



# Sparse Matrix-Vector Multiplication

Computación de altas prestaciones y aplicaciones:  
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- Formatos de Matrices
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# Matriz Dispersa (Sparse Matrix)

## Example of sparse matrix

$$\begin{pmatrix} 11 & 22 & 0 & 0 & 0 & 0 & 0 \\ 0 & 33 & 44 & 0 & 0 & 0 & 0 \\ 0 & 0 & 55 & 66 & 77 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 88 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 99 \end{pmatrix}$$

The above sparse matrix contains only 9 nonzero elements, with 26 zero elements. Its sparsity is 74%, and its density is 26%.

La matriz dispersa es una matriz (real, compleja) donde la mayoría de los elementos son ceros:  $A \in \mathbb{R}^{N,N}$  entonces el número de elementos distintos de cero (NNZ) es  $O(N)$ .

Utilizadas generalmente:

- Método de los elementos finitos (MEF en castellano o finite element method (FEM) en inglés)
- Ecuación en derivadas parciales (a veces abreviada como EDP o partial differential equation (PDE) en inglés)
- Esquemas de discretización numérica: finite volume (FV), finite element (FE), y finite difference (FD) methods.
- Sistemas de ecuaciones no lineales dispersos
- Ecuaciones lineales



# Formato de Matrices:

Los formatos los podemos dividir en dos grupos:

- Aquellos que apoyan la modificación eficiente, como son:
  - a. DOK (Diccionario de claves)
  - b. LIL (Lista de listas)
  - c. COO (Lista coordinada)
- Aquellos que apoyan operaciones eficientes de acceso y matriz, como son:
  - a. CSR (Compressed Sparse Row)
  - b. CSC (Compressed Sparse Column)

# Formato de Matrices: Ejemplo

$A \in \mathbb{R}^{5,5}$ , NNZ=11, sin patrón

	0	1	2	3	4
0	1	2		11	
1		3	4		
2		5	6	7	
3				8	
4				9	10

# Formato de Matrices: COO

Lista Coordinada:

- Índice de Filas - (int) (NNZ)
- Índice de columnas - (int) (NNZ)
- Valores - (data type) (NNZ)

