Data Structures Array Representation

Andres Mendez-Vazquez

August 25, 2016

Outline

- Introduction
 - Why Array Representation?
 - 1D Arrays
 - 2D Arrays
- Representation
 - 2D Array Representation
- Improving the representation
 - Row-Major Mapping
- 4 Matrix
 - Definition
 - Types of Matrices
- 5 Sparse Matrices
 - Sparse Matrices
 - Representation Of Unstructured Sparse Matrices
 - Sparse Arrays

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Introduction

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We could use a name variable for each data

double score0; double score1; double score2; double score3; double score4; double score5;

Making your life miserable

Because you can ask

Which is the highest score?

Making your life miserable

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Which is the highest score?

Look at the code

```
double high_score = score0;
if ( score1 > high_score ) { high_score = score1; }
if ( score2 > high_score ) { high_score = score2; }
if ( score3 > high_score ) { high_score = score3; }
if ( score4 > high_score ) { high_score = score4; }
if ( score5 > high_score ) { high_score = score5; }
System.out.println(high_score);
```

How do we solve this?

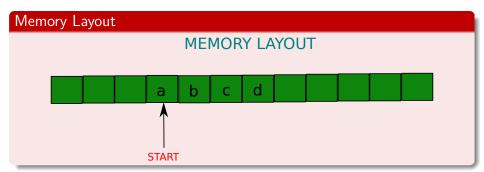
Thus

Java, C and C++ use array variables to put together this collection of equal elements.

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Notes

For 1-dimensional array:

- The elements are mapped into contiguous memory locations
- They are accessed through the use of location(x|i|) = start + i

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Space Overhead
```

- Storing the start address: 4 bytes
- Storing x.length: 4 bytes
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- **@** Space for the elements, for example 4 bytes for n elements
 - Total: 4 + 4 + 4n = 8 + 4n bytes

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Now, 2D Arrays

```
We declare 2-dimensional arrays as follow (Java, C)
```

int[][] A = new int[3][4]

```
It can be shown as a table
```

```
\[0][0] A[0][1] A[0][2] A[0][3]
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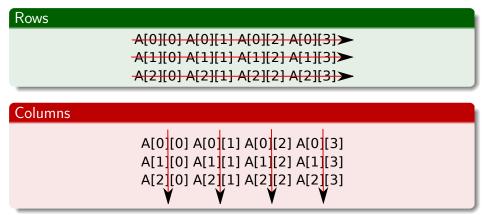
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Rows and Columns in a 2-D Array

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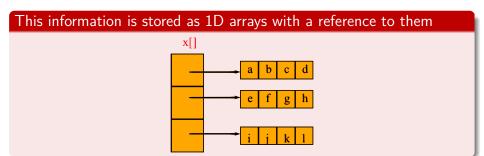
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Given the following 2-dimensional array **x**
$$\mathbf{x} = \begin{bmatrix} a & b & c & d \\ e & f & g & h \\ i & j & k & l \end{bmatrix}$$

This information is stored as 1D arrays with a reference to them

$$\mathbf{x} = \begin{bmatrix} a & b & c & d \\ e & f & g & h \\ i & j & k & l \end{bmatrix}$$



If we call the lengths of each of them

- x.length \Rightarrow 3
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More Properties

First

This representation is called the **array-of-arrays** representation.

It requires contiguous memory of size 3 bytes, 4 bytes, 4 bytes, and 4 bytes for the 4 1D-arrays.

Third

One memory block of size **number of rows** and **number of rows** blocks of size **number of columns.**

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Row-Major Mapping

Again

$$\mathbf{x} = \begin{bmatrix} a & b & c & d \\ e & f & g & h \\ i & j & k & l \end{bmatrix}$$

For this

We will convert it into 1D-array $oldsymbol{y}$ by collecting elements by rows.

