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# Two-Pass Connected Component Labeling (CCL) for Binary Image

Azriel Rosenfeld and John L. Pfaltz

*Journal of ACM, 1966*

Speaker: Shih-Shinh Huang

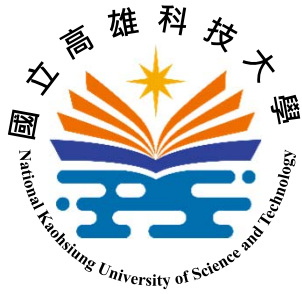
February 28, 2021

A. Rosenfeld and J. L. Pfaltz, "Sequential Operations in Digital Picture Processing",  
*Journal of the ACM* vol. 13, pp. 471—494, Oct. 1966.



# Outline

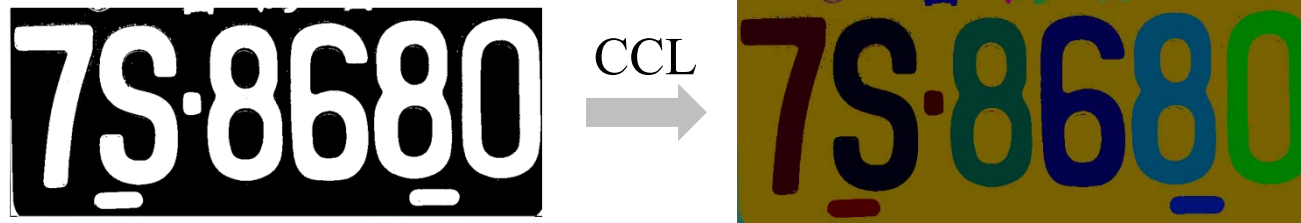
- Introduction
  - About CCL
  - Connectivity
  - Connected Component
- Two-Pass Labeling
  - Approach Overview
  - First Pass
  - Second Pass



# Introduction

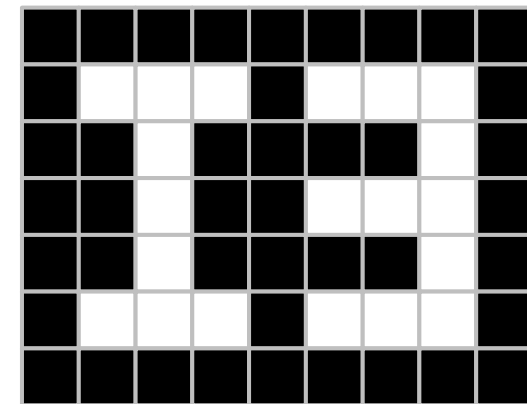
- About CCL
  - CCL is a fundamental operation in many image analysis applications.
    - group the connected points into a region
    - transform the unit to be processed from point to region

license plate recognition

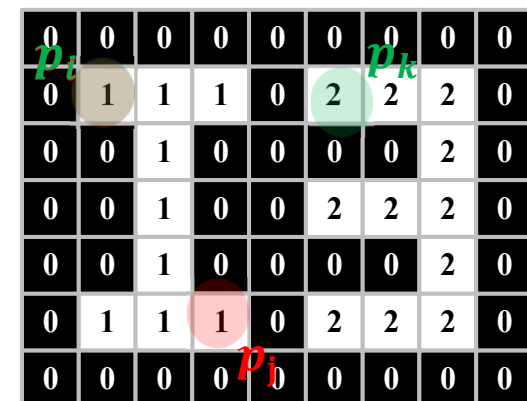


# Introduction

- About CCL
  - The input to CCL is a **binary** image
    - 0: background points
    - 255: object points
  - The output of CCL is a **label** image
    - The label denotes the region identifier (0 stands for background region)
    - All connected points are with the same label.

