

CS 4800: Algorithms & Data

Lecture 9

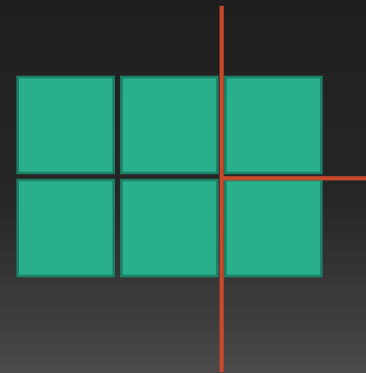
February 7, 2017

Blueprint of DP in knapsack

Subproblems	$Best(i, C)$: max value for sack size C with items $\{i, i+1, \dots, n\}$
Guess	Whether pick item i or not
Recurrence	$Best(i, C) = \max(v_i + Best(i + 1, C - w_i), Best(i + 1, C))$
Order	Compute $Best(i, C)$ for i from n down to 1
Solve orig. problem	Return $Best(1, W)$

Chompo bar

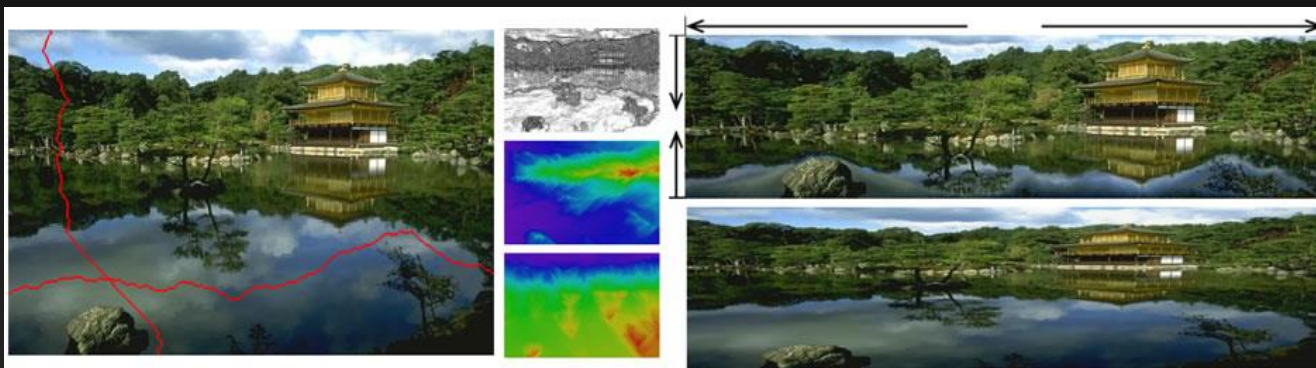
- Given an $n \times m$ bar
- Wants to break into perfect squares with minimum number of cuts
- With each cut, can split the bar horizontally or vertically
- 2×3
 - $\rightarrow (2 \times 2, 2 \times 1)$
 - $\rightarrow (2 \times 2, 1 \times 1, 1 \times 1)$



Blueprint of DP in chompo bar

Subproblems	$C(j,k)$: number of cuts to divide a $j \times k$ bar into perfect squares
Guess	First cut
Recurrence	
Order	
Solve orig. problem	

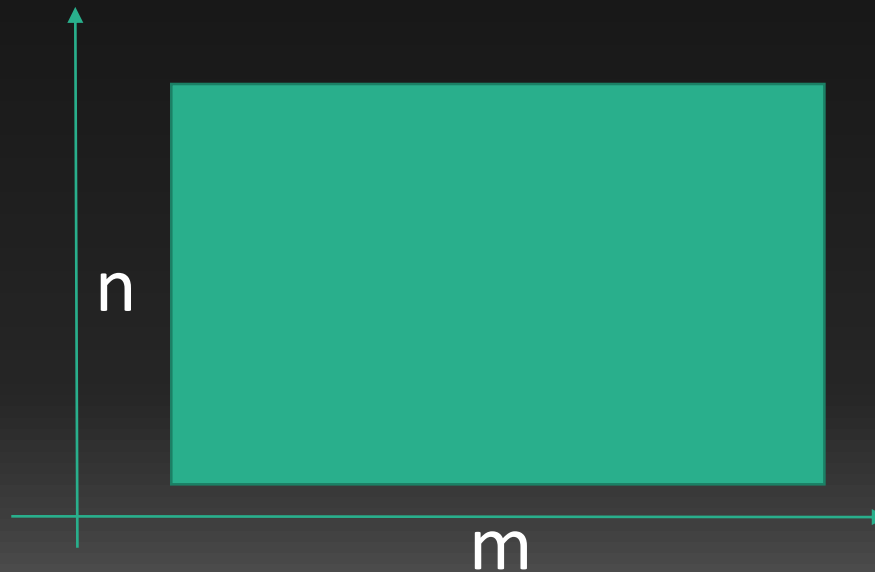
Seam carving



Avidan, Shamir SIGGRAPH'07

Which seam to delete?

