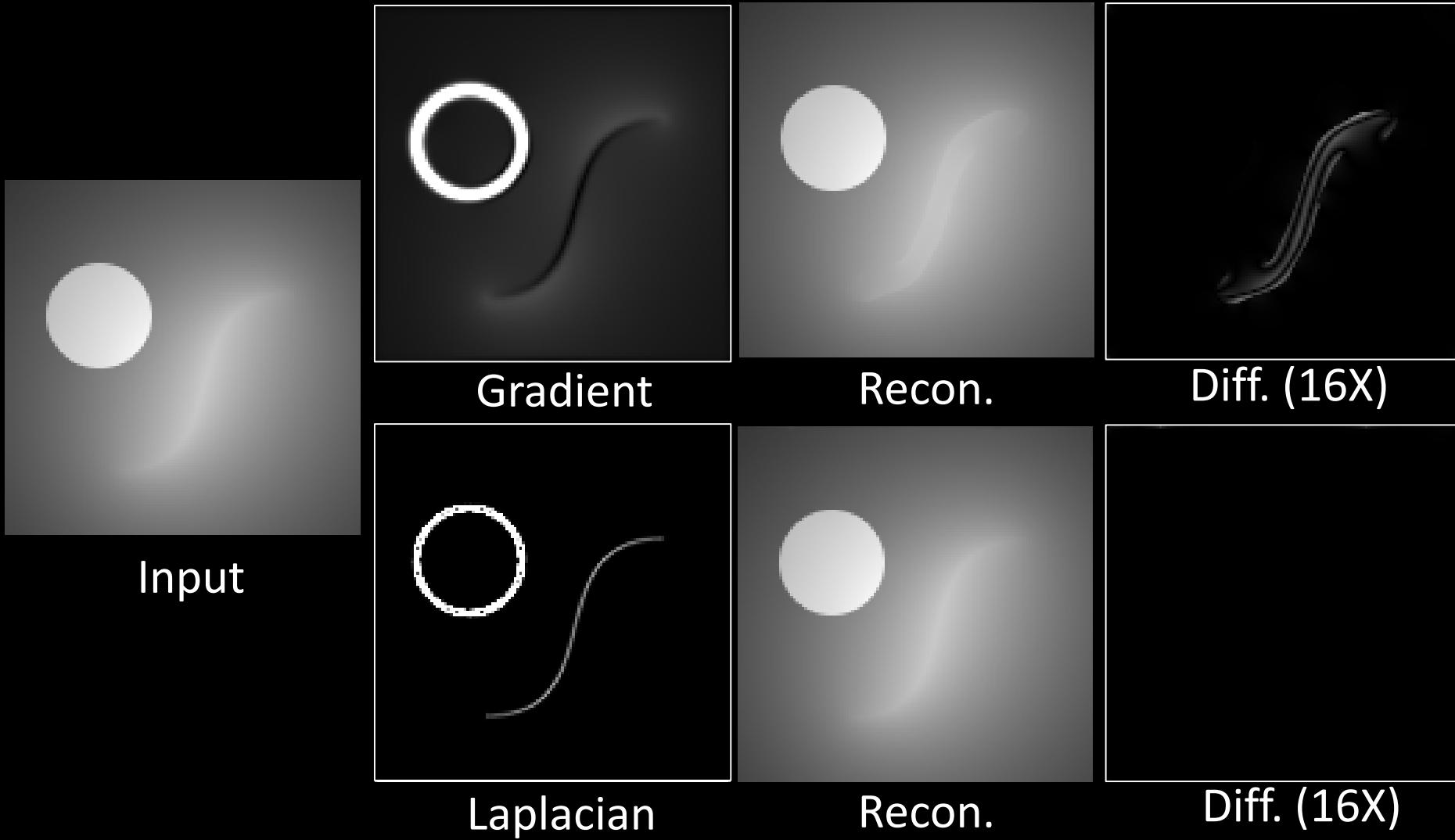


Laplacian domain



Reconstruction

Curve Extraction (2D)



One Result



Input



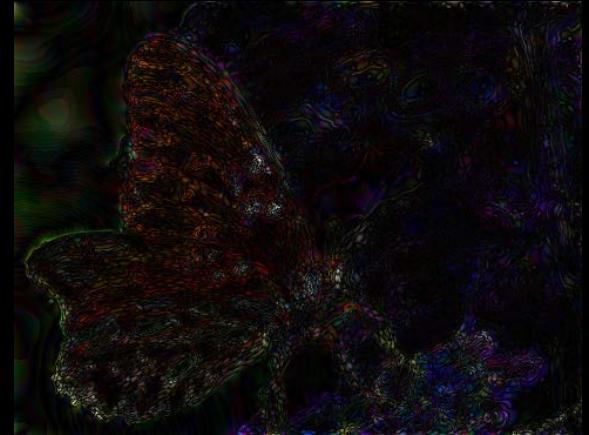
Gradient recon.