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We get

An array

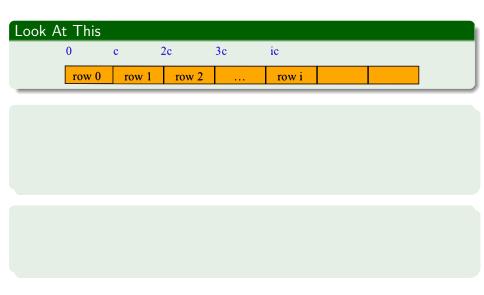
 $y[] = \{a, b, c, d, e, f, g, h, i, j, k, l\}$

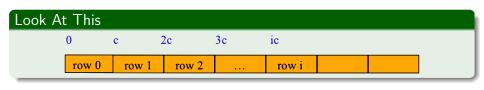
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Memory Map row 0 row 1 row 2 ... row i





Then

- Assume x has r rows and c columns.
- Each row has c elements
- i rows to the left of row i



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- Assume **x** has **r** rows and **c** columns.
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- We have **ic** elements to the left of **x[i][0]**.
- Then, x[i][i] is mapped to position ic + i of 1D array.



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- We have ic elements to the left of x[i][0].
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- 4 bytes for **start** of 1D array.
- 4 bytes for length of 1D array.
- 4 bytes for c (number of columns)
- Total: 12 bytes
 - Note: The number of rows = length/c

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Similar Setup

- Convert into 1D array y by collecting elements by columns.
- Within a column elements are collected from top to bottom.
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We get $y = \{a, e, i, b, f, j, c, g, k, d, h, l\}$

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Something Notable

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Use notation \times (i,j) rather than \times [i][j].

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We use the following notation

Use notation x(i,j) rather than x[i][j].

Note

It may use a 2D array to represent a matrix.

Drawbacks of using a 2D Array

First

Indexes are off by 1.

Second

Java arrays do not support matrix operations such as add, transpose multiply, and so on

Но

You can develop a class Matrix for object-oriented support of all matrix operations.

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Diagonal Matrix

An $n\times n$ matrix in which all nonzero terms are on the diagonal.

Propertie

 \bullet **x(i,j)** is on diagonal iff i = j

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Example

$$\mathbf{x} = \begin{bmatrix} a & 0 & 0 & 0 \\ 0 & b & 0 & 0 \\ 0 & 0 & c & 0 \\ 0 & 0 & 0 & d \end{bmatrix}$$

Properties

x(i,j) is on diagonal iff i = j

For a $n \times n$ you are required to have

• For example using integers: $4n^2$ bytes...

What to do?

Store diagonal only vs n^2 whole

Properties

x(i,j) is on diagonal iff i = j

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Some Basic Matrices: Lower Triangular Matrix

Definition

An $n \times n$ matrix in which all nonzero terms are either on or below the diagonal.



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Example

$$\mathbf{x} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 2 & 3 & 0 & 0 \\ 4 & 5 & 6 & 0 \\ 7 & 8 & 9 & 10 \end{bmatrix}$$

Properties

x(i,j) is part of lower triangle iff i >= j.

$$1+2+3+...+n=\frac{n(n+1)}{2}$$

Properties

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Number of elements in lower triangle is

$$1 + 2 + 3 + \dots + n = \frac{n(n+1)}{2} \tag{1}$$

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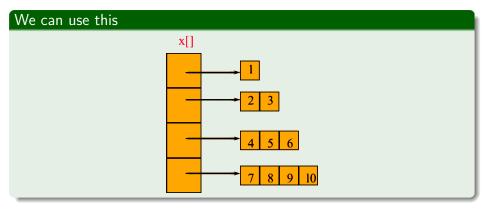
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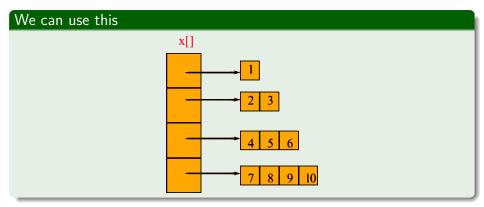
Array Of Arrays Representation



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You can use an irregular 2-D array ... length of rows is not required to be the same

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You can use an irregular 2-D array ... length of rows is not required to be the same.