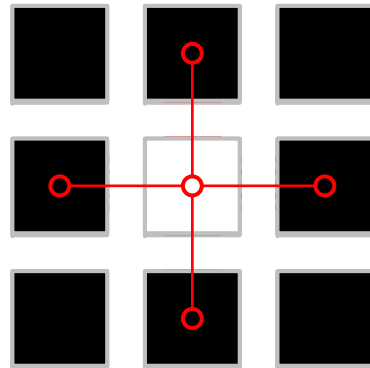


↓ CCL

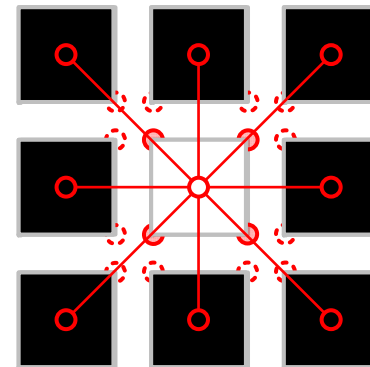


# Introduction

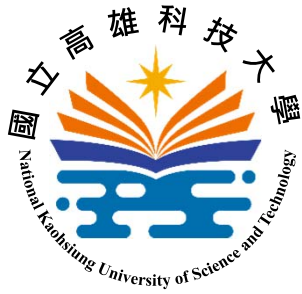
- Connectivity
  - **Adjacency**:  $p_i$  and  $p_j$  are adjacent (neighbor) if their point squares share a common part
    - edge: 4-connectivity ( $N_4$ )
    - vertex: 8-connectivity ( $N_8$ )



4-connectivity ( $N_4$ )



8-connectivity ( $N_8$ )



# Introduction

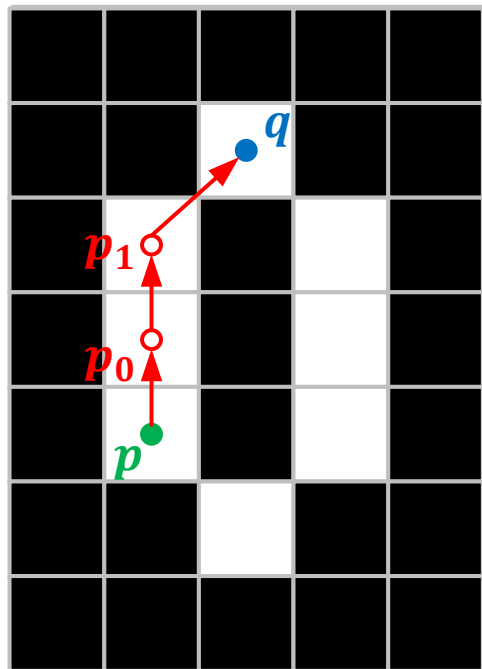
- Connectivity
  - **Definition:** two object points  $p$  and  $q$  are called connected if there exist a path from  $p$  to  $q$

$$p \rightarrow p_0 \rightarrow p_1 \rightarrow p_2 \rightarrow \cdots \rightarrow p_n \rightarrow q$$

- $p_0, p_1, \dots, p_n$  are all object points
- $p_i \rightarrow p_j$  denotes  $p_i$  and  $p_j$  are adjacent

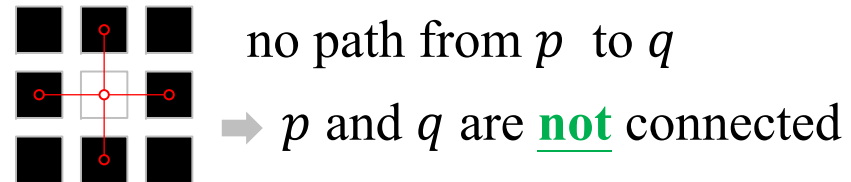
# Introduction

- Connectivity

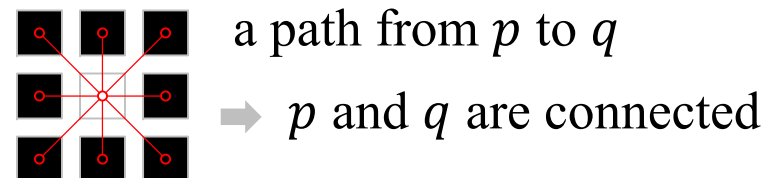


are the object points  $p$  and  $q$   
**connected** ?

