# **Applications**

Image shrinking

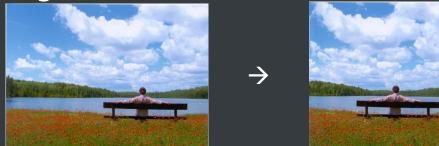


Image Enlargement
 Seam Carving → Seam Insertion







# Note: Find seams in order of removal

[1] Avidan, S., & Shamir, A. (2007, August). Seam carving for content-aware image resizing. In ACM Transactions on graphics (TOG) (Vol. 26, No. 3, p. 10). ACM.

# **Applications**

Object Removal

Set certain region of the Energy map to a low value







Original

Mask

Result

## **Energy Function**

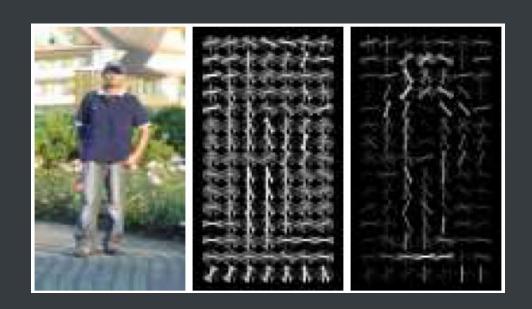
L1 
$$e_1(\mathbf{I}) = \left| rac{\partial}{\partial x} \mathbf{I} 
ight| + \left| rac{\partial}{\partial y} \mathbf{I} 
ight|$$

L2 
$$e_2(\mathbf{I}) = \sqrt{\left|rac{\partial}{\partial x}\mathbf{I}
ight|^2 + \left|rac{\partial}{\partial y}\mathbf{I}
ight|^2}$$

Hog 
$$e_{HoG}(\mathbf{I}) = rac{\left|rac{\partial}{\partial x}\mathbf{I}
ight| + \left|rac{\partial}{\partial y}\mathbf{I}
ight|}{\max(HoG(\mathbf{I}(x,y)))}$$

## HoG

# $HoG(\mathbf{I}(x,y))$ Histogram of oriented Gradients 1 at every pixel



[1] DALAL, N., AND TRIGGS, B. 2005. Histograms of oriented gradients for human detection. In International Conference on Computer Vision & Pattern Recognition, vol. 2, 886–893.

## **Use Protection**

Object Removal with protection

Set certain region of the Energy map to a high value



Original



Without Protection



With Protection

Image resizing with object protection

Motivation

Calculating cumulative map is time-consuming

Target

Implement a one-shot method for pinpointing seams

Restrictions

Seam removal or addition influences cumulative energy map Same number of pixels removed or added at each row/column

Improved method

Pinpoint multiple seams with low energy in ascending order

Typical condition

Two paths share the same pixel that causes distortion Find a suboptimal solution within its connected area or do back trace



Multiple seams per calculation

Red curves represent final seams, yellow regions show where back trace occurs



Left: one seam per calculation Middle: multiple seams per calculation

Right: some pixels that cannot be chosen due to pre-defined restrictions

## Restrictions

- Top-k optimal solutions energy within range
- Energy increment of suboptimal solution exceeds threshold
- Ratio of remaining effective pixels lower than threshold

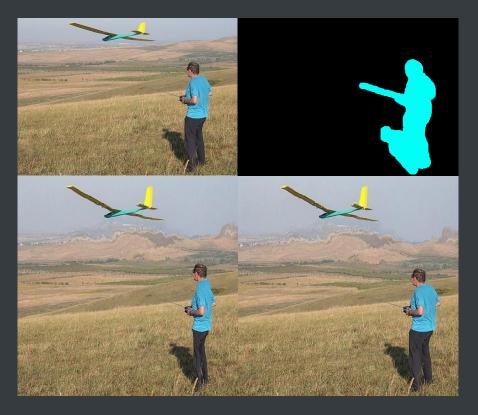


Two seams occupy bottom right corner

If parallel, the whole yellow triangle region cannot be selected to construct seams, as invalid pixels