Code

Code for irregular array

However, You can do better

Map Lower Triangular Array Into A 1D Array

You can use a row-major order, but omit terms that are not part of the lower triangle.



1. 2. 3. 4. 5. 6. 7. 8. 9. 10

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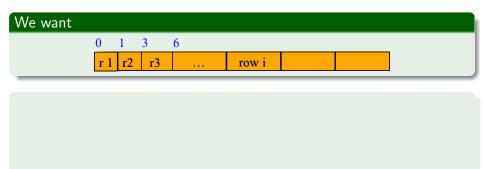
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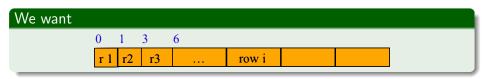
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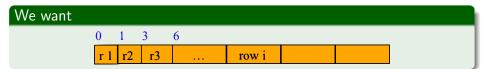
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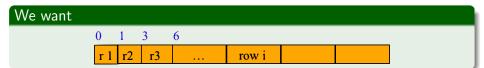
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- **1** Order is: row 1, row 2, row 3, ...
- 2 Row i is preceded by rows 1, 2, ..., i-1
- 3 Size of row i is i.

More

Find the total number of elements before row i

$$1 + 2 + 3 + \dots + i - 1 = \frac{i(i-1)}{2} \tag{2}$$

Thus

So element (i,j) is at position $\mathsf{i}(\mathsf{i}\text{-}1)/2+\mathsf{j}$ -1 of the 1D array.

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So element (i,j) is at position i(i-1)/2 + j - 1 of the 1D array.

Now the Interface Matrix

You will need this for your homework

```
public interface Matrix<Item>{
   public Item get(int row, int column);
   public void add(int row, int column, Item myobj);
   public Item remove(int row, int column);
   public void output();
}
```

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Definition

A sparse array is simply an array most of whose entries are zero (or null, or some other default value).

Suppose you wanted a 2-dimensional array of course grades, whose rows are students and whose columns are courses.

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- There are about 90,173 students
- There are about 5000 courses

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Suppose you wanted a 2-dimensional array of course grades, whose rows are students and whose columns are courses.

Properties

- There are about 90,173 students
- There are about 5000 courses
- This array would have about 450,865,000 entries

Thus

Something Notable

Since most students take fewer than 5000 courses, there will be a lot of empty spaces in this array.

Something Notable

This is a big array, even by modern standards.

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Example Airline flight matrix.

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Properties

ullet Airports are numbered 1 through n

flight(i,j) = list of nonstop flights from airport i to airport j

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Assume n=1000 and you use an integer for representation

 $n \times n$ array of list references \Longrightarrow 4 million bytes when all the airports are connected

However

The total number of flights is way lesser \implies 20,000

Needed Storage

We need at most 20,000 list references \Longrightarrow Thus, we need at most 80,000 bytes

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Web page matrix

• Web pages are numbered 1 through n.

web(i,j) = number of links from page i to p

Web page matrix

- Web pages are numbered 1 through n.
- web(i,j) = number of links from page i to page j.

- Authority page ... page that has many links to it
- Hub page ... links to many authority pages.

Web page matrix

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Web Analysis

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Something Notable

n= 2,000,000,000 (and growing by 1 million a day)

 $n \times n$ array of integers $\Longrightarrow 16*10^{18}$ bytes $(16*10^9 \text{ GB})$

Something Notable

n = 2,000,000,000 (and growing by 1 million a day)

If we used integers for representation

 $n \times n$ array of integers $\Longrightarrow 16 * 10^{18}$ bytes ($16 * 10^9$ GB)

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Web Page Matrix

Something Notable

n= 2,000,000,000 (and growing by 1 million a day)

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Properties

- Each page links to 10 (say) other pages on average.
- On average there are 10 nonzero entries per row.
- Space needed for non-zero elements is approximately 20,000,000,000
 x 4 bytes = 80,000,000,000 bytes (80 GB)

What we need...