Laplacian recon.



Diff. (8X)



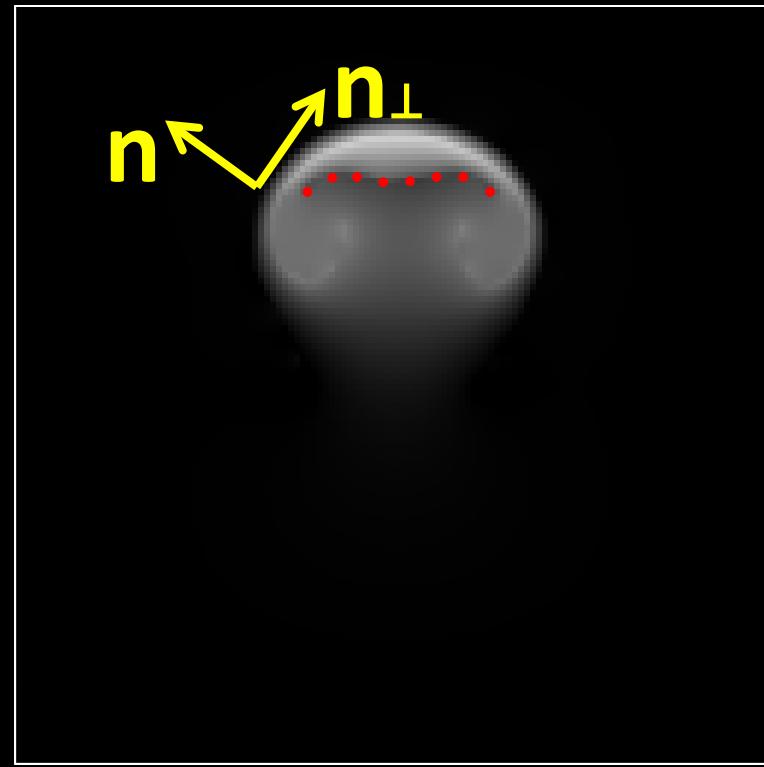
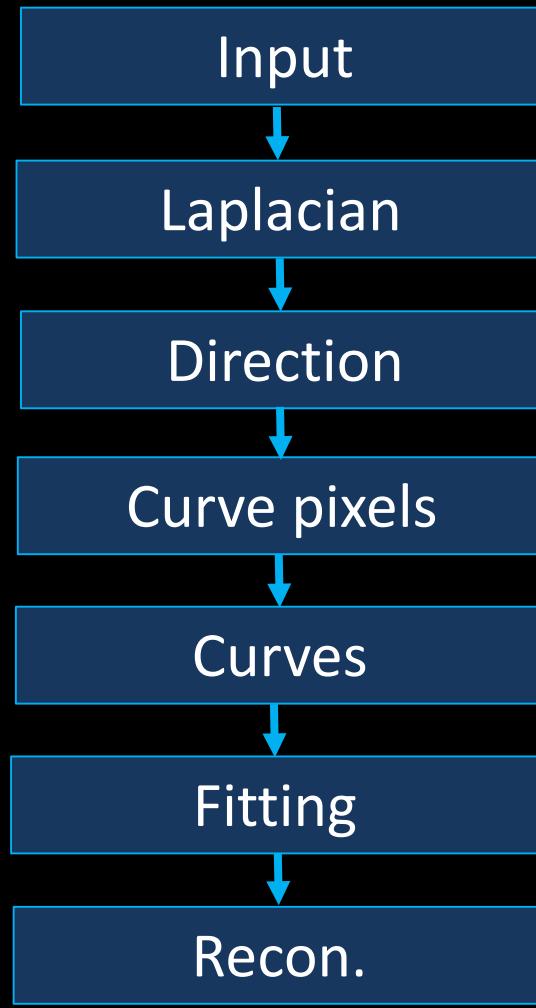
Diff. (8X)



