# The Distance Transform 

ROB 102: Introduction to AI \& Programming 2021/10/13

## Today

1. Summary

- What is a distance transform?

2. Group activity

- Manhattan \& Euclidean distance transform by hand

3. C++ activity

- 1D distance transform
- 2D Manhattan distance transform


## Summary: Distance Transform

## What is a distance transform?



A binary image or map, where each value is either 0 or 1.

## Summary: Distance Transform

## What is a distance transform?



A binary image or map, where each value is either 0 or 1.


The distance transform gives the distance to the nearest occupied cell at each cell.

## Distance Transform Applications



Obstacle avoidance for robot navigation (link)

## Distance Transform Applications



Obstacle avoidance for robot navigation (link)


## Distance Transform Applications



Obstacle avoidance for robot navigation (link)


Image segmentation (link)


## Distance Transform Applications



Obstacle avoidance for robot navigation (link)


Image segmentation (link)


Deep Learning for medical imaging (link)

ROB 102: The distance transform can help us build the repulsion potential to perform autonomous navigation.

## Distance Functions

In lecture, we saw two distance functions.

## Euclidean:

dist $=\sqrt{(\text { goal_i }-\mathrm{i})^{2}+(\text { goal_ } \mathrm{j}-\mathrm{j})^{2}}$

## Manhattan:

$$
\text { dist }=\mid \text { goal_i }-i|+| \text { goal_ } j-j \mid
$$



The name "Manhattan distance" comes from the grid layout of city blocks in Manhattan. The shortest path from one location to another requires walking along the grid.

## Distance Functions

In lecture, we saw two distance functions.

## Euclidean:

$$
\begin{aligned}
\text { dist } & =\sqrt{(3-0)^{2}+(3-1)^{2}} \\
& =\sqrt{(3)^{2}+(2)^{2}}=\sqrt{13}
\end{aligned}
$$

## Manhattan:

$$
\begin{aligned}
\text { dist } & =|3-0|+|3-1| \\
& =|3|+|2|=5
\end{aligned}
$$

|  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- |
|  |  |  | $(3,3)$ |  |
|  |  |  | $\mathbf{X}$ |  |
|  |  |  |  |  |
|  |  |  |  |  |
| $(0,1)$ |  |  |  |  |
|  |  |  |  |  |

## Class Activity: 1D Distance Transform

What is the distance transform of this 1D map?


These cells are occupied, so their distance to the nearest occupied cell is zero

## Class Activity: 1D Distance Transform

What is the distance transform of this 1D map?


## Class Activity: 1D Distance Transform

What is the distance transform of this 1D map?

| 0 | 1 | 0 | 1 | 0 | 0 | 0 | 1 | 0 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |



## Class Activity: 1D Distance Transform

What is the distance transform of this 1D map?

| 0 | 1 | 0 | 1 | 0 | 0 | 0 | 1 | 0 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |



## Class Activity: 1D Distance Transform

What is the distance transform of this 1D map?

| 0 | 1 | 0 | 1 | 0 | 0 | 0 | 1 | 0 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |



## Group Activity: 2D Distance Transform

Find the Euclidean and Manhattan distance transform for this binary map:

| 0 | 0 | 0 | 0 | 0 |
| :--- | :--- | :--- | :--- | :--- |
| 0 | 1 | 1 | 0 | 0 |
| 0 | 1 | 0 | 0 | 0 |
| 0 | 0 | 0 | 1 | 0 |
| 0 | 0 | 0 | 0 | 0 |

## Group Activity: 2D Distance Transform

Find the Euclidean and Manhattan distance transform for this binary map:

| 0 | 0 | 0 | 0 | 0 |
| :--- | :--- | :--- | :--- | :--- |
| 0 | 1 | 1 | 0 | 0 |
| 0 | 1 | 0 | 0 | 0 |
| 0 | 0 | 0 | 1 | 0 |
| 0 | 0 | 0 | 0 | 0 |


| $\sqrt{2}$ | 1 | 1 | $\sqrt{2}$ | $\sqrt{5}$ |
| :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | 1 | 2 |
| 1 | 0 | 1 | 1 | $\sqrt{2}$ |
| $\sqrt{2}$ | 1 | 1 | 0 | 1 |
| $\sqrt{5}$ | 2 | $\sqrt{2}$ | 1 | $\sqrt{2}$ |

Euclidean Distance Transform

## Group Activity: 2D Distance Transform

Find the Euclidean and Manhattan distance transform for this binary map:

| 0 | 0 | 0 | 0 | 0 |
| :--- | :--- | :--- | :--- | :--- |
| 0 | 1 | 1 | 0 | 0 |
| 0 | 1 | 0 | 0 | 0 |
| 0 | 0 | 0 | 1 | 0 |
| 0 | 0 | 0 | 0 | 0 |


| $\sqrt{2}$ | 1 | 1 | $\sqrt{2}$ | $\sqrt{5}$ |
| :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | 1 | 2 |
| 1 | 0 | 1 | 1 | $\sqrt{2}$ |
| $\sqrt{2}$ | 1 | 1 | 0 | 1 |
| $\sqrt{5}$ | 2 | $\sqrt{2}$ | 1 | $\sqrt{2}$ |
| Euclidean Distance Transform |  |  |  |  |


| $\mathbf{2}$ | $\mathbf{1}$ | $\mathbf{1}$ | $\mathbf{2}$ | $\mathbf{3}$ |
| :--- | :--- | :--- | :--- | :--- |
| $\mathbf{1}$ | $\mathbf{0}$ | $\mathbf{0}$ | $\mathbf{1}$ | $\mathbf{2}$ |
| $\mathbf{1}$ | $\mathbf{0}$ | $\mathbf{1}$ | $\mathbf{1}$ | $\mathbf{2}$ |
| $\mathbf{2}$ | $\mathbf{1}$ | $\mathbf{1}$ | $\mathbf{0}$ | $\mathbf{1}$ |
| $\mathbf{3}$ | $\mathbf{2}$ | $\mathbf{2}$ | $\mathbf{1}$ | $\mathbf{2}$ | Manhattan Distance Transform

## Coding Activity: Manhattan Distance Transform in C++

1. Get the template code from the course website

- Find it under the in-class activities section for today's class
- You can compile and run the code on your computer or on repl.it

2. Complete the 1D distance transform function
3. Complete the 2D Manhattan distance transform function

- Depending on your implementation, you might need the cellToIdx ( ) or idxToCell() functions

4. Try different binary maps to test your functions
