

# CSSE463: Image Recognition

## Day 6

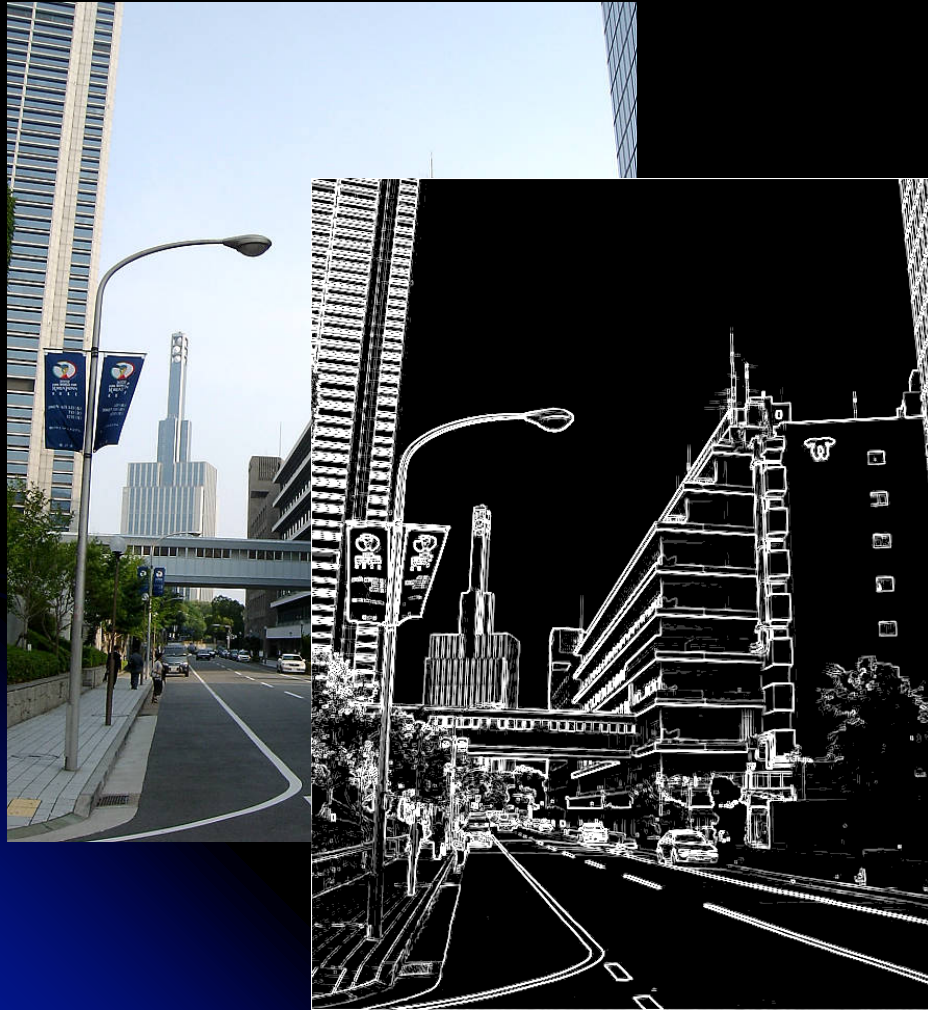
- Yesterday: Local, global, and point operators use different context, but **all**
  - operate on entire image,
  - changing one pixel at a time!!
- Lab due tomorrow
- Fruit-finder deadline **Friday**, 11:00pm
  - Please leave time for a solid write-up
  - Nice example of how to show results:
  - See rubric online for other standards
  - Questions?
- Today: edge features (another local operator)
  - Sonka 5.3



- There are 2 types of programmers in the world:
  1. Those who prefer 1-based indexing
  1. Those who prefer 0-based indexing

Thanks to 463 student John Krasich for clarifying this for us.