row

0	0	0	1	1	2	2	2	3	4	4
---	---	---	---	---	---	---	---	---	---	---

col

0	1	3	1	2	1	2	3	3	3	4
---	---	---	---	---	---	---	---	---	---	---

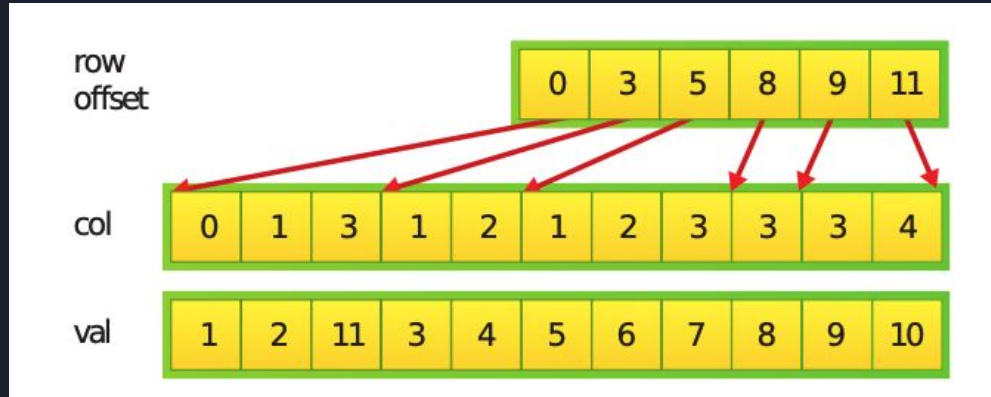
val

1	2	11	3	4	5	6	7	8	9	10
---	---	----	---	---	---	---	---	---	---	----

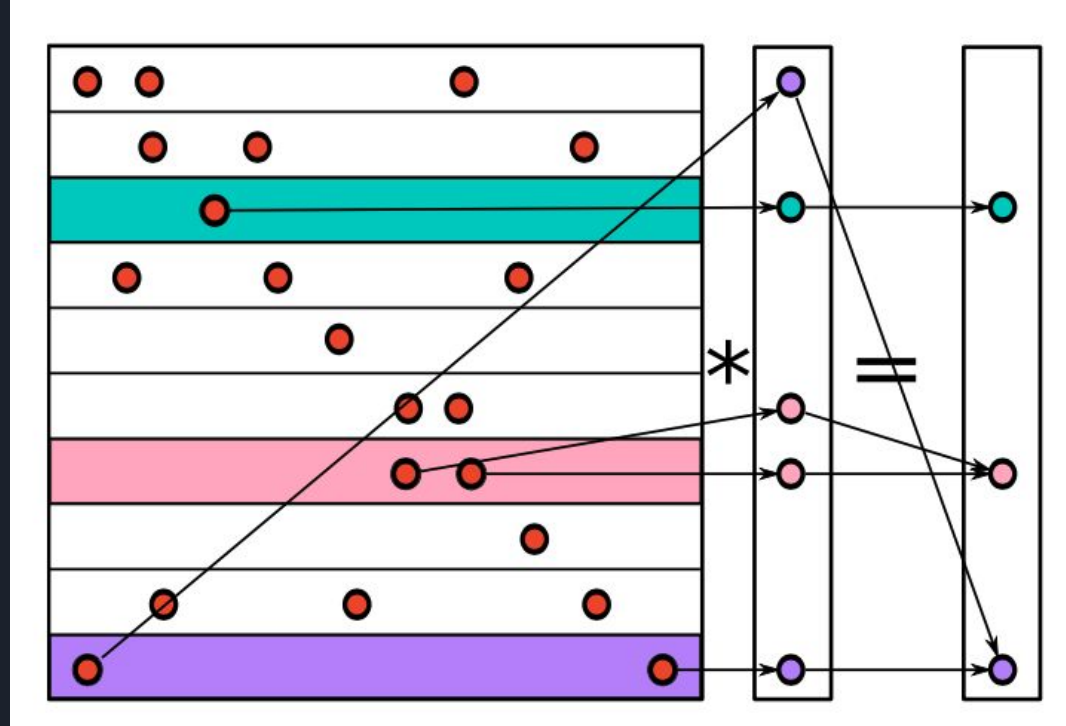
# Formato de Matrices: CSR

Compressed Sparse Row:

- Desplazamientos de filas - (int) (N+1)
- Índice de columnas - (int) (NNZ)
- Valores - (data type) (NNZ)



# Sparse Matrix-Vector Multiplication $q=A.p$





# SpMV - COO

```
for (int i=0; i<nnz; ++i)  
  y[row[i]] += val[i]*x[col[i]];
```

row

0	0	0	1	1	2	2	2	3	4	4
---	---	---	---	---	---	---	---	---	---	---

col

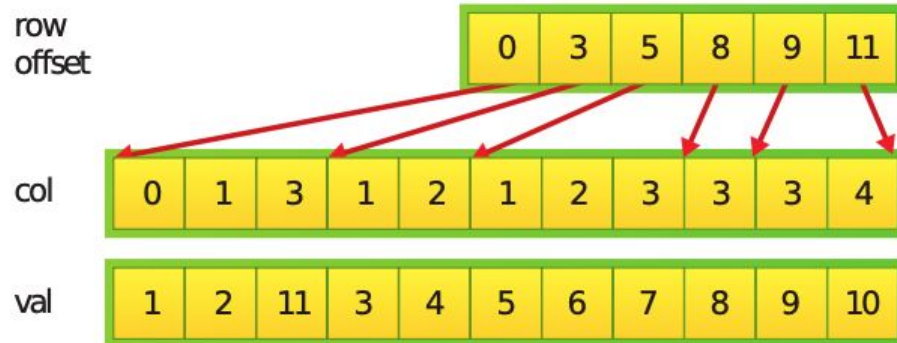
0	1	3	1	2	1	2	3	3	3	4
---	---	---	---	---	---	---	---	---	---	---

val

1	2	11	3	4	5	6	7	8	9	10
---	---	----	---	---	---	---	---	---	---	----

# SpMV - CSR

```
for (int i=0; i<n; ++i) {  
    y[i] = 0.0;  
    for (int j=row_off[i]; j<row_off[i+1]; ++j)  
        y[i] += val[j]*x[col[j]];  
}
```