Outline

- Curve extraction in the Laplacian domain
- Hierarchical curve construction
- Laplacian/bilaplacian diffusion curves

Curve Extraction in the Laplacian Domain



[Sun et al. 12; Ilbery et al. 13]

Approximate directional spatial derivatives of the image Laplacian

$$\frac{\partial u(x')}{\partial n(x')} \approx \int \frac{\partial u(x')}{\partial n(x')} G^L(x, x') u(x) \frac{\partial G^L(x, x')}{\partial n(x')} dx' + \phi_{\partial D} \left(\frac{\partial v(x')}{\partial n(x')} \right) G^B(x, x') - v(x') \frac{\partial G^B(x, x')}{\partial n(x')} dx'$$

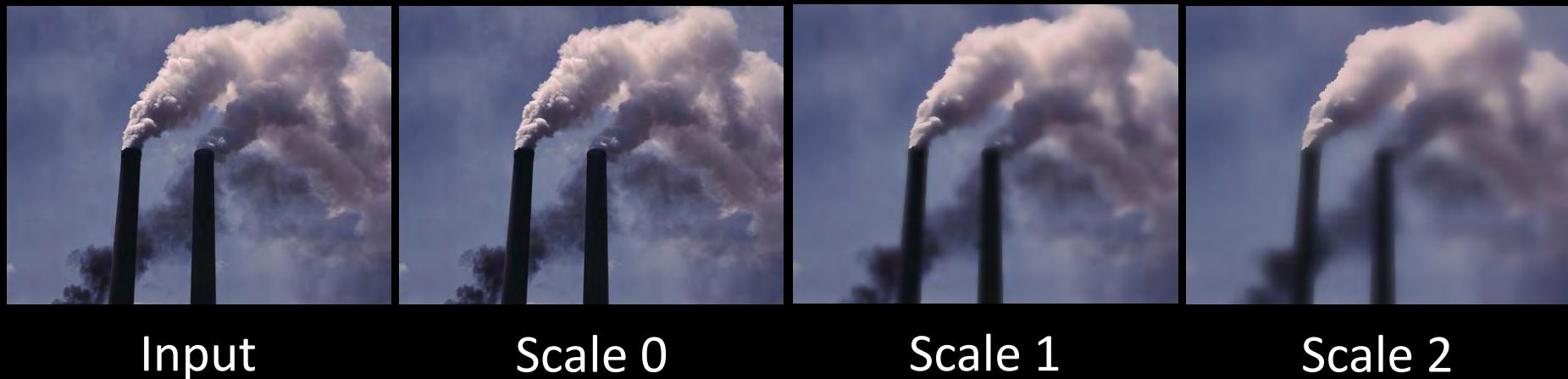
Hierarchical Representation

- Multi-scale features
- Long curves represent large scale features, while shorter curves represent smaller details

Hierarchical Curve Construction

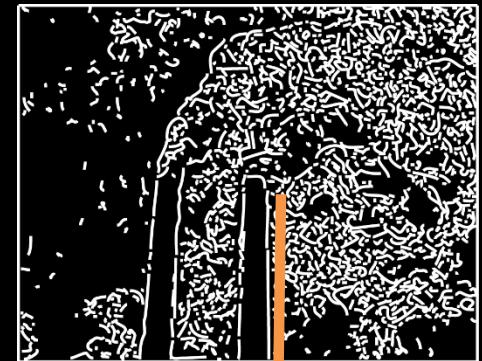
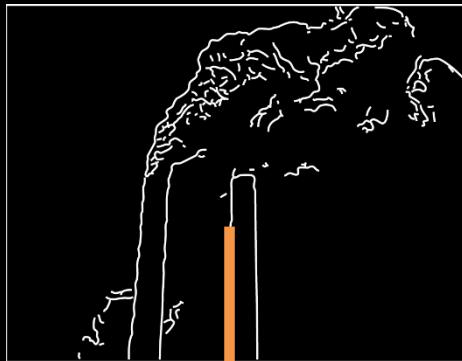
- Multi-scale bilateral decomposition
 - Structure-preserving

$$u^{j+1}[p] = 1/k \sum_{q \in \Omega_j} g_{\sigma_{s,j}}(\|q\|) g_{\sigma_{r,j}}(u^j[p+q] - u^j[p]) u^j[p+q]$$

