

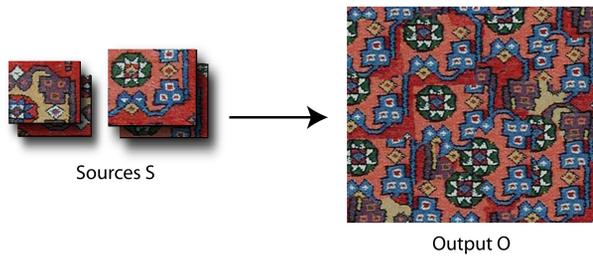
# Constrained Graphcut Synthesis

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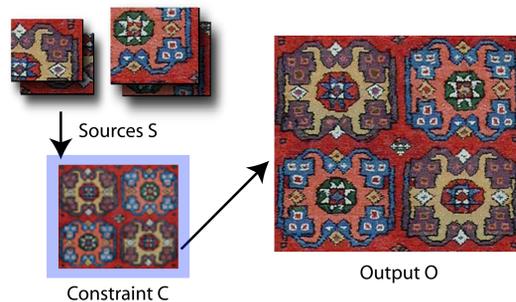
OVERVIEW

## Problem



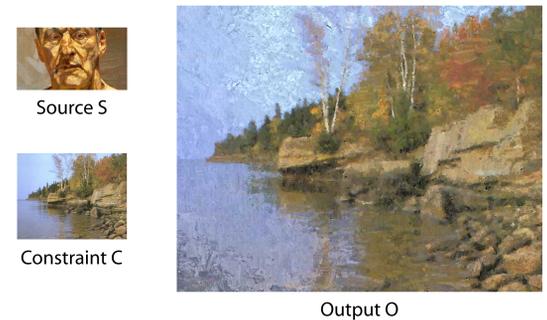
- Texture synthesis, while powerful, is **unpredictable** and **ill-defined**
- **Goal:** Robust, **controllable** texture synthesis
- **Challenges:**
  - How does a user control synthesis?
  - How do we define and measure **quality**?
- **Applications:** image analogies, detail synthesis, texture creation for games

## Solution - CGS



- **Related work:**
  - Constrained synthesis: [Hertzmann01] [Efros01] [Ashikhmin01] [Schödl02]
  - Graphcut Textures: fast, high-quality unconstrained synthesis [Kwatra03]
- **Approach:** **Add constraints to graphcuts**
- **Insight:** **Leverage unused term of graphcut minimization framework**
- Simultaneously optimize **constraint match** and **texture seamlessness**

## Contributions

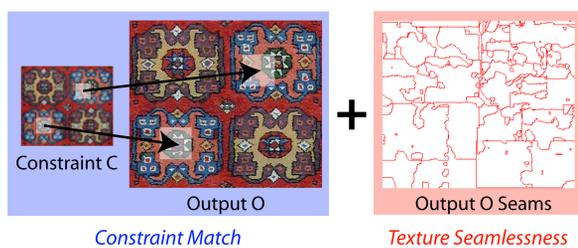


CGS run on artistic filtering example from [Hertzmann01]

- **Robustness:** Formulates synthesis as **global energy minimization**
- **Quality:** Comparable to [Kwatra03], while supporting constraints also
- **Efficiency:** Significant performance increase over previous work
- Addresses **large search spaces** in graphcut minimization

ALGORITHM

## Measure of Quality

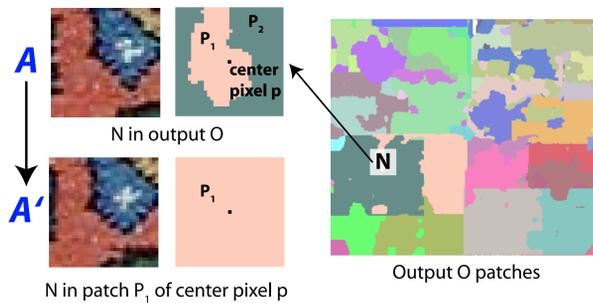


- **Constraint match:** compare neighborhoods  $N$  in constraint  $C$  and output  $O$
- **Texture seamlessness:** difference between adjacent pixel pairs [Kwatra03]
- Sum over all neighborhoods and pairs:

$$\sum_{N \in O} A(C(N), O(N)) + \sum_{(p,q) \in O} M(p,q,O)$$

Agreement Cost  $A$       Seam match cost  $M$

## Setting up Graph Mincut

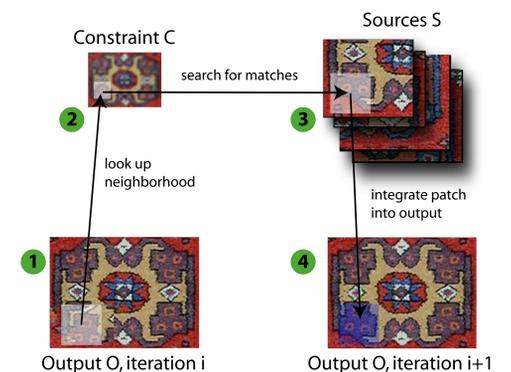


- Graphcuts cannot be applied to  $A$  since neighborhoods contain multiple patches
- Instead, use  $A'$ : assume neighborhood only contains center pixel's patch
- Works well due to simultaneous optimization of seam and neighboring  $A'$  costs