- Define energy function $\sim$ amount of information for each pixel
- Find minimally informative seam and delete



Pixel energy

- Energy = How much color variation around (x_0, y_0)
- Energy = Magnitude of gradient

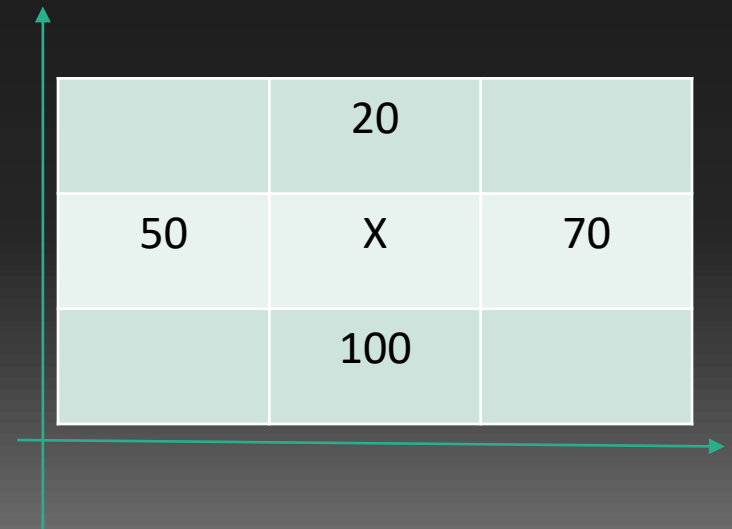
$$e(x_0, y_0) = e_x(x_0, y_0) + e_y(x_0, y_0)$$

where

$$e_x(x_0, y_0) = |Img(x_0 + 1, y_0) - Img(x_0 - 1, y_0)|$$

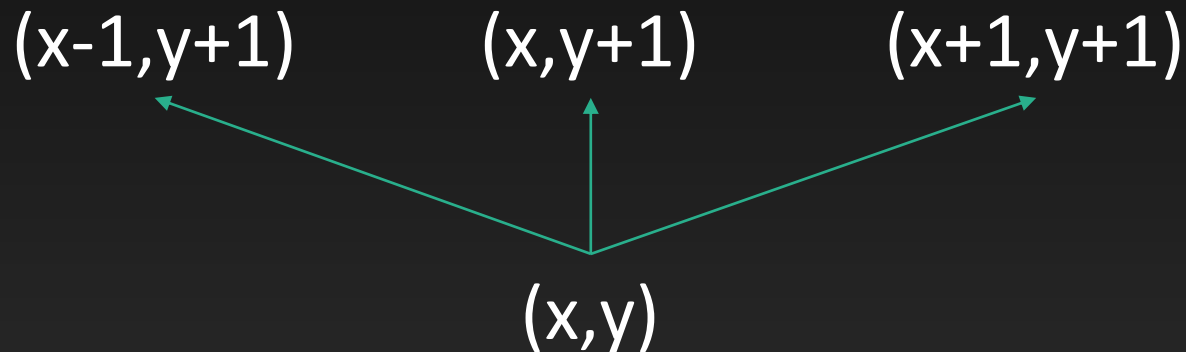
$$e_x(x_0, y_0) = 20$$

$$e_y(x_0, y_0) = 80$$



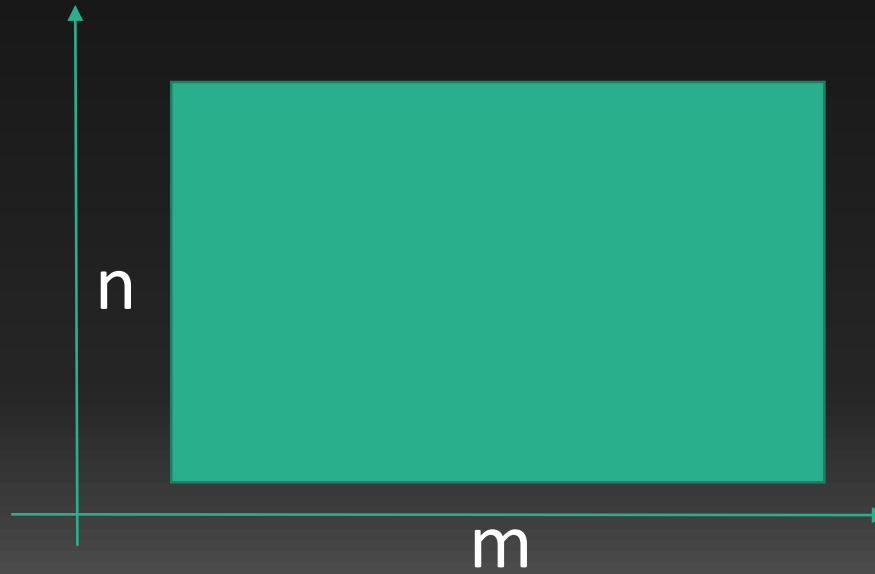
Find least energy vertical seam

- A vertical seam goes from bottom edge to top edge



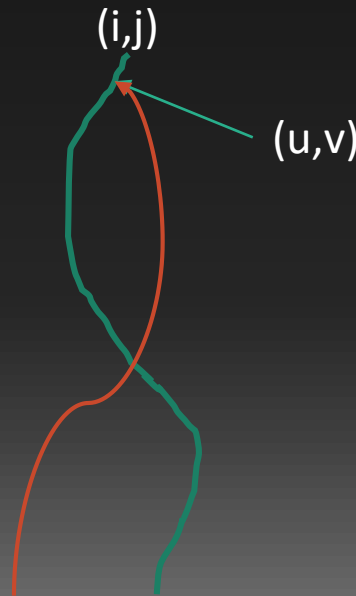
Identify subproblems

- $S(x,y)$: least energy to go from bottom edge to (x,y)
- Best seam to be deleted has to be the one with least energy among $S(1,n)$, $S(2,n)$, ..., $S(m,n)$