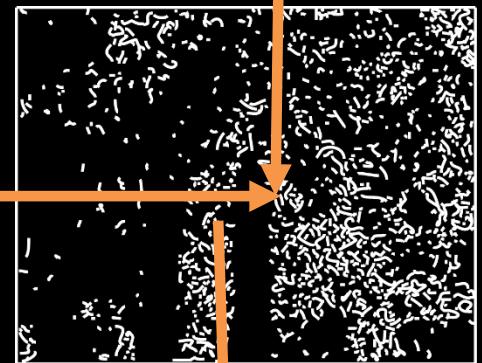
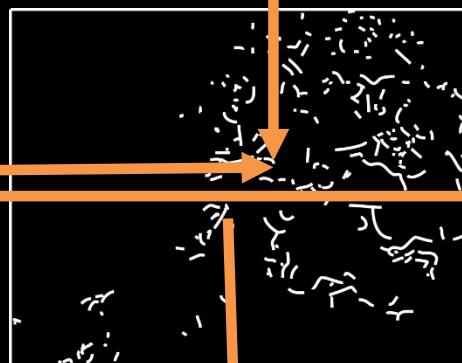
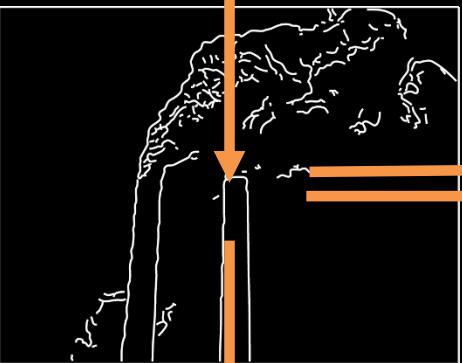


Hierarchical Curve Construction

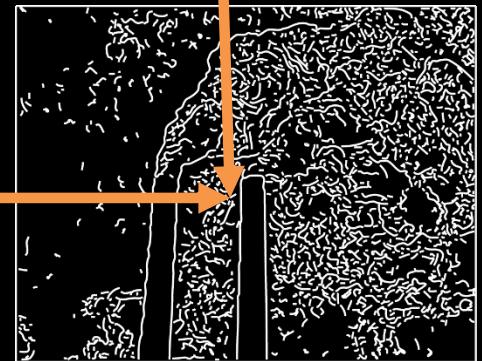
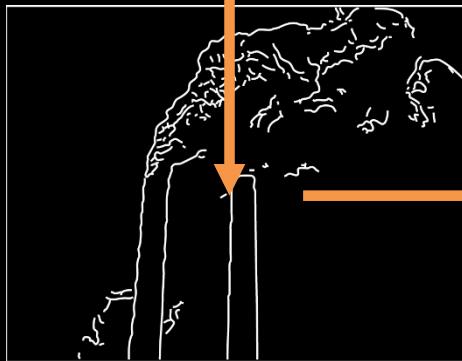
Extraction