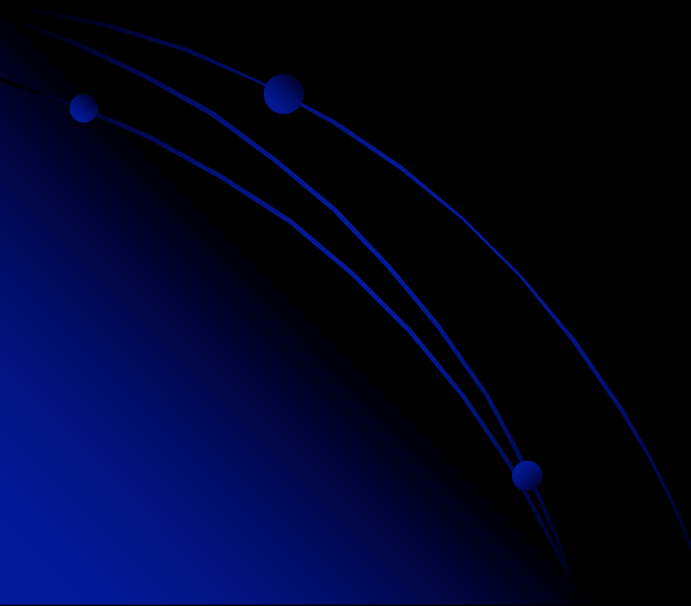
# Edge Features – Why?



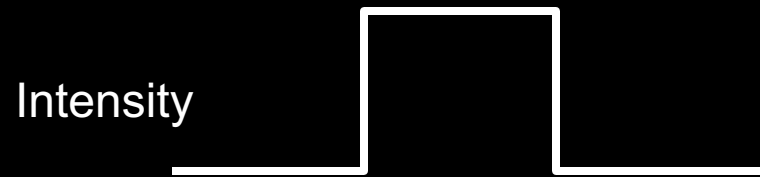
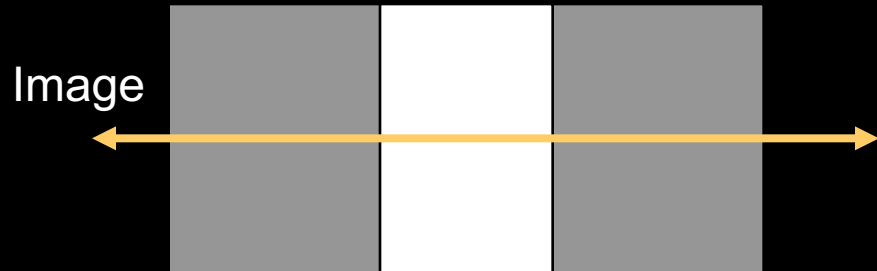
- “Edginess” (# edges) and their directions can give you info about the scene content
  - Orientation of the image
  - Natural vs. manmade images
- Edges can be used to segment the image.
  - Color information is usually used as well.
  - Specifically, boundaries occur where the chroma and/or luminance change (drastically).
- We could use to enhance the fruit-finder in a later assignment (*not* now).

# Outline for next 2 sessions

- Concept: How to find “edges” in 1D signal
- Edges in 2D images
- Limitations
- Edges vs edgels, Canny edge detector



# Intuition: Finding edges



- What's an edge?
- How to find changes in intensity?
- How to find first derivative?

# Finding derivatives (1D)

- Let  $y$  be intensity of point at location  $x$

- Def: 
$$\frac{\partial y}{\partial x} \approx \frac{\Delta y}{\Delta x}$$

- Fix  $\Delta x = 1$  pixel

- $dy/dx = y_2 - y_1$

$f$ : [ 0 0 0 0 0 50 50 50 50 0 0 0 0 0 ] ;

$f'$ : [ 0 0 0 0 0 50 0 0 0 -50 0 0 0 0 ] ;

- Correlate image with filter  $[-1, 1]$  to find positions of change.
  - Edges “between” pixels.
  - What is significance of magnitude of first deriv. ?

# Applying Filters

- *Example for differential with  $\Delta x = 2$  pixels:  
(Better; no output “between” pixels)*

Image	5	8	9	1	2	2	1	2	1	3	1	3
Mask	$-\frac{1}{2}$	$-\frac{1}{2}$	$0\frac{1}{2}$	$\frac{1}{2}$	$\frac{1}{2}$							
Output		2	-3.5	-3.5	...							