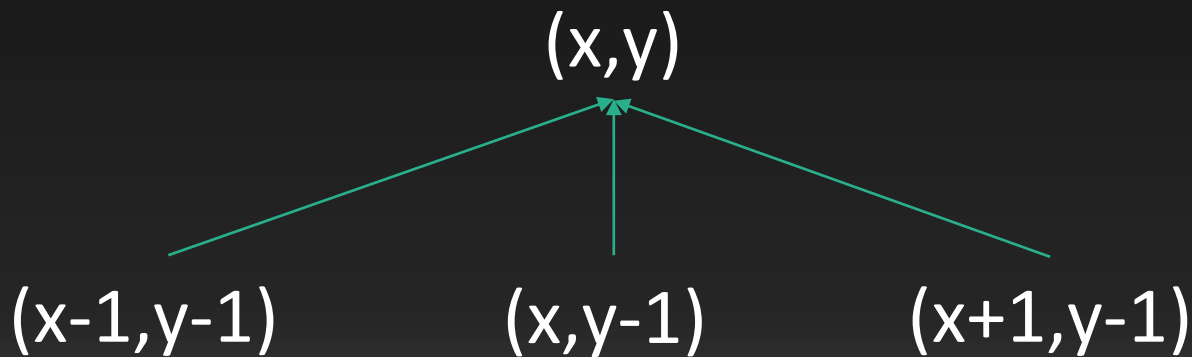
Optimal substructure

- Consider the optimal seam to reach (i,j)
- Consider the last point (u,v) on the seam before reaching (i,j)
- Path from bottom to (u,v) must also be optimal



Recursive relation

- $S(x, y) = e(x, y) + \min \begin{cases} S(x-1, y-1) \\ S(x, y-1) \\ S(x+1, y-1) \end{cases}$



Evaluation order

- Initialize $S[x, 0] \leftarrow 0 \ \forall x$ // base cases
- Initialize $S[0, y] \leftarrow \infty, S[m + 1, y] \leftarrow \infty$ // sentinels
- For $y \leftarrow 1$ to n , // go from bottom to top
 - For each x in $\{1, \dots, m\}$

$$S(x, y) \leftarrow e(x, y) + \min \begin{cases} S(x - 1, y - 1) \\ S(x, y - 1) \\ S(x + 1, y - 1) \end{cases}$$

Compute final answer

- Pick best among all end points on the top row
- $best_x \leftarrow 1$
- For x from 1 to m
 - If $S(x, n) < S(best_x, n)$
 - $best_x \leftarrow x$
- Return $S(best_x, n)$

Trace back the seam

- Initialize $S[x, 0] \leftarrow 0 \ \forall x$ // base cases
- Initialize $S[0, y] \leftarrow \infty, S[m + 1, y] \leftarrow \infty$ // sentinels
- For $y \leftarrow 1$ to n ,
 - For each x in $\{1, \dots, m\}$
 - $S(x, y) \leftarrow e(x, y) + \min \begin{cases} S(x - 1, y - 1) \\ S(x, y - 1) \\ S(x + 1, y - 1) \end{cases}$
 - *choice(x, y) $\leftarrow$ either $x - 1, x$, or $x + 1$ depending on which one is the minimum above*

Trace back the seam

- $x \leftarrow best_x$
- *for* $y \leftarrow n$ *downto* 1
 - Output point (x, y)
 - $x \leftarrow choice[x, y]$

Text justification

Packing words into lines

- Sequence of words $w_1, \dots, w_n$
- w_i is the width of i -th word
- Want to pack words into lines in the most aesthetically pleasing way

Rule 1: no text in margin

The quick brown fox jumps over the
lazy dog

Rule 2: avoid slack if possible

O, they have lived long on the alms-basket
of words. I marvel thy master hath not
eaten thee for a word; for thou art not so
long by the head as  *honorificabilitudinitatibus*: thou art easier Slack
swallowed than a flap-dragon.

Objective

- Partition words into lines so that
 - Total width of each line is at most page width W

$$(\#words\ on\ line\ i) - 1 + \sum_{j\ on\ line\ i} w_j \leq W$$

Spaces

- Slack on line i

$$W - (\#words\ on\ line\ i) + 1 - \sum_{j\ on\ line\ i} w_j$$

- Minimize sum of slacks cubed

Identify subproblems

- $\text{Best}(n)$: minimum badness for typesetting first n words