Overlapping



Construction



Application – Multi-scale Abstraction

CO₂ ~~Concentration~~ 122



SO₂ ~~Concentration~~ 122



Application – Multi-scale Abstraction



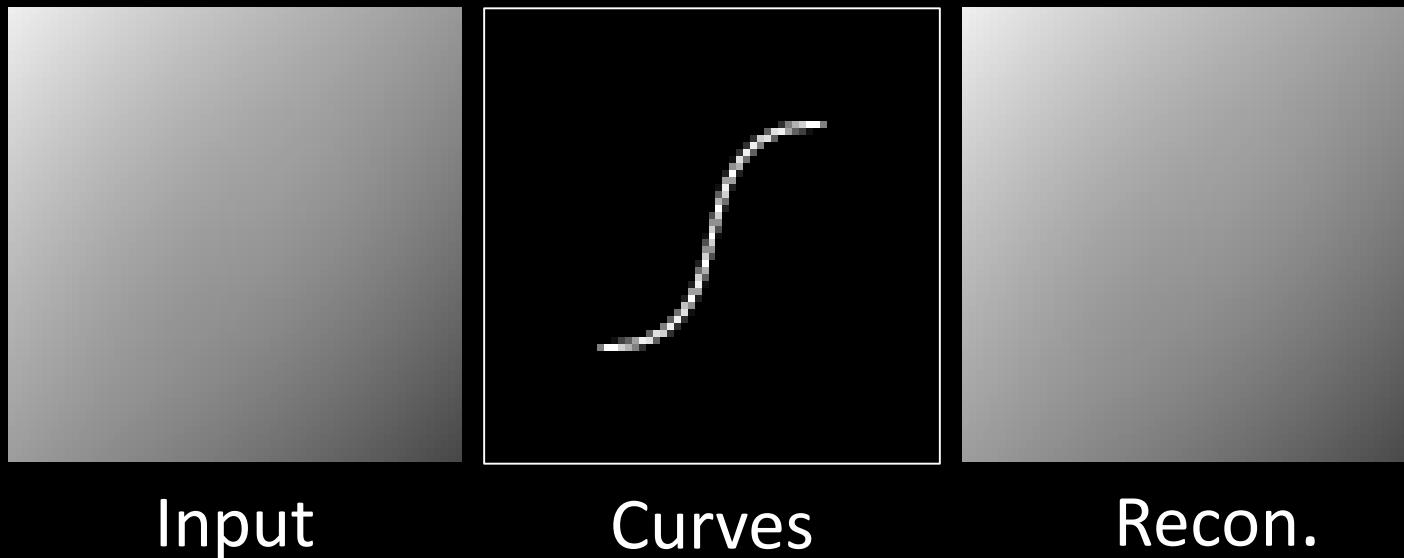
Scale 0+1+2

Scale 1+2

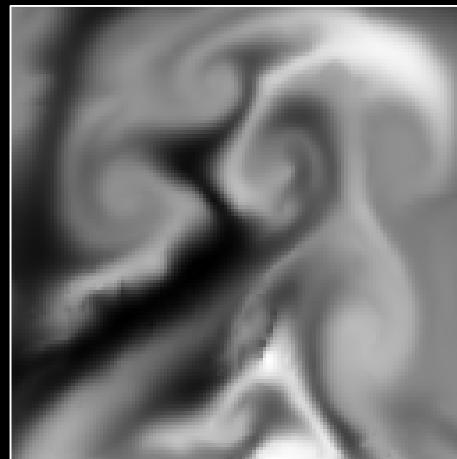
Scale 2

Bilaplacian Diffusion Curves

- Curves in the image bilaplacian domain
- Bilaplacian: higher order smooth variations
[Ilbery et al. 13]