$$\sum_{p \in O} A'(C(N(p)), P_p(N(p))) + \sum_{(p,q) \in O} M(p,q,O)$$

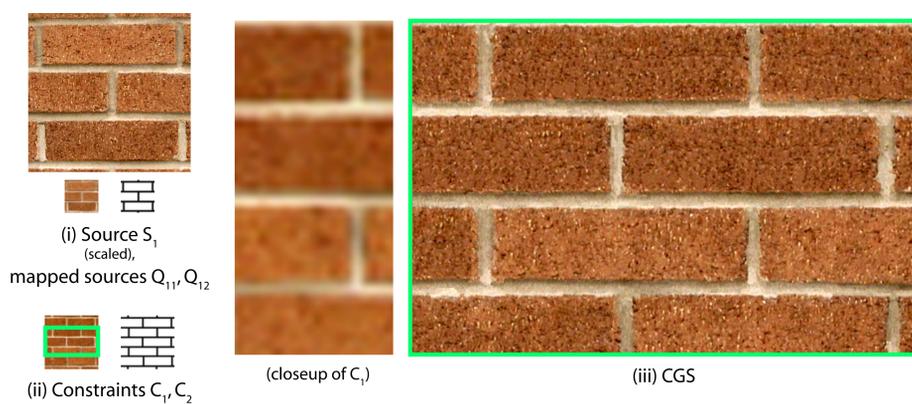
Final Objective Function  $E$

## Final Algorithm



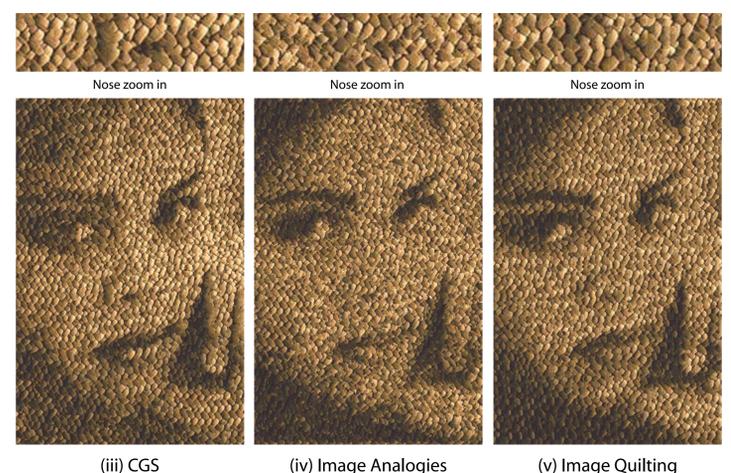
- **Step 1:** Find worst neighborhood of  $O$
- **Step 2:** Look up corresponding neighborhood in  $C$
- **Step 3:** Identify set of potential matching patches in  $S$
- **Step 4:** Integrate best match into  $O$  using graph mincut with  $E$
- **Termination condition:** Loop until no improvement

RESULTS

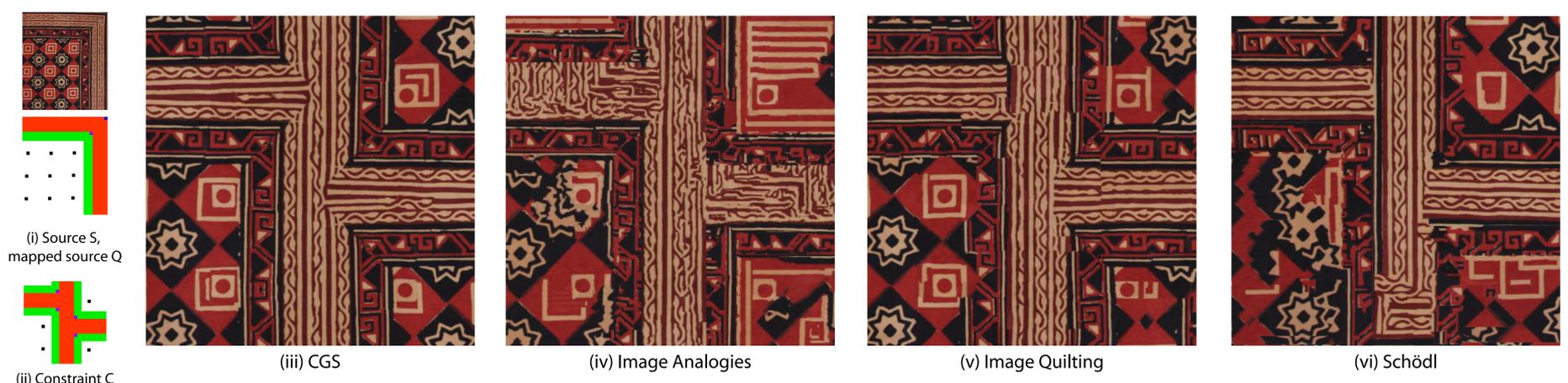


## Novel Application:

## Detail Synthesis w/ Multiple Constraints



## Texture Transfer



## Texture-by-Numbers