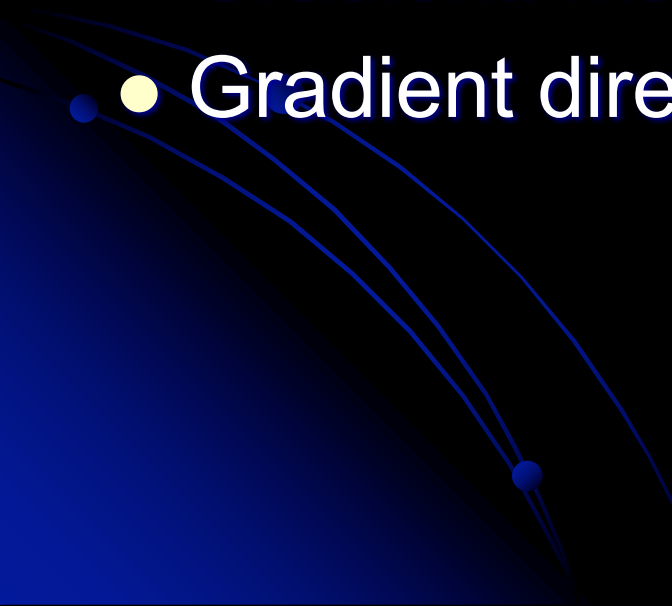
- Could you do
  - *Ramps? Impulse? Step edges? (on quiz)*
- *Properties*
  - *If no contrast?*

# Why should the values in an edge filter sum to 0?

- What if they didn't?
- Consider running it on a homogeneous region: 40, 40, 40, 40, 40, 40

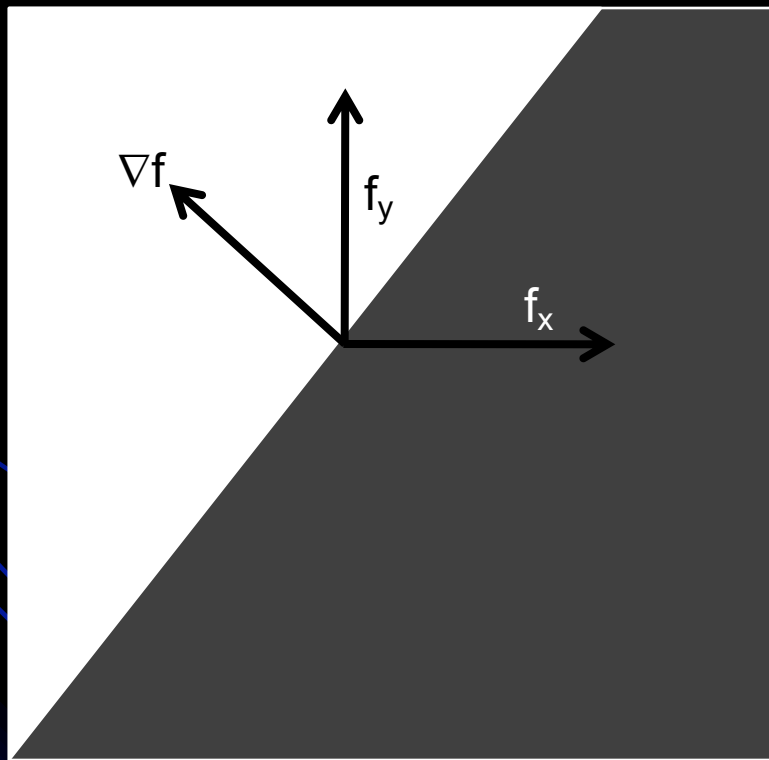


# 2D Edges

- Local operators
    - Prewitt operators
    - Sobel masks
    - Roberts 2x2 cross-operators
  - Gradient: magnitude
  - Gradient direction
- 

# Edge gradient

Vector pointing in direction of greatest positive change.  
We want its magnitude and direction



# 1. Find partials using filters

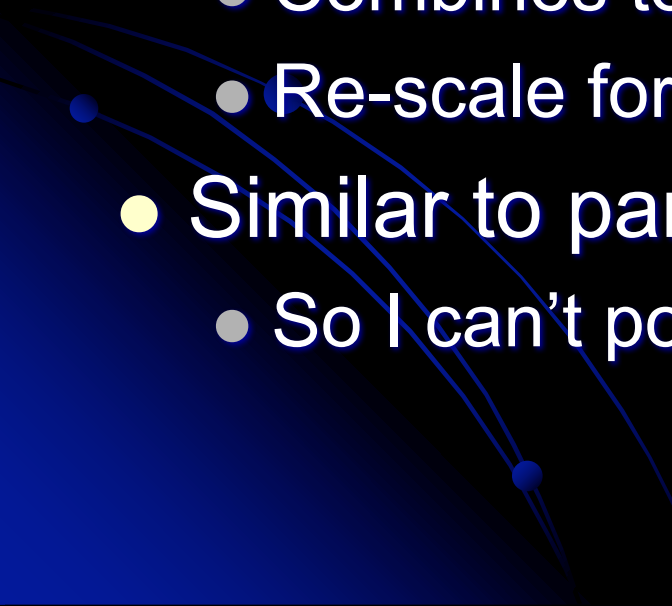
To find  $\frac{\partial f}{\partial x}$ , use Prewitt:  $\frac{1}{6} \begin{bmatrix} -1 & 0 & 1 \\ -1 & 0 & 1 \\ -1 & 0 & 1 \end{bmatrix}$  or Sobel:  $\frac{1}{8} \begin{bmatrix} -1 & 0 & 1 \\ -2 & 0 & 2 \\ -1 & 0 & 1 \end{bmatrix}$  filter