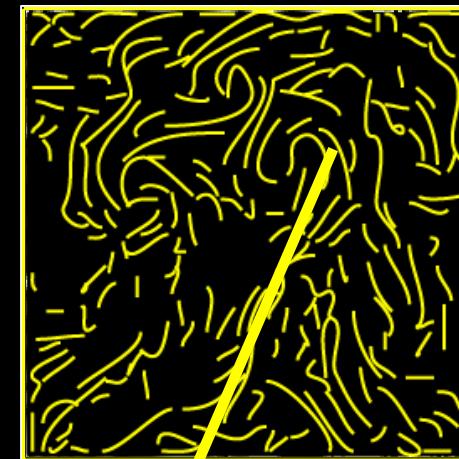
Lap./bilap. Diffusion Curves



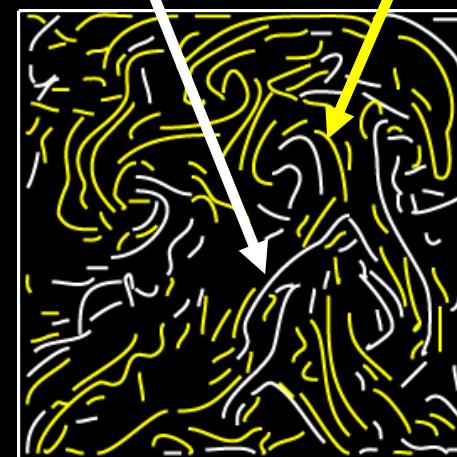
Input



Laplacian Curves

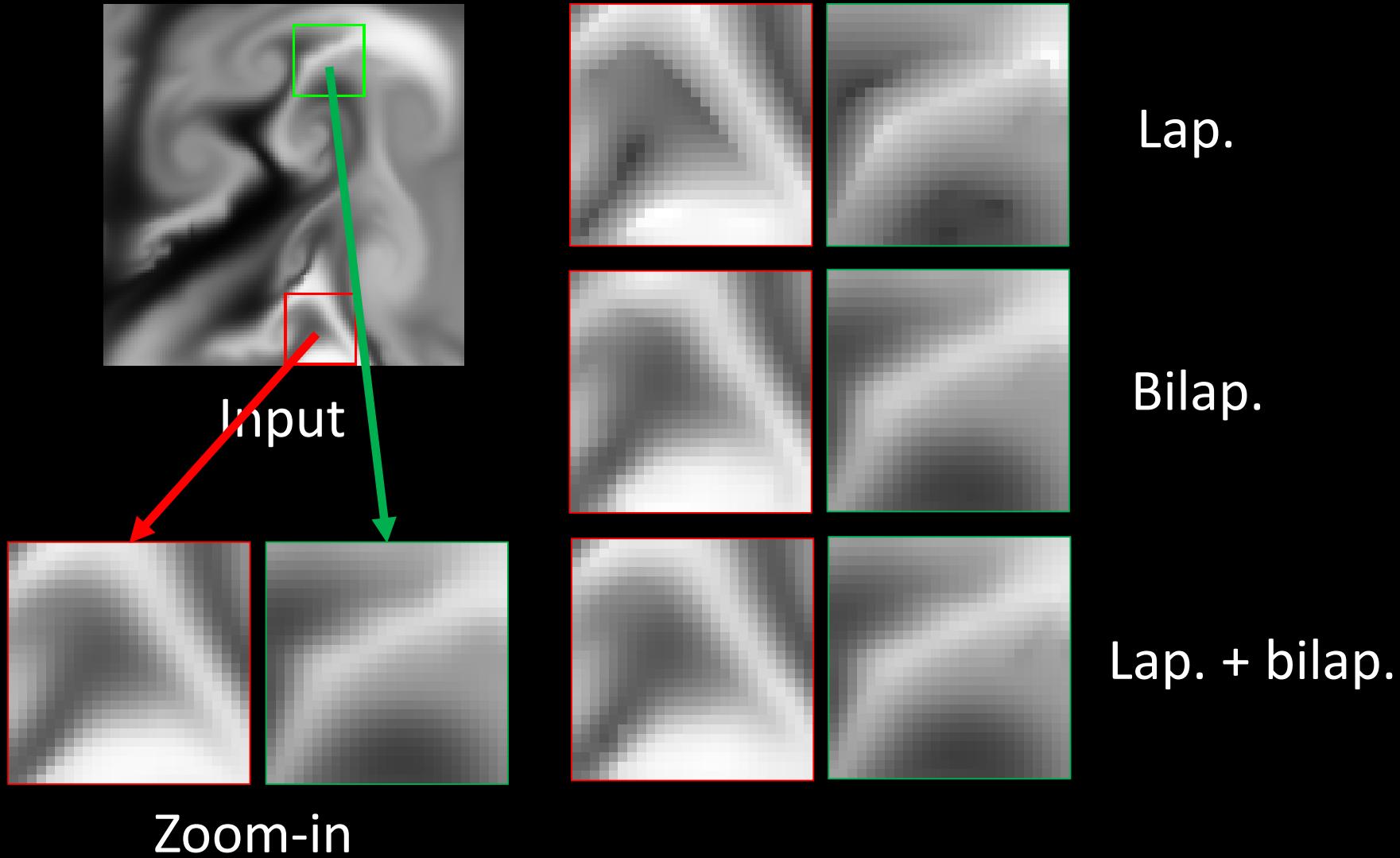


Bilaplacian Curves



Lap. + bilap. Curves

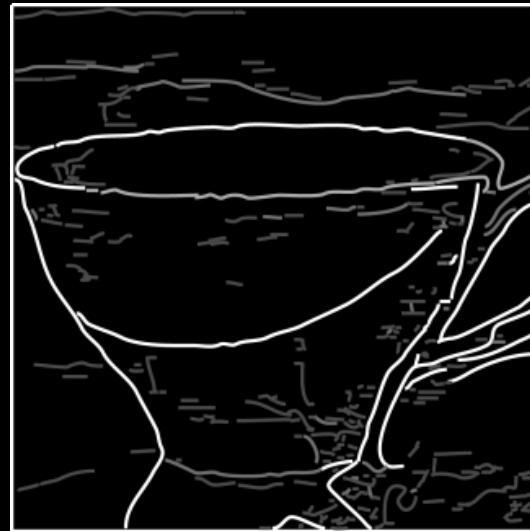
Lap./bilap. Diffusion Curves



Implementation Details

- An Intel Core i7-3770K 3.5 GHz CPU and an Nvidia Quadro 6000
- Number of Bezier curves: 42 ~ 45K
- Storage: 36KBytes ~ 363KBytes
- Fitting: 21.9s ~ 660s
- Performance: 40.8ms ~ 591ms