We need...

There are ways to represent sparse arrays efficiently

Definition

- Sparse ... many elements are zero
- Dense ... tew elements are zero

Definition

- Sparse ... many elements are zero
- Dense ... few elements are zero

- Diagonal
- Tridiagonal
- Lower triangular (Actually in the Middle of Sparse and Dense)

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- **Actually**
- They may be mapped into a 1D array so that a mapping function can be used to locate an element

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Outline

- Introduction
 - Why Array Representation?
 - 1D Arrays
 - 2D Arrays
- Representation
 - 2D Array Representation
- Improving the representation
 - Row-Major Mapping
- 4 Matrix
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 - Types of Matrices
- 5 Sparse Matrices
 - Sparse Matrices
 - Representation Of Unstructured Sparse Matrices
 - Sparse Arrays

We can use a

Single linear list in row-major order.

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Thus

- We scan the non-zero elements of the sparse matrix in row-major order.
 - Each nonzero element is represented by a triple (row, column, value)
- The list of triples may be an array list or a linked list (chain)

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 - Sparse Arrays

Example with an Sparse Array

First

We will start with sparse one-dimensional arrays, which are simpler

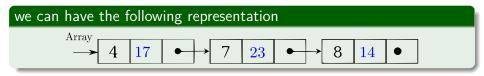
```
0 1 2 3 4 5 6 7 8 9 10 11
Array 0 0 0 0 17 0 0 23 14 0 0 0
```

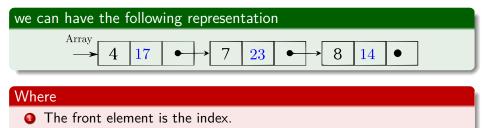
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Example													
	0	1	2	3	4	5	6	7	8	9	10	11	
Array	0	0	0	0	17	0	0	23	14	0	0	0	



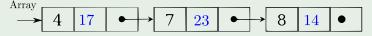




Where

- The front element is the index.
- 2 The second element is the value at cell index.

we can have the following representation



Where

- 1 The front element is the index.
- The second element is the value at cell index.
- 3 A pointer to the next element

- A constructor:
 - SparseArray(int length)
- A way to get values from the array:
 - Object get(int index)
- A way to store values in the array:
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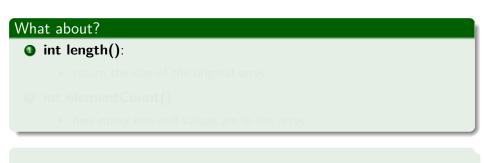
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Question

Do we forget something?

Example of Get

```
Code
public Item get(int index) {
    ChainNode current = this.firstNode;
       do {
            if (index == current.index) {
                  // found correct location
                  return current.value;
               current = current.next:
          } while (index < current.index && next != null);</pre>
   return null:
```

Time Analysis

First

• We must search a linked list for a given index

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- We can keep the elements in order by index

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Expected Time for both get and add

If we have n elements, we have the following complexity O(n).

For the other methods

length, elementCount $\Longrightarrow O(1)$

Problem with this analysis

True fact

In an ordinary array, indexing to find an element is the only operation we really need!!!

True fact

In a sparse array, we can do indexing reasonably quickly

False Conclus

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Look at this code

To find the maximum element in a normal array:

```
double max = array[0];
for (int i = 0; i < array.length; i++)
{
    if (array[i] > max) max = array[i];
}
```

Look at this code

To find the maximum element in a sparse array:

```
Double max = (Double) array.get(0);
for (int i = 0; i < array.length(); i++)
{
    Double temp = (Double) array.get(i);
    if (temp.compareTo(max) > 0) {
        max = temp;
    }
}
```

First

A lot of wrapping and casting because using generics.