To find  $\frac{\partial f}{\partial y}$ , use Prewitt:  $\frac{1}{6} \begin{bmatrix} 1 & 1 & 1 \\ 0 & 0 & 0 \\ -1 & -1 & -1 \end{bmatrix}$  or Sobel:  $\frac{1}{8} \begin{bmatrix} 1 & 2 & 1 \\ 0 & 0 & 0 \\ -1 & -2 & -1 \end{bmatrix}$  filter

Note that this is 1D filter, but averaged over 3 rows (for  $df/dx$ ) or 3 cols (for  $df/dy$ ) and with  $1/6$  factored out to allow integer multiplication

Roberts 2x2 cross operators  $\begin{bmatrix} 0 & 1 \\ -1 & 0 \end{bmatrix}$ ,  $\begin{bmatrix} 1 & 0 \\ 0 & -1 \end{bmatrix}$  are more sensitive to noise

# Demo

- My homemade edgefinder
    - Finds vertical and horizontal edges using filters
    - Combines to find edge magnitude
    - Combines to find edge direction
    - Re-scale for display
  - Similar to part of Lab 3.
    - So I can't post code
- 

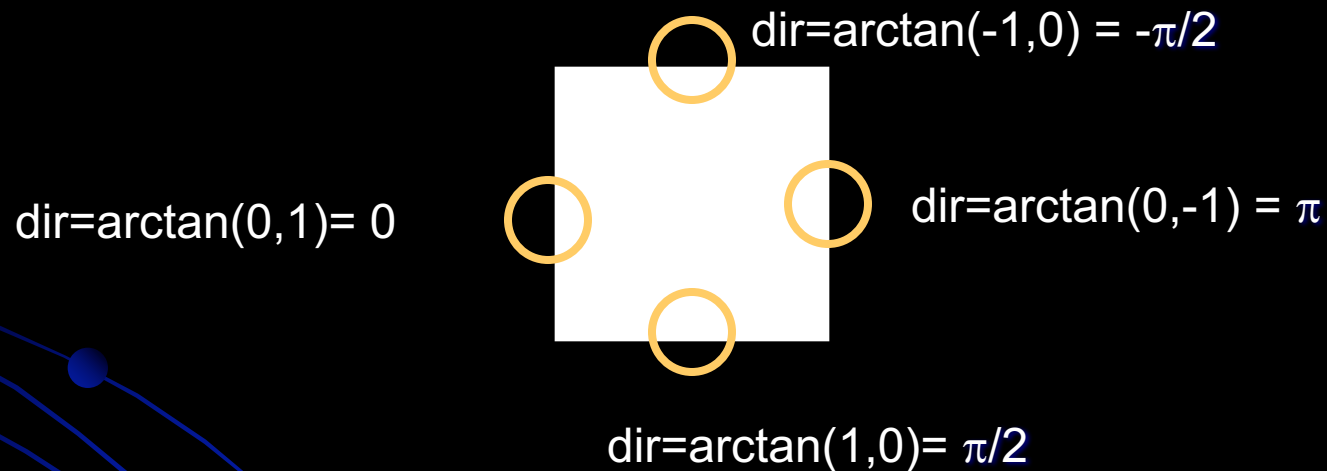
## 2. Find edge gradient magnitude

- Definition: the gradient,  $\nabla f$ , is the vector pointing in the direction of greatest change.
- To find its magnitude:

$$|\nabla f| = \sqrt{\left(\frac{\delta f}{\delta x}\right)^2 + \left(\frac{\delta f}{\delta y}\right)^2}$$

# 3. Find edge gradient direction

- $\tan^{-1}(y,x)$
- Matlab's  $\text{atan2}(y,x)$  gives full range,  $[-\pi, \pi]$



- Direction is thus the angle formed by the x-axis and the line “pointing towards” light region.

