

# Exemplar-Based Image Completion

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- 1 Introduction to Image Completion
- 2 Exemplar-based Image Completion — Criminisi's Algorithm
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# What is Image Completion

Given an input image  $I$ , as well as a target region  $T$  and a source region  $S$  (where  $S$  is always a subset of  $I - T$ ), the goal of image completion is to fill  $T$  in a visually plausible way.

# Types of Image Completion

- Texture Synthesis



- Image Inpainting



- Object Removal



# An Ideal Algorithm for Image Completion

An ideal algorithm for image completion should be able to

- complete complex natural images
- handle large target region
- done in a fully automatic manner

# Approaches for Image Completion

- Statistical-based
  - estimating statistics
  - for images with stochastic content (i.e., texture synthesis)
- PDE-based
  - simulating diffusion process by partial differential equations
  - for image with small target region (i.e., image inpainting)
- Exemplar-based

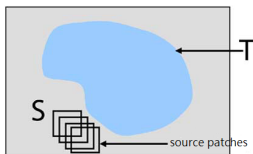
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# Exemplar-based Approach

- Copying source patches to target patches
  - what is the order of target patches to be filled
  - which source patch is the best choice for the specific target patch



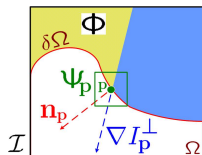
# Criminisi's Algorithm

A. Criminisi, P. Perez, K. Toyama

Region filling and object removal by exemplar-based inpainting

In 2004 IEEE Transactions on Image Processing 9 1200-1212

# Criminisi's Algorithm



- Extract the manually selected initial front  $\delta\Omega^0$ .
- Repeat until done:
  - 1a. Identify the fill front  $\delta\Omega^t$ . If  $\Omega^t = \emptyset$ , exit.
  - 1b. Compute priorities  $P(p) \quad \forall p \in \delta\Omega^t$ .
  - 2a. Find the patch  $\Psi_{\hat{p}}$  with the maximum priority, *i.e.*,  $\hat{p} = \arg \max_{p \in \delta\Omega^t} P(p)$ .
  - 2b. Find the exemplar  $\Psi_{\hat{q}} \in \Phi$  that minimizes  $d(\Psi_{\hat{p}}, \Psi_{\hat{q}})$ .
  - 2c. Copy image data from  $\Psi_{\hat{q}}$  to  $\Psi_{\hat{p}} \quad \forall p \in \Psi_{\hat{p}} \cap \Omega$ .
- 3. Update  $C(p) \quad \forall p \in \Psi_{\hat{p}} \cap \Omega$

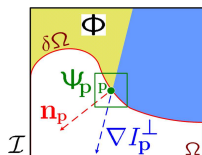
# Criminisi's Algorithm

## 1b. Computing priorities of target patches

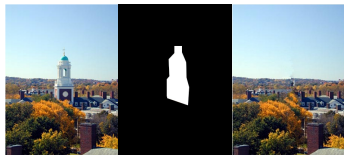
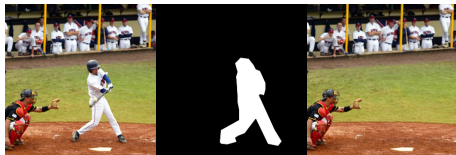
- the priority computation is biased toward those patches which are
  - on the continuation of strong edges
  - surrounded by high-confidence pixels

- $P(p) = C(p)D(p)$

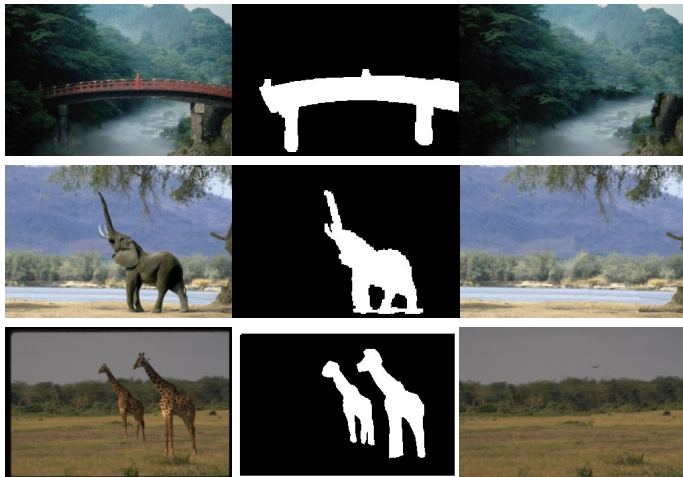
- confidence term  $C(p) = \frac{\sum_{q \in \Psi_p \cap (I - \Omega)} C(q)}{|\Psi_p|}$
- data term  $D(p) = \frac{|\nabla I_p^\perp \cdot n_p|}{\alpha}$  ( $\alpha$  is a normalization factor)



# Results



# Results



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