

# Analysis of Motion

## Computing the velocity field

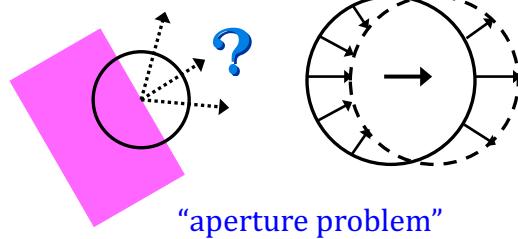


**CS332 Visual Processing**  
Department of Computer Science  
Wellesley College

## Measuring image motion

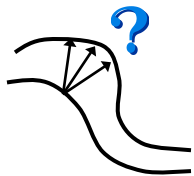


velocity field



“aperture problem”

“local” motion detectors only measure *component of motion* perpendicular to moving edge

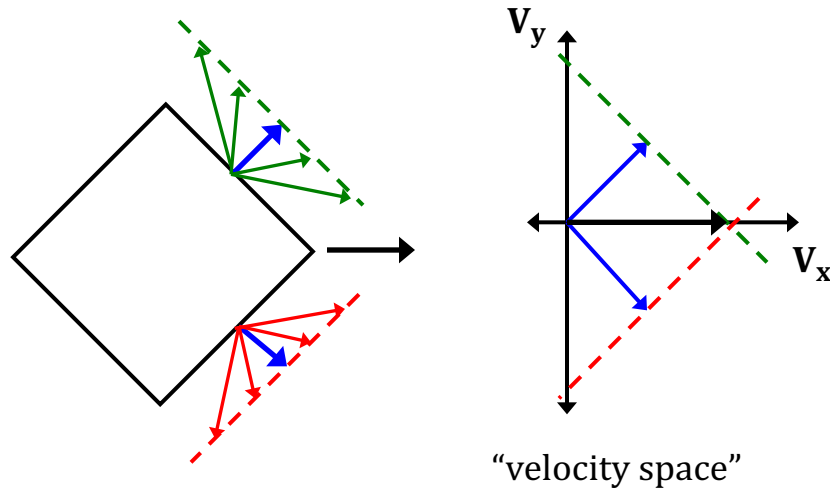


2D velocity field not determined *uniquely* from the changing image

need *additional constraint* to compute a unique velocity field

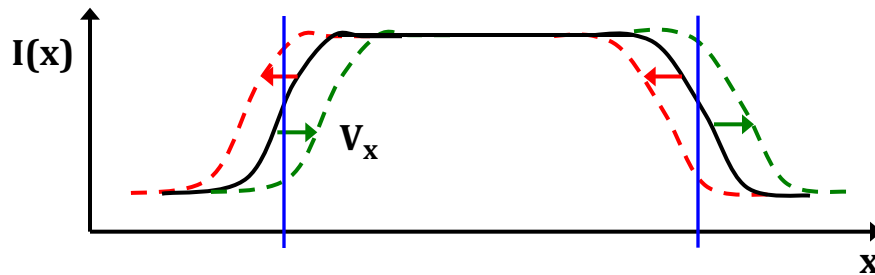
1-2

## Option 1: Assume *pure translation*



1-3

## Measuring motion in one dimension



$V_x$  = velocity in x direction

• rightward movement:  $V_x > 0$

• leftward movement:  $V_x < 0$

• speed:  $|V_x|$

• pixels/time step

$$V_x = - \frac{\partial I / \partial t}{\partial I / \partial x}$$

	$\partial I / \partial x$	
	+	-
+	← (red)	→ (green)
-	→ (green)	← (red)

1-4

## Measuring motion components in 2-D

(1) *gradient* of image intensity

$$\nabla I = (\partial I / \partial x, \partial I / \partial y)$$

(2) time derivative

$$\partial I / \partial t$$

(3) velocity along gradient:

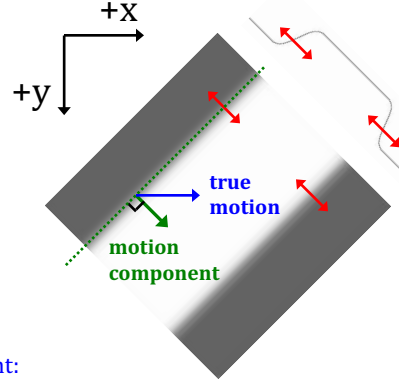
$$v^\perp$$

• movement in direction of gradient:

$$v^\perp > 0$$

• movement opposite direction of gradient:

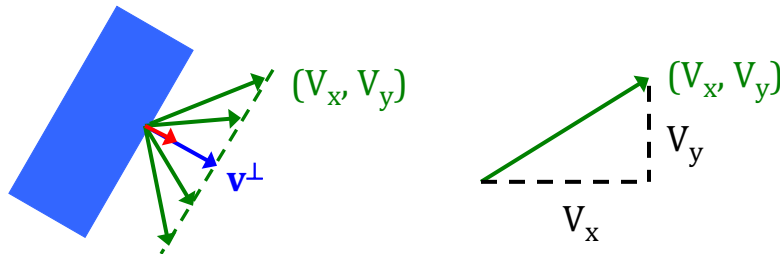
$$v^\perp < 0$$



$$v^\perp = - \frac{\partial I / \partial t}{|\nabla I|} = - \frac{\partial I / \partial t}{[(\partial I / \partial x)^2 + (\partial I / \partial y)^2]^{1/2}}$$

1-5

## 2-D velocities $(V_x, V_y)$ consistent with $v^\perp$



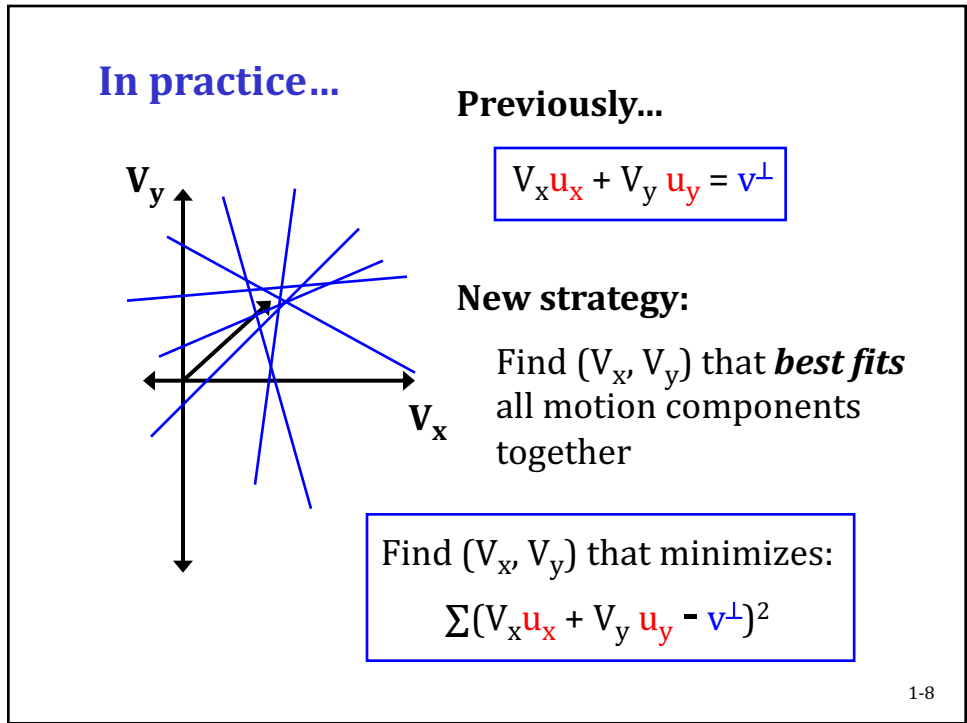
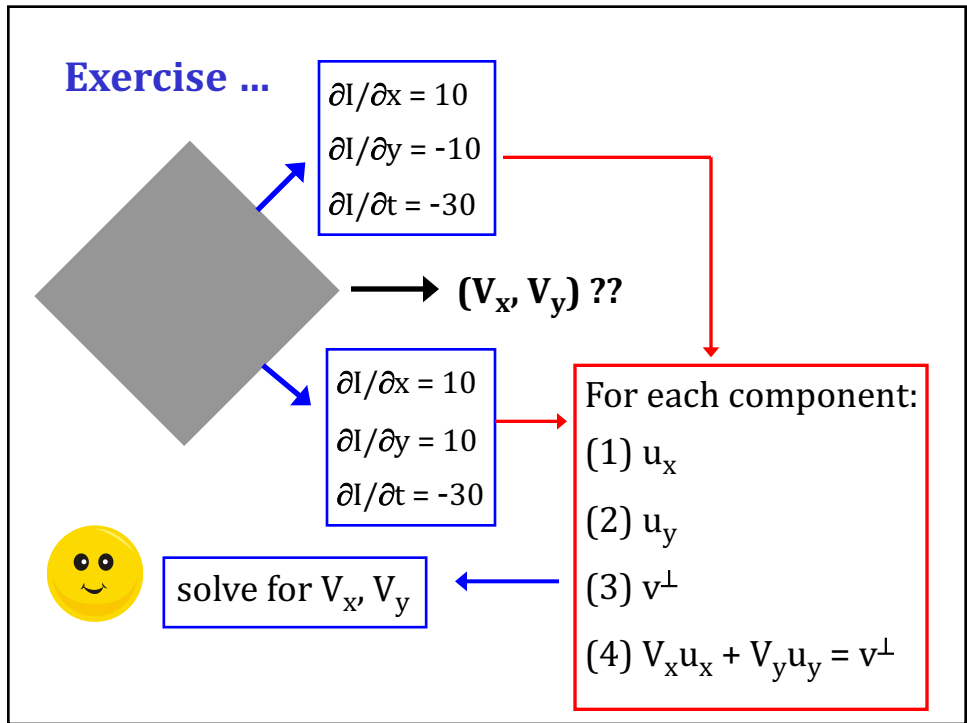
All  $(V_x, V_y)$  such that the component of  $(V_x, V_y)$  in the direction of the gradient is  $v^\perp$