# Parallel SpMV

CSR

```
#pragma omp parallel for
for (int i=0; i<n; ++i) {
    y[i] = 0.0;
    for (int j=row_off[i]; j<row_off[i+1]; ++j)
        y[i] += val[j]*x[col[j]];
}
```

COO

????????????

```
for (int i=0; i<nnz; ++i)
    y[row[i]] += val[i]*x[col[i]];
```

row	0	0	0	1	1	2	2	2	3	4	4
col	0	1	3	1	2	1	2	3	3	3	4
val	1	2	11	3	4	5	6	7	8	9	10

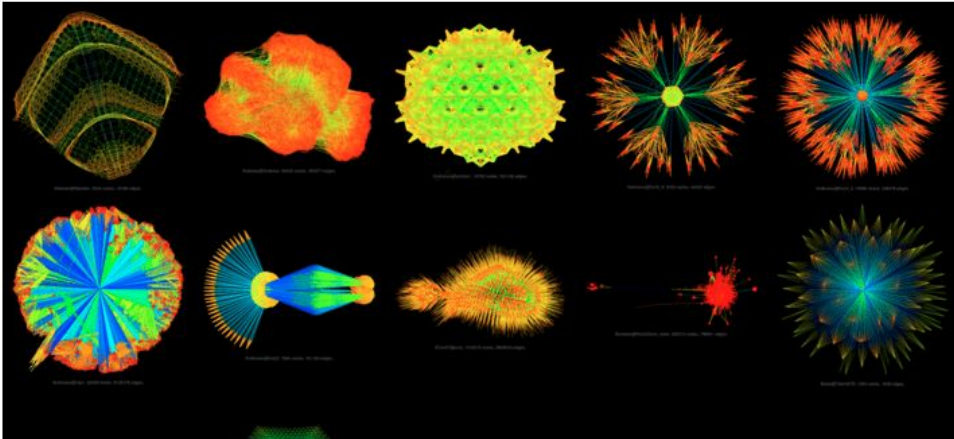
# Performance

Datos:

The SuiteSparse Matrix Collection (formerly the University of Florida Sparse Matrix Collection) (<https://sparse.tamu.edu>)

**SuiteSparse Matrix Collection**  
Formerly the University of Florida Sparse Matrix Collection

**Sample Gallery of the SuiteSparse Matrix Collection:**



Otras Librerías:

Intel® oneAPI Math Kernel Library (MKL)  
([https://software.intel.com/content/www/us/en/develop/tools/oneapi/components/one\\_mkl.html](https://software.intel.com/content/www/us/en/develop/tools/oneapi/components/one_mkl.html))