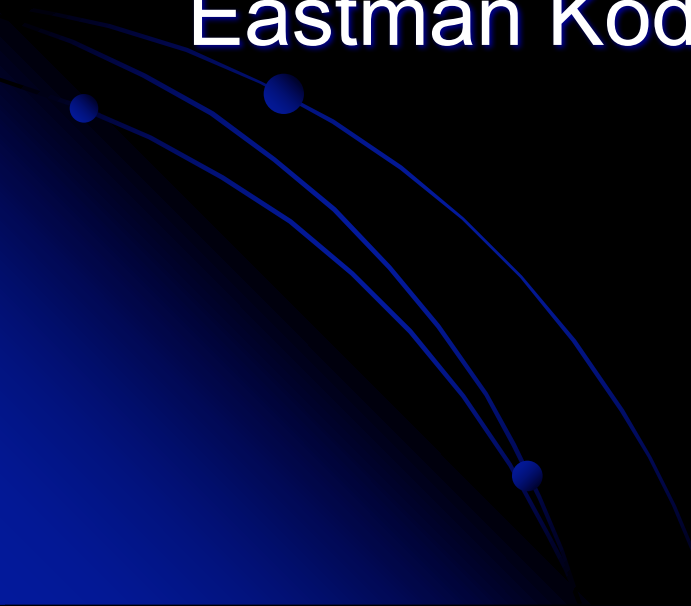
# Review: filters to reduce noise

$$\begin{bmatrix} 1/9 & 1/9 & 1/9 \\ 1/9 & 1/9 & 1/9 \\ 1/9 & 1/9 & 1/9 \end{bmatrix}$$

- From last slide from Day 5 class
- To get the output at a single point, take cross-correlation (basically a dot-product) of filter and image at that point
- To filter the whole image, shift the filter over each pixel in the original image
- This is a 3x3 version of which filter?

# Color edges

- Rarely used historically
- Intuition: edges occur between regions of different hue but same intensity.
- One technique patented by David Cok, Eastman Kodak Co.





# Limitations of edge-finders

- Natural variation
  - Shadows and highlights can obscure edges
- Internal vs. external edges
  - We might want the outline of an article of clothing, but the stripes in our shirt are edges too.
- Noise!
  - Signal-to-noise ratio important in determining how hard it is to find edges.