# **Effect of Protection**





## **Different Speed**

Conclusions on time consumption

Perform best on simple resize task, comparatively weak on tasks with masks for extra restrictions

Task	Origin	Target/Mask	Original/s	Improve/s	Ratio
Resize	(384,512)	(300,400)	114	14	8.14
Resize	(384,512)	(500,700)	334	63	5.30
Protect	(199,399)	(199,100)	55	21	2.62
Protect	(199,399)	(250, 450)	56	21	2.67
Remove	(320,448)	14935	120	67	1.79
Remove	(320,448)	3337	52	34	1.53
Both	(320,448)	3337/14935	50	60	0.83
Both	(320,448)	14935/3337	137	79	1.73

# Comparison

Due to irregular shape of the mask, the accelerated version tends to remove excessive seams.



Original image



Seam Carving 137s



Seam Carving 50s



Accelerate version 79s



Accelerate version 60s

## **Different Restrictions**

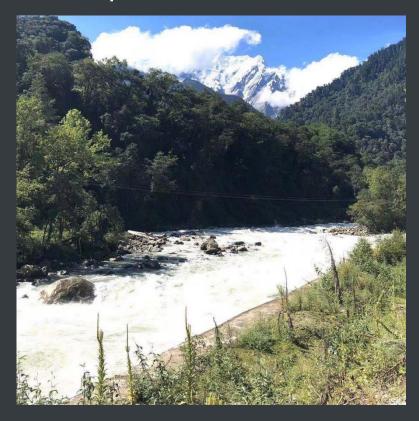
Conclusions on restrictions

Suboptimal energy increment imposes stricter restrictions Two restrictions are not independent, but promoting mutually

Accelerate	Sub Inc	Eff Ratio	Runtime/s	Ratio
×	/	/	1719	/
✓	×	×	72	23.88
✓	×	$\checkmark$	109	15.77
✓	$\checkmark$	×	215	8.00
✓	$\checkmark$	$\checkmark$	211	8.15

## **Different Restrictions**

Examples for different restrictions



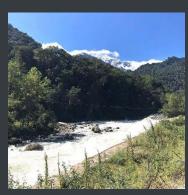
Seam Carving



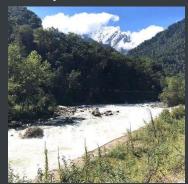
Top-k



Top-k+Sub-inc

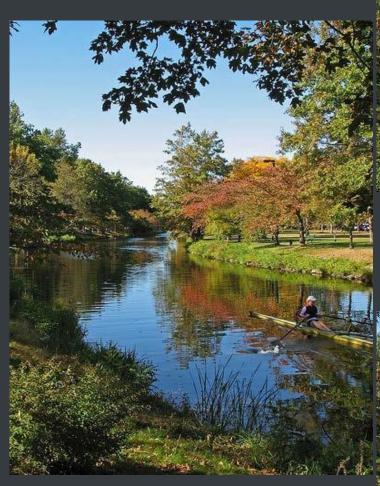


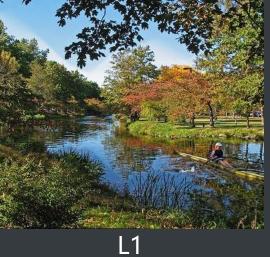
Top-k+Eff-rat

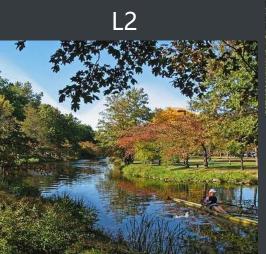


All

# **Different Energy Function**









HoG

Original

# **Different Energy Function**

Original



the seam will run parallel to the edge and will not cross it







HoG

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L2

16

# **Visualization of Seam Picking Order**





L1 HoG

A seam is red means we pick it very early; yellow means the contrary.

# **Visualization of Seam Picking Order**





L1 HoG

A seam is red means we pick it very early; yellow means the contrary.

# **Failed Scenario**





Big Ratio&Crowded





Line Structure