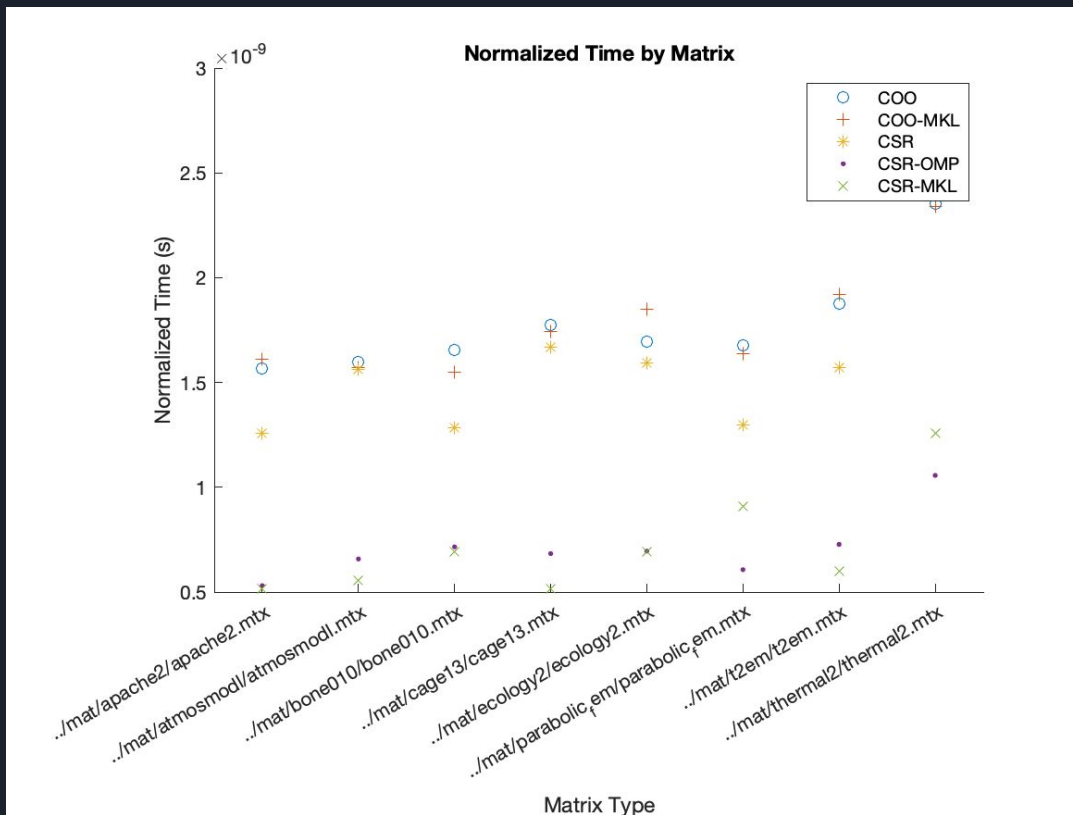
# Performance

Intel(R) Core(TM) i5-8257U  
CPU @ 1.40GHz

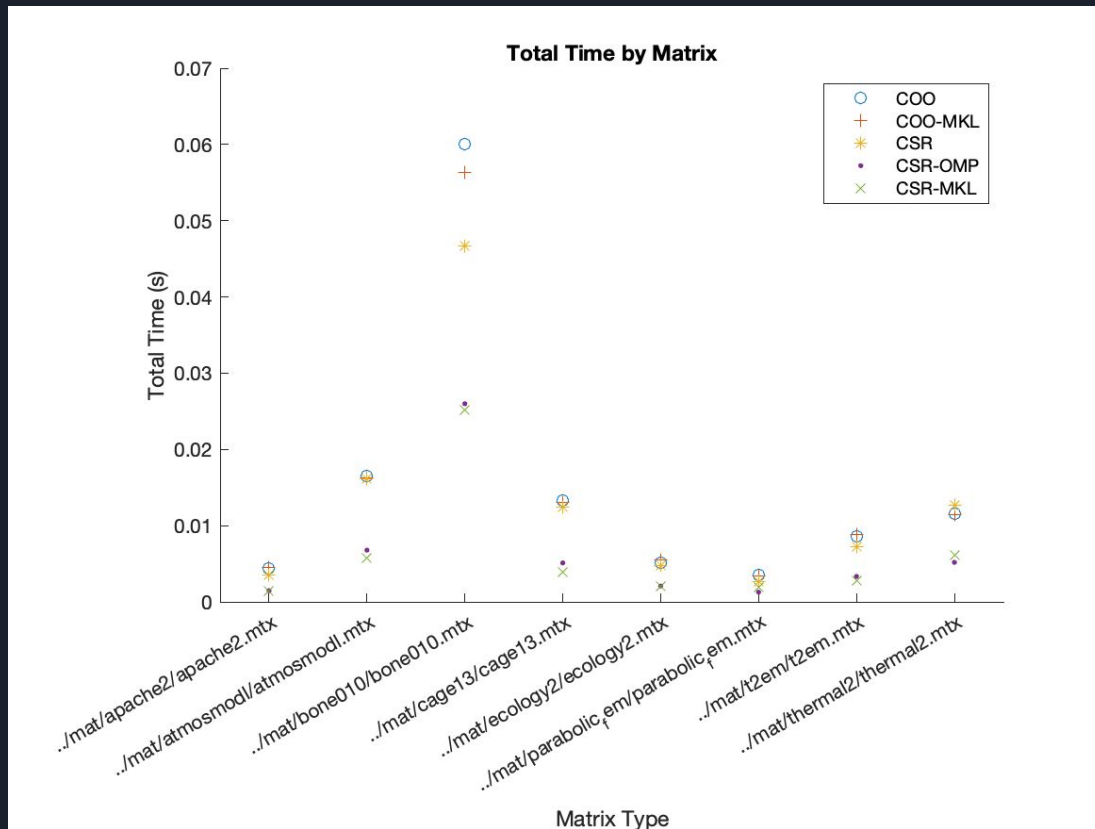
Cores = 4

Threads = 8

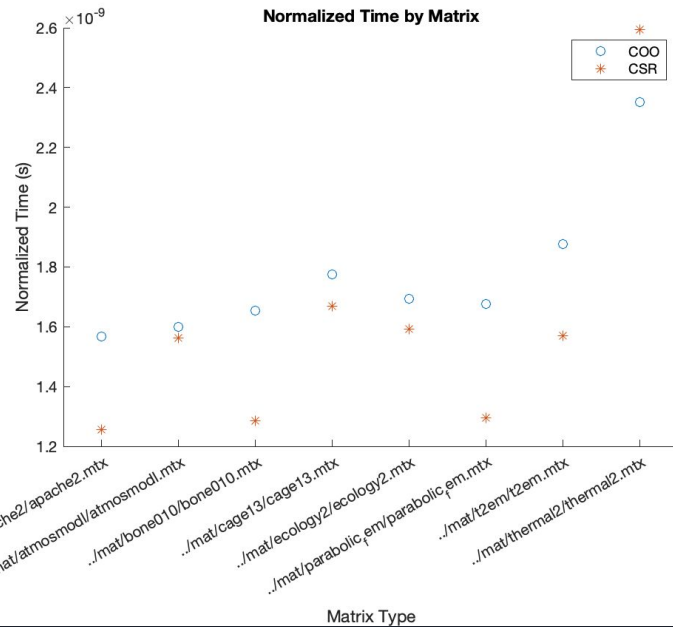
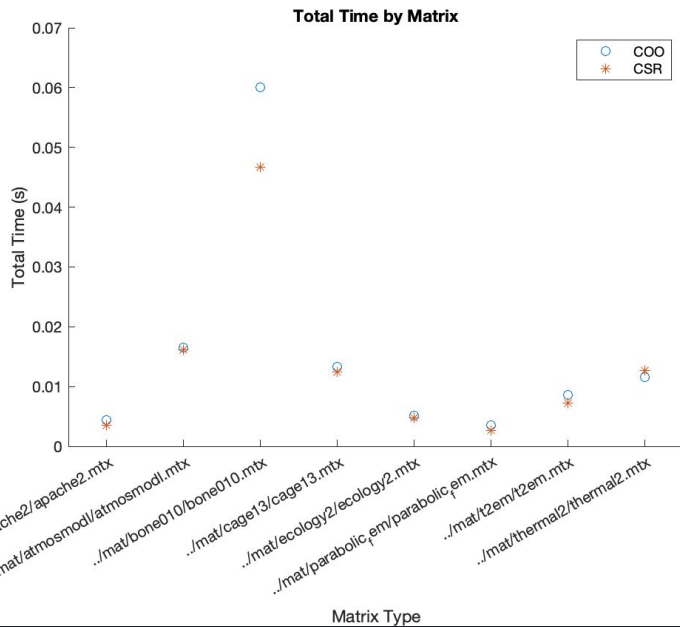
Cache = 6MB



# Performance



# Performance





# Repositorio

<https://github.com/velasquezerik/master-capaspmv>





# Bibliografía

- [https://en.wikipedia.org/wiki/Sparse\\_matrix#Compressed\\_sparse\\_column\\_\(CSC\\_or\\_CCS\)](https://en.wikipedia.org/wiki/Sparse_matrix#Compressed_sparse_column_(CSC_or_CCS))
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- Dimitar Lukarski, Uppsala University, Parallel Scientific Computing, April 11, 2013



Gracias...