Second

More importantly, in a normal array, every element is relevant

Third

- If a sparse array is 1% full, 99% of its elements will be zero.
 - This is 100 times as many elements as we should need to examine

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Fourth

Our search time is based on the size of the sparse array, not on the number of elements that are actually in it

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However

- This is a very expensive thing to do with a sparse array
- This should not be so expensive:
 - ▶ We have a list, and all we need to do is step through it

Poor Solution

- Let the user step through the list.
- The user should not need to know anything about implementation
- We cannot trust the user not to screw up the sparse arra
- These arguments are valid even if the user is also the implementer

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Correct Solution

Use an Inner iterator!!!

Example

Code

So, we have that

```
Code for Max
```

```
SparseArrayIterator iterator = new SparseArrayIterator(array);
Double max = (Double) array.get(0);
while (iterator.hasNext()) {
    temp = (Double) iterator.next();
    if (temp.compareTo(max) > 0) {
        max = temp;
    }
}
```

Problem

• Our SparseArrayIterator is fine for stepping through the elements of an array, but...

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- But it's worse than that, because next is defined to return an Item, so we would have to wrap the index.
- We could deal with this by overloading get to take an Item argument.

Instead of that use an IndexIterator Too

```
Code
public class IndexIterator
    private ChainNode current;
    IndexIterator() { // constructor
            current = firstNode;
   public boolean hasNext()
       { // just like before }
    public int next() {
        int index = current.index;
        current = current.next;
        return index;
```

Now, Sparse Matrices

First

Something Simple!!

Using Array Linear List for Matrices

Example

$$\left[\begin{array}{ccccc} 0 & 0 & 3 & 0 & 4 \\ 0 & 0 & 5 & 7 & 0 \\ 0 & 0 & 0 & 0 & 0 \\ 0 & 2 & 6 & 0 & 0 \end{array}\right]$$

Using Array Linear List for Matrices

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Thus

Now, How do we represent this list using arrays?

Why?

We want compact representations...

Use your friend element from arrays

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 $\mathsf{Node}\ \mathsf{element}[] = \mathsf{new}\ \mathsf{Node}[1000];$

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package dataStructures;
//Using Generic in Java
public class Node<Item>{
    //elements
    private int row;
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Thus you declare an array element with the Node information

Node element[] = new Node[1000];

What about other representations?

We can use chains too

We need to modify our node

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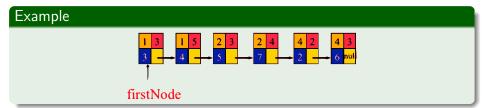
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```

Graphically



We have then



One Linear List Per Row

Example

$$\begin{bmatrix} 0 & 0 & 3 & 0 & 4 \\ 0 & 0 & 5 & 7 & 0 \\ 0 & 0 & 0 & 0 & 0 \\ 0 & 2 & 6 & 0 & 0 \end{bmatrix}$$

Thus

$$\begin{array}{lll}
 \text{row1} &=& [(3,3) & (5,4)] \\
 \text{row2} &=& [(3,5) & (4,7)] \\
 \text{row3} &=& [] \\
 \text{row4} &=& [(2,2) & (3,6)]
 \end{array}$$

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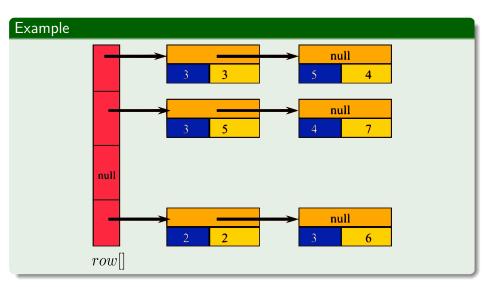
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Node Structure



Array Of Row Chains



We have a problem here

With 99% of the matrix as zeros or nulls

We have the problem that many row pointers are null...

Ideas

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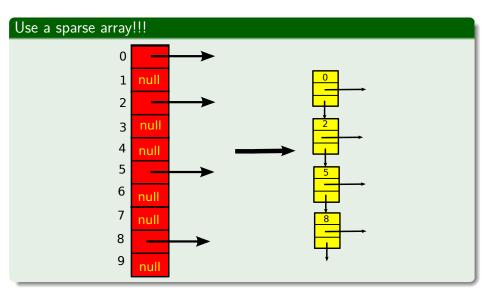
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What can you do?

