Hough Transform

## Reading

- Watt, 10.3-10.4

An edge is not a line...


How can we detect lines?

Finding lines in an image
Option 1:

- Search for the line at every possible position/orientation
- What is the cost of this operation?

Option 2:

- Use a voting scheme: Hough transform

Finding lines in an image


Connection between image ( $x, y$ ) and Hough ( $m, b$ ) spaces

- A line in the image corresponds to a point in Hough space
- To go from image space to Hough space:
- given a set of points ( $x, y$ ), find all ( $m, b$ ) such that $y=m x+b$


## Finding lines in an image



Connection between image ( $x, y$ ) and Hough ( $m, b$ ) spaces

- A line in the image corresponds to a point in Hough space
- To go from image space to Hough space:
- given a set of points ( $x, y$ ), find all ( $m, b$ ) such that $y=m x+b$
- What does a point $\left(x_{0}, y_{0}\right)$ in the image space map to?
- A: the solutions of $b=-x_{0} m+y_{0}$
- this is a line in Hough space


## Hough transform algorithm

Typically use a different parameterization

$$
d=x \cos \theta+y \sin \theta
$$

- $d$ is the perpendicular distance from the line to the origin
- $\theta$ is the angle this perpendicular makes with the $x$ axis
- Why?


## Hough transform algorithm

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- Why?

Basic Hough transform algorithm

1. Initialize $\mathrm{H}[\mathrm{d}, \theta]=0$
2. for each edge point $I[x, y]$ in the image for $\theta=0$ to 180

$$
d=x \cos \theta+y \sin \theta
$$

$$
\mathrm{H}[\mathrm{~d}, \theta]+=1
$$

3. Find the value(s) of ( $d, \theta$ ) where $H[d, \theta]$ is maximum
4. The detected line in the image is given by $d=x \cos \theta+y \sin \theta$

What's the running time (measured in \# votes)?

## Extensions

Extension 1: Use the image gradient

1. same
2. for each edge point $\mathrm{I}[x, y]$ in the image
compute unique ( $\mathrm{d}, \theta$ ) based on image gradient at ( $\mathrm{x}, \mathrm{y}$ ) $H[d, \theta]+=1$
3. same
4. same

What's the running time measured in votes?

## Extensions

Extension 1: Use the image gradient

1. same
2. for each edge point $1[x, y]$ in the image
compute unique ( $\mathrm{d}, \theta$ ) based on image gradient at ( $\mathrm{x}, \mathrm{y}$ ) $H[d, \theta]+=1$
3. same
4. same

What's the running time measured in votes?

Extension 2

- give more votes for stronger edges

Extension 3

- change the sampling of $(\mathrm{d}, \theta)$ to give more/less resolution

Extension 4

- The same procedure can be used with circles, squares, or any other shape