## 4-connectivity ( $N_4$ )



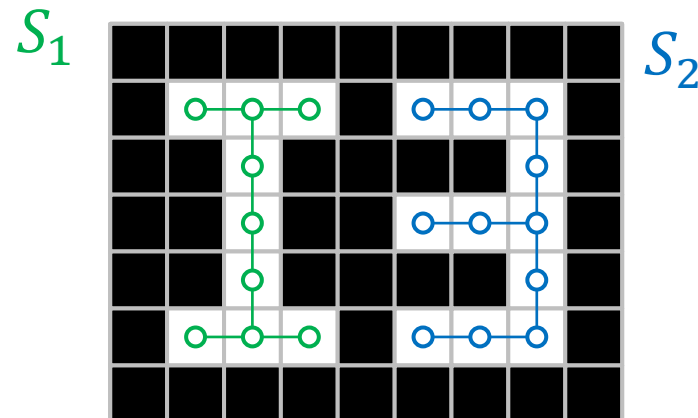
## 8-connectivity ( $N_8$ )





# Introduction

- Connected Component
  - **Definition:** a **maximum** set  $S$  of object points that are **connected** of each other.
    - $p$  and  $q$  are connected, and  $p \in S, \Rightarrow q \in S$
    - $p \in S$  and  $q \in S \Rightarrow p$  and  $q$  are connected

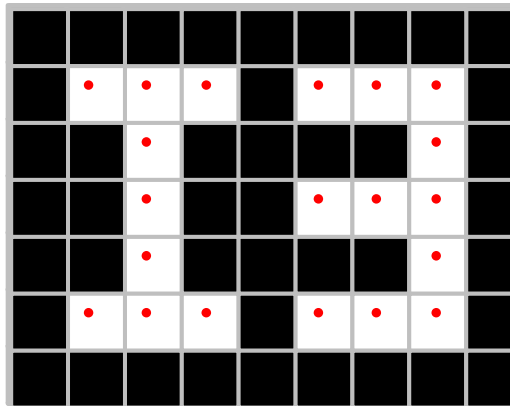






# Two-Pass Labeling

- Approach Overview
  - scan the image for **two** times
    - go from left to right and top to bottom
    - only deal with the object points but skip the background points.



# Two-Pass Labeling

- Approach Overview
  - **First Pass:** assign temporary labels and record equivalence relations
  - **Second Pass:** resolve label equivalence and replace temporary labels.

