



## Sparse Matrices



sparse ... many elements are zero

dense ... few elements are zero

## Example Of Sparse Matrices

diagonal

tridiagonal

lower triangular (?)

**These are structured sparse matrices.**

May be mapped into a 1D array so that a mapping function can be used to locate an element.

## Unstructured Sparse Matrices

Airline flight matrix.

- airports are numbered **1** through **n**
- flight(i,j)** = list of nonstop flights from airport **i** to airport **j**
- n = 1000** (say)
- n x n** array of list references => **4 million bytes**
- total number of flights = **20,000** (say)
- need at most **20,000** list references => at most **80,000 bytes**

## Unstructured Sparse Matrices

Web page matrix.

web pages are numbered **1** through **n**

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

Web analysis.

**authority page** ... page that has many links to it

**hub page** ... links to many authority pages

## Web Page Matrix

- $n = 2$  billion (and growing by 1 million a day)
- $n \times n$  array of ints  $\Rightarrow 16 * 10^{18}$  bytes ( $16 * 10^9$  GB)
- each page links to 10 (say) other pages on average
- on average there are 10 nonzero entries per row
- space needed for nonzero elements is approximately 20 billion  $\times$  4 bytes = 80 billion bytes (80 GB)

## Representation Of Unstructured Sparse Matrices

Single linear list in row-major order.

scan the nonzero 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)

## Single Linear List Example

0 0 3 0 4	list =
0 0 5 7 0	row
0 0 0 0 0	column
0 2 6 0 0	value

1	1	2	2	4	4
3	5	3	4	2	3
3	4	5	7	2	6

## Array Linear List Representation

row	1	1	2	2	4	4
column	3	5	3	4	2	3
value	3	4	5	7	2	6

element	0	1	2	3	4	5
row	1	1	2	2	4	4
column	3	5	3	4	2	3
value	3	4	5	7	2	6

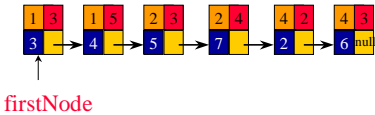
Chain Representation

Node structure.

row	col
value	next

Single Chain

row	1	1	2	2	4	4
list = column	3	5	3	4	2	3
value	3	4	5	7	2	6



One Linear List Per Row

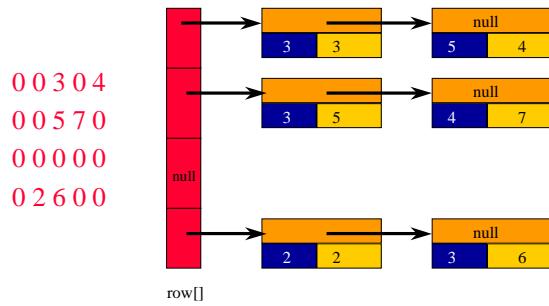
0 0 3 0 4	row1 = [(3, 3), (5,4)]
0 0 5 7 0	row2 = [(3,5), (4,7)]
0 0 0 0 0	row3 = []
0 2 6 0 0	row4 = [(2,2), (3,6)]

Array Of Row Chains

Node structure.

next
col value

### Array Of Row Chains



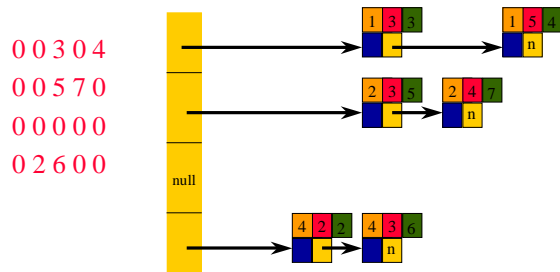
### Orthogonal List Representation

Both row and column lists.

Node structure.

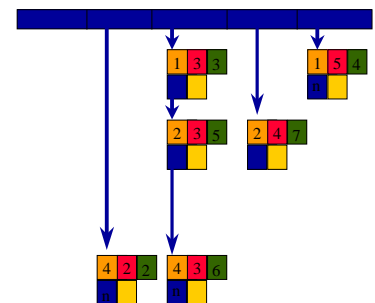


### Row Lists

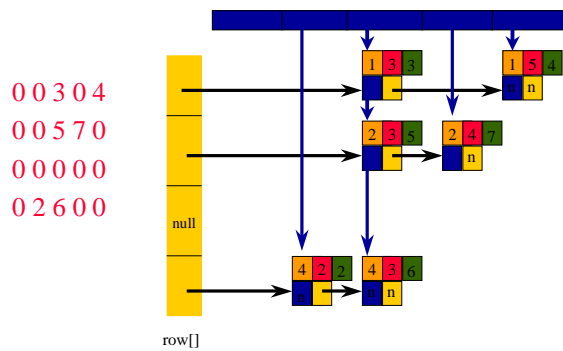


### Column Lists

0 0 3 0 4  
0 0 5 7 0  
0 0 0 0 0  
0 2 6 0 0



### Orthogonal Lists



### Variations

May use circular lists instead of chains.

### Approximate Memory Requirements

500 x 500 matrix with 1994 nonzero elements

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

### Runtime Performance



Matrix Transpose

500 x 500 matrix with 1994 nonzero elements

2D array 210 ms  
 Single Array List 6 ms  
 One Chain Per Row 12 ms

## Performance



Matrix Addition.

500 x 500 matrices with 1994 and 999 nonzero elements

2D array 880 ms

Single Array List 18 ms

One Chain Per Row 29 ms