Ideas

Compress the row



However

Problems, problems Will Robinson!!!

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Yes, access!! You still need to do an scanning!!!

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Not so fast!!!! SOLUTIONS???

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Orthogonal List Representation

More complexity

Both row and column lists.

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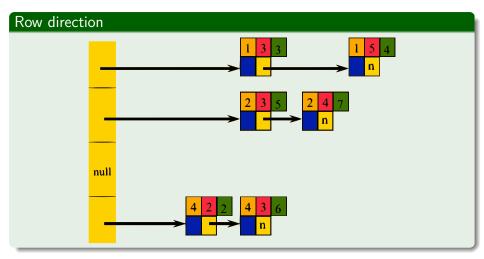
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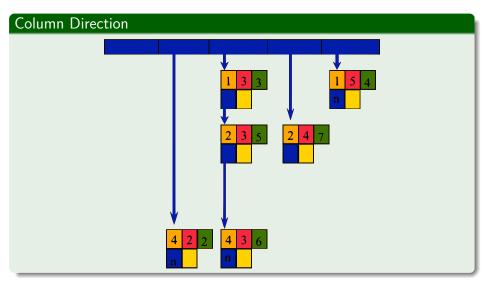
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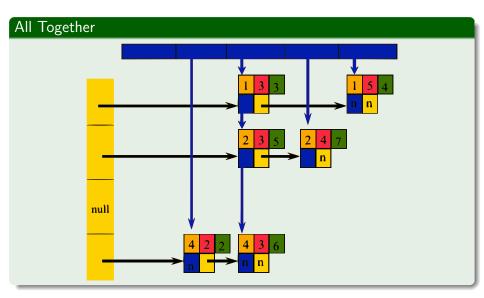
Row Lists



Column Lists



Orthogonal Lists



Go One Step Further

Question

We have another problem the sparse arrays in the column and row pointers!!!

Inus

How it will look like for this (You can try!!!)

$$\left(\begin{array}{ccccccc} 0 & 1 & 0 & 0 & 2 \\ 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 2 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 1 \end{array}\right)$$

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(3)

Do not worry!!!

You have MANY VARIATIONS!!!

Example

 500×500 matrix with 1994 nonzero elements

Example

 500×500 matrix with 1994 nonzero elements

• 2D array $500 \times 500 \times 4 = 1$ million bytes

Example

500 x 500 matrix with 1994 nonzero elements

- 2D array $500 \times 500 \times 4 = 1$ million bytes
- Single Array List **3** x **1994** x **4** = 23,928 bytes

Example

 500×500 matrix with 1994 nonzero elements

- 2D array $500 \times 500 \times 4 = 1$ million bytes
- Single Array List 3 x 1994 x 4 = 23,928 bytes
- One Chain Per Row $23928 + 500 \times 4 = 25,928$

Example

500 x 500 matrix with 1994 nonzero elements

- 2D array $500 \times 500 \times 4 = 1$ million bytes
- Single Array List 3 x 1994 x 4 = 23,928 bytes
- One Chain Per Row $23928 + 500 \times 4 = 25,928$
- What about the sparse version even in row and column pointer?

Run-time Performance

Example Matrix Transpose

 500×500 matrix with 1994 nonzero elements:

Method	Time
2D Array	210 ms
Single Array List	6 ms
One Chain per Row	12 ms

Example Mat

500 x 500 matrix with 1994 nonzero elements:

Run-time Performance

Example Matrix Transpose

 500×500 matrix with 1994 nonzero elements:

Method	Time
2D Array	210 ms
Single Array List	6 ms
One Chain per Row	12 ms

Example Matrix Addition

 500×500 matrix with 1994 nonzero elements:

Method	Time
2D Array	880 ms
Single Array List	18 ms
One Chain per Row	29 ms