	1	1	1		2	2	2
		1					2
		1			2	2	2
		1					2
	1	1	1		2	2	2

2~3

1~4

2~5

→  
resolve

2~3~5

1~4

## TwoPassCCL(*image*)

initialize *label\_map* with the value 0

**// first pass**

for *row*=0 to *image.rows* - 1

for *col*=0 to *image.cols* - 1

if *image*[*row*, *col*] is not background

- assign temporary labels
- record equivalence relations

**//second two**

- resolve label equivalence

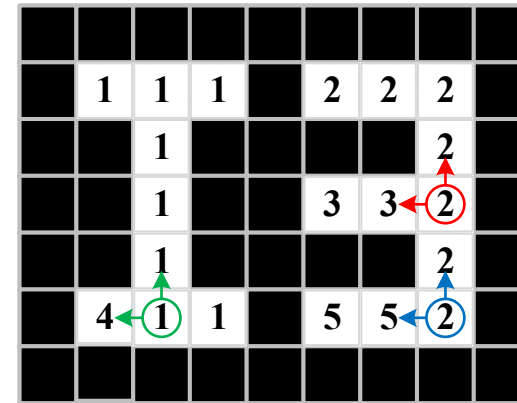
for *row*=0 to *image.rows* - 1

for *col*=0 to *image.cols* - 1

if *image*[*row*, *col*] is not background

- replace temporary labels

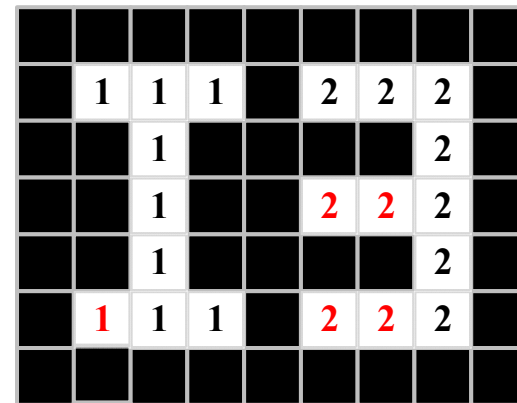
return *label\_map*



2~3

1~4

2~5

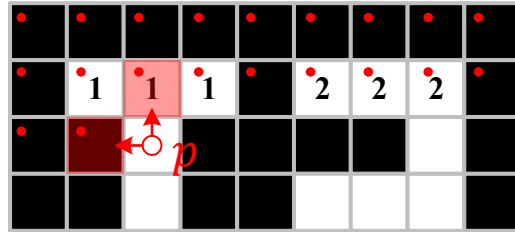


3 2 5 3~5

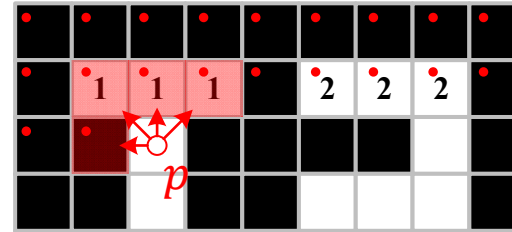
4 1~4

# Two-Pass Labeling

- First Pass: assign temporary labels
  - Step 1: collect the labels in adjacent points of the object point  $p$  as  $N(p)$



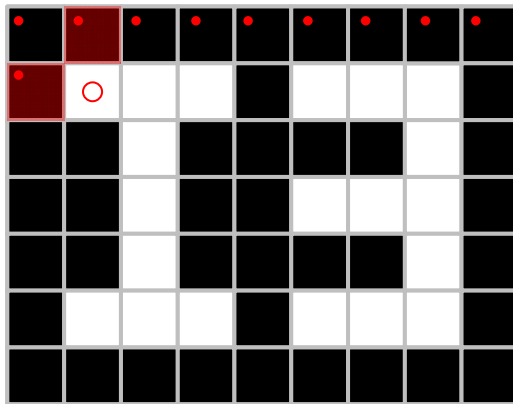
4-connectivity ( $N_4$ )



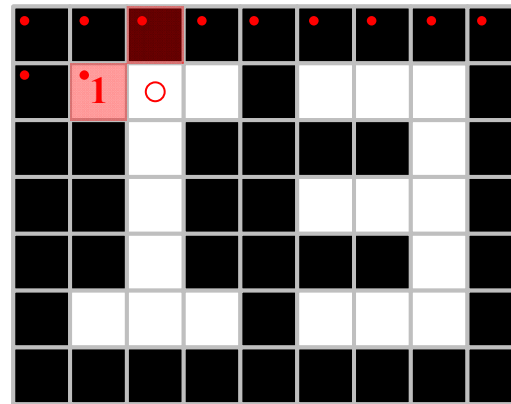
8-connectivity ( $N_8$ )

- Step 2: assign a temporal label to  $p$ 
  - $N(p) = \emptyset$ : assign  $p$  a new label
  - $N(p) \neq \emptyset$ : assign  $p$  a minimum in  $N(p)$