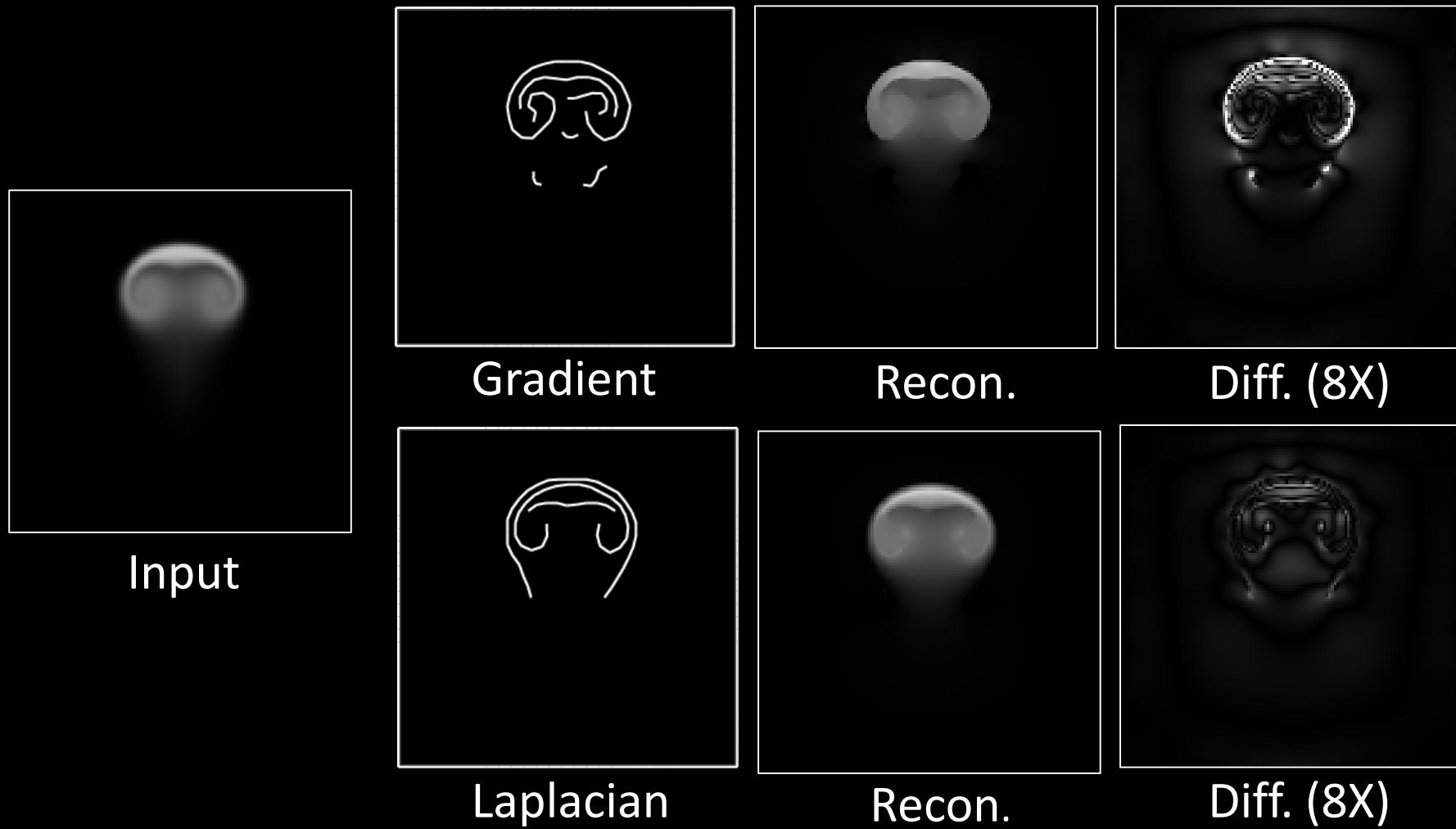
Results



Results



Comparison: Gradient vs. Laplacian



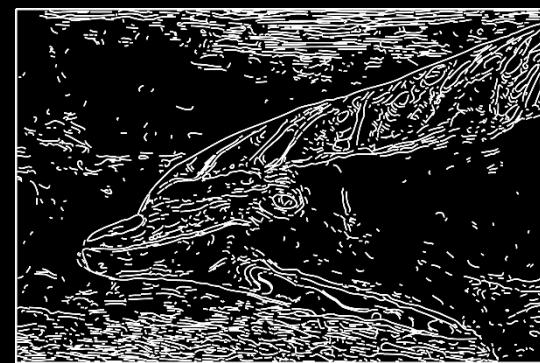
Comparison with [Orzan et al. 08]



Input



Gradient curves



Our curves



Without blur

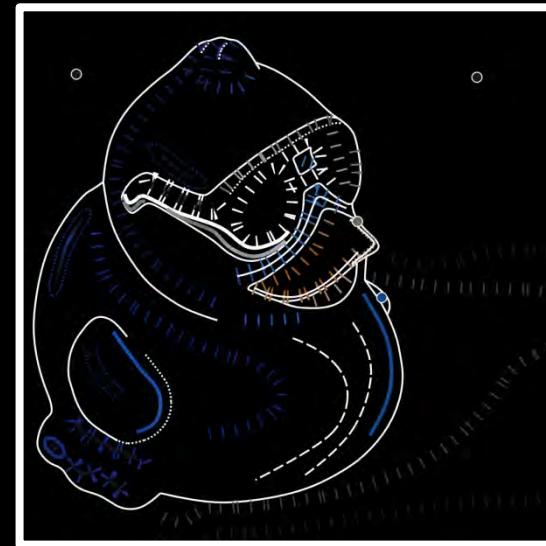


With blur



Our result

Comparison: FFG



Freeform vector
graphics



Ours

Hierarchical Representation and Abstraction



Input



Curves



Scale 2

Scale 1

Scale 0

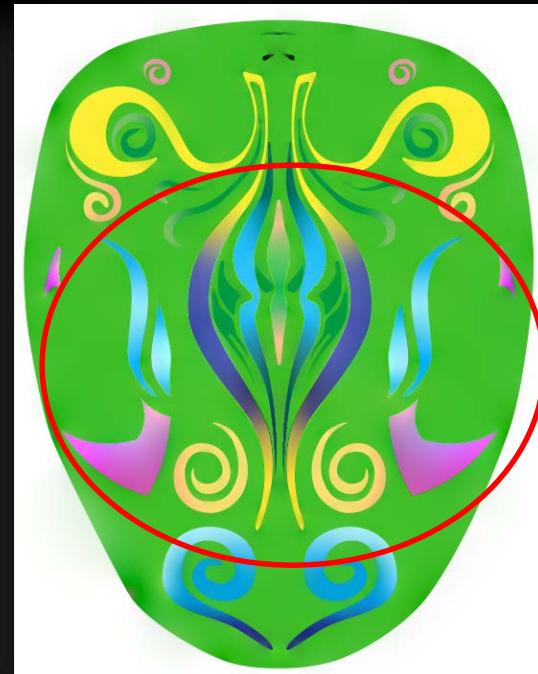
Editing



Input



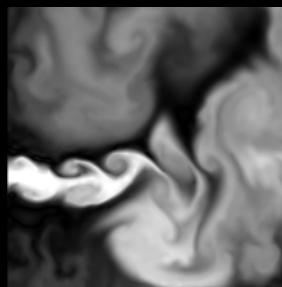
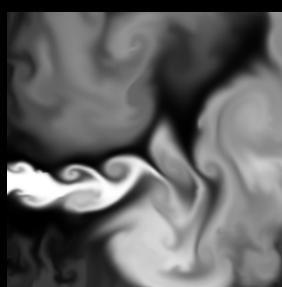
Curves



Reconstruction



More Results



Conclusion

- Accurate and fully automatic method
- Vectorize images using diffusion curve representation
 - Extract curves in the Laplacian/bilaplacian domain
 - Propose hierarchical fitting and multi-scale representation

Limitations and Future Work

- Limitations
 - Remove image features with low contrast
 - Generate many short curves for noisy images
- Future work
 - 3D volume vectorization
 - Animation sequences



Acknowledgements

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Thank you!