$(u_x, u_y)$ : unit vector in direction of gradient

Use the dot product:  $(V_x, V_y) \cdot (u_x, u_y) = v^\perp$

$$V_x u_x + V_y u_y = v^\perp$$

1-6

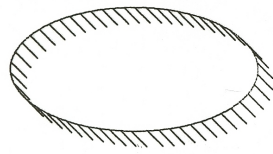


## Option 2: *Smoothness* assumption:

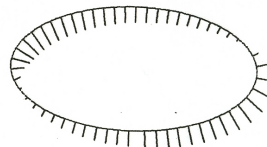
Compute a velocity field that:

- (1) is consistent with local measurements of image motion (perpendicular components)
- (2) has the *least amount of variation* possible

Pure Translation:



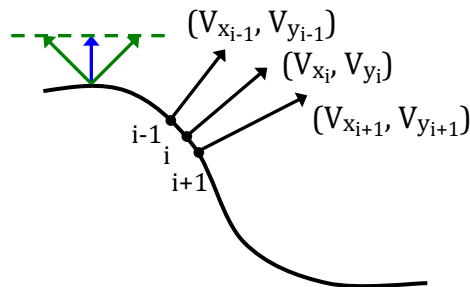
true & smoothest velocity field



initial motion measurements

1-9

## Computing the smoothest velocity field



motion components:

$$V_{x_i} u_{x_i} + V_{y_i} u_{y_i} = v_i^\perp$$

change in velocity:

$$(V_{x_{i+1}} - V_{x_i}, V_{y_{i+1}} - V_{y_i})$$

Find  $(V_{x_i}, V_{y_i})$  that minimize:

$$\sum (V_{x_i} u_{x_i} + V_{y_i} u_{y_i} - v_i^\perp)^2 + \lambda [(V_{x_{i+1}} - V_{x_i})^2 + (V_{y_{i+1}} - V_{y_i})^2]$$

deviation from image motion measurements + variation in velocity field

1-10