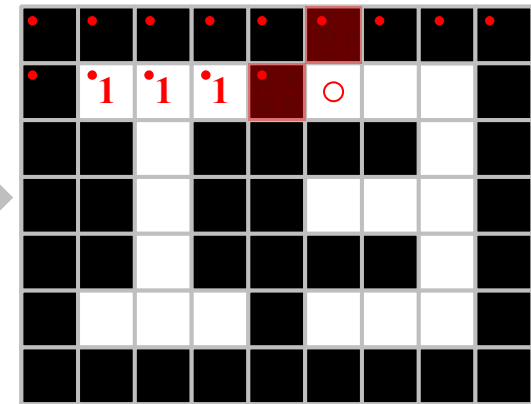
# Two-Pass Labeling



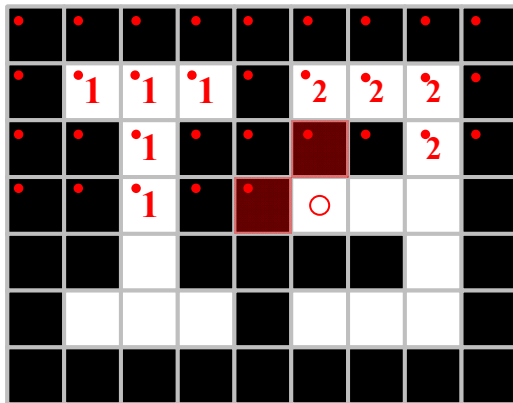
$$N(p) = \emptyset$$



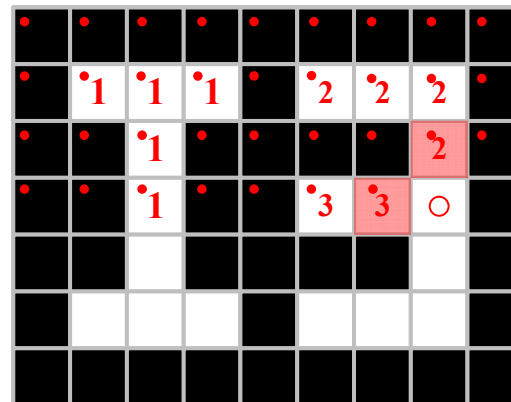
$$N(p) = \{1\}$$



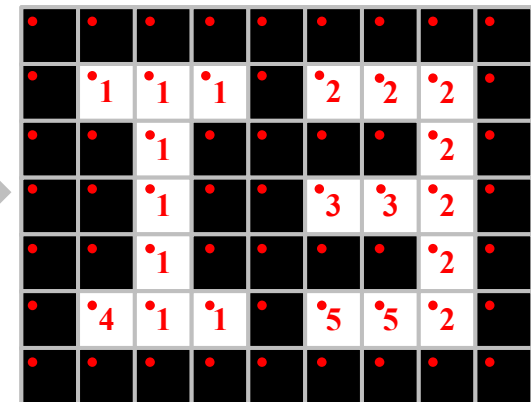
$$N(p) = \emptyset$$

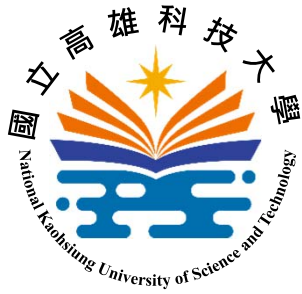


$$N(p) = \emptyset$$



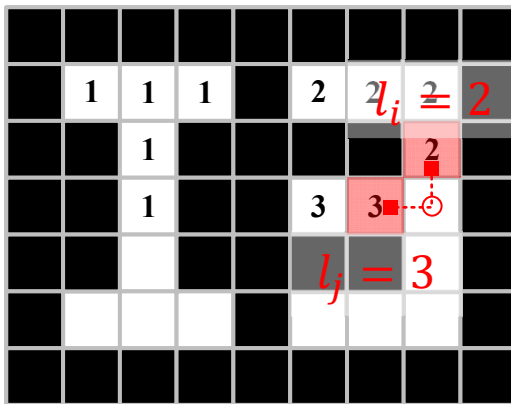
$$N(p) = \{2,3\}$$



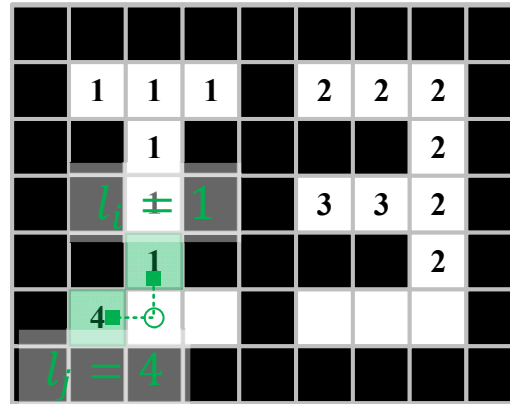


# Two-Pass Labeling

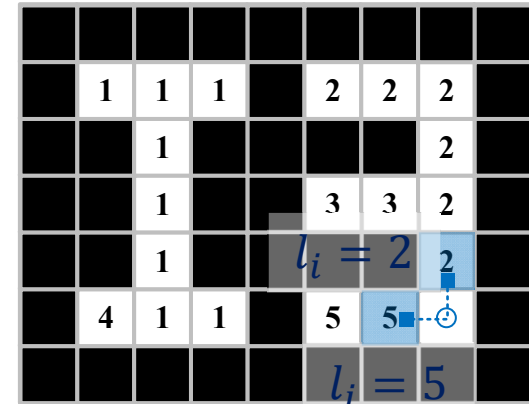
- First Pass: record equivalence relations
  - **Condition:** more than one label in  $N(p)$ 
    - current point  $p$  connects different labels in  $N(p)$
    - add equivalence relation  $l_i \sim l_j$  for  $l_i, l_j \in N(p)$



$N(p) = \{2,3\}$     **2~3**



$N(p) = \{1,4\}$     **1~4**



$N(p) = \{2,5\}$     **2~5**



# Two-Pass Labeling

- Second Pass: resolve label equivalence
  - Step 1: create single-integer-item sets
  - Step 2: process every equivalence pair  $l_i \sim l_j$  to form equivalence classes

	1	1	1		2	2	2
		1					2
		1			3	3	2
		1					2
	4	1	1		5	5	2

$\{2 \sim 3, 1 \sim 4, 2 \sim 5\}$

$\{1\}, \{2\}, \{3\}, \{4\}, \{5\}$

$2 \sim 3 \rightarrow \{1\}, \{2,3\}, \{4\}, \{5\}$

$1 \sim 4 \rightarrow \{1,4\}, \{2,3\}, \{5\}$

$2 \sim 5 \rightarrow \{1,4\}, \{2,3,5\}$



# Two-Pass Labeling

- Second Pass: replace temporary labels
  - replace the label at  $p$  by the **minimum** of the set containing the label of  $p$

{1,4}, {2,3,5}

{1,4} → 1

{2,3,5} → 2