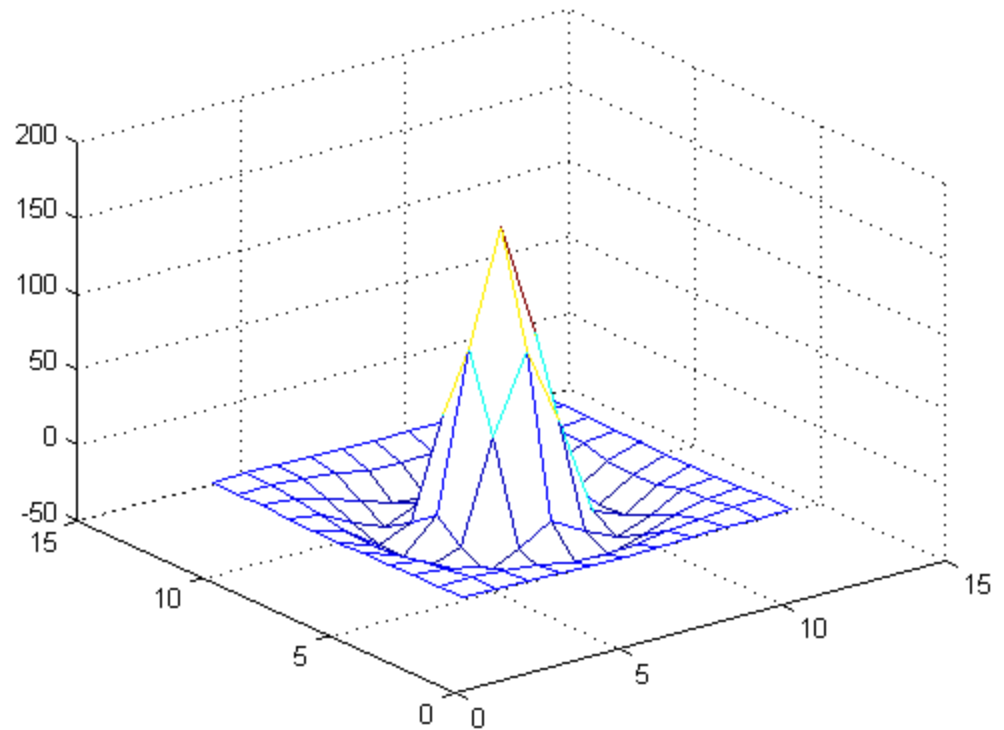
# Dealing with noise by smoothing

0	-1	0
-1	4	-1
0	-1	0

3x3

- Our goal is to combine smoothing and edgel detection.

0	0	0	-1	-1	-2	-1	-1
0	0	-2	-4	-8	-9	-8	-4
0	-2	-7	-15	-22	-23	-22	-15
-1	-4	-15	-24	-14	-1	-14	-24
-1	-8	-22	-14	52	103	52	-14
-2	-9	-23	-1	103	178	103	-1
-1	-8	-22	-14	52	103	52	-14
-1	-4	-15	-24	-14	-1	-14	-24
0	-2	-7	-15	-22	-23	-22	-15
0	0	-2	-4	-8	-9	-8	-4
0	0	0	-1	-1	-2	-1	-1



11x11

# Edgels vs. Edges



- *Edgels* are unconnected groups of pixels detected by a mask
- *Edges* are longer segments found by grouping edgels
  - Intuitively, we think of edges
- Different data structure
- How might you process a “raw” edge image?

# From mask output to edgels: ideas

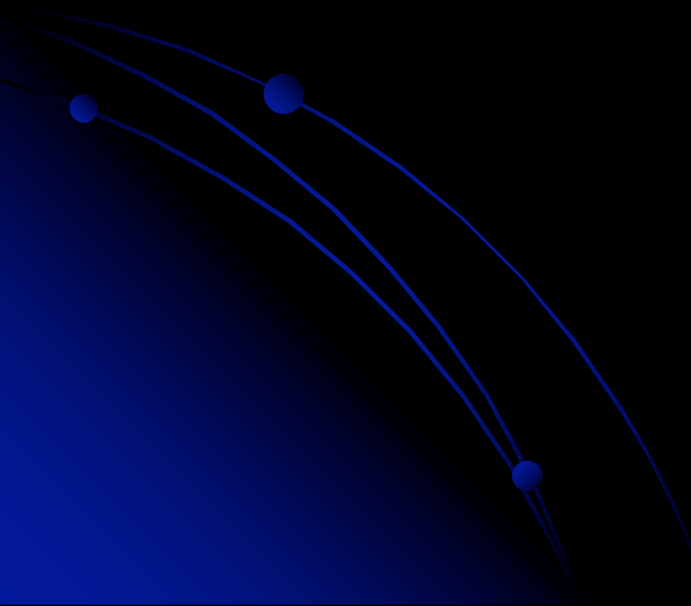
- Threshold away “weak” output
  - What threshold to use?
  - Always fixed or should it vary?
- “Thin” edges by nonmaximum suppression.
  - Idea: If an edge is 5 pixels wide, we can replace it with only the innermost segment.
  - Remove the edge response of a pixel not greater than its 2 neighbors in the direction of the gradient.

# Canny edge detection

- First smoothes the intensity image
  - Parameter  $\sigma$  controls how many edges found
- Non-maximal suppression
- Uses **two thresholds**:
  - High: to initiate contour following
  - Low: to follow along a contour
  - Result: segments from noise are less likely to be found (unless the noise is too strong)
- Aggregates neighboring edgels into curves (“edges”)

# Canny edge detection

- You'll get to play with various edgefinders in Lab 3 using Matlab's built-in *edgedemo*



- Some neat image rec/computer vision demos using the kinect:

- [http://www.youtube.com/watch?v=7QrnwoO1-8A&feature=mfu\\_in\\_order&list=UL](http://www.youtube.com/watch?v=7QrnwoO1-8A&feature=mfu_in_order&list=UL)
- <http://www.engadget.com/2010/12/09/kinect-finally-fulfills-its-minority-report-destiny-video/>