	1	1	1		2	2	2
		1					2
		1			2	2	2
		1					2
	1	1	1		2	2	2



## TwoPassCCL(*image*)

initialize *label\_map* with the value 0

**// first pass**

for *row*=0 to *image.rows* - 1

for *col*=0 to *image.cols* - 1

if *image*[*row*, *col*] is not background

● assign temporary labels

● record equivalence relations

**//second two**

resolve label equivalence

for *row*=0 to *image.rows* - 1

for *col*=0 to *image.cols* - 1

if *image*[*row*, *col*] is not background

replace temporary labels

return *label\_map*

- $N$  =collected labels in adjacency of point  $p$  (row, col)
- *if*  $N = \emptyset$ 
  - assign a new label to  $p$
- *else*
  - assign minimum of  $N$  to  $p$

- *if*  $|N| > 1$ 
  - $l_i = \min(N)$
  - add equivalence relation  $l_i \sim l_j$  for all  $l_j \in N$

## TwoPassCCL(*image*)

initialize *label\_map* with the value 0

**// first pass**

*for row=0 to image.rows - 1*

*for col=0 to image.cols - 1*

*if image[row, col] is not background*

assign temporary labels

record equivalence relations

**//second two**

● resolve label equivalence

*for row=0 to image.rows - 1*

*for col=0 to image.cols - 1*

*if image[row, col] is not background*

● replace temporary labels

return *label\_map*

- create single-integer-item sets,  $\{1\}, \{2\}, \dots$
- *for* each equivalence pair  $(l_i, l_j)$ 
  - unify two sets that contains  $l_i$  and  $l_j$ , respectively.

- replace the label at  $p$  by the **minimum** of the set containing the label of  $p$

