

# SparseBLAS Products in UPC: an Evaluation of Storage Formats

Jorge González-Domínguez\*, Óscar García-López,  
Guillermo L. Taboada, María J. Martín, Juan Touriño

Computer Architecture Group  
University of A Coruña (Spain)  
{jgonzalezd,oscar.garcia,taboada,mariam,juan}@udc.es

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- 1 Introduction
- 2 Sparse Matrix-Vector Product
- 3 Sparse Matrix-Matrix Product
- 4 Experimental Evaluation
- 5 Conclusions

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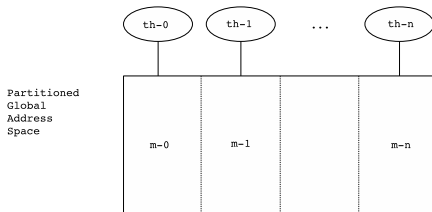
# UPC: a Suitable Alternative for HPC in Multi-core Era

## Programming Models:

- Traditionally: Shared/Distributed memory programming models
- Challenge: hybrid memory architectures
  - PGAS (Partitioned Global Address Space)

## PGAS Languages:

- UPC -> C
- Titanium -> Java
- Co-Array Fortran -> Fortran



## UPC Compilers:

- Berkeley UPC
- GCC (Intrepid)
- Michigan TU
- HP, Cray and IBM  
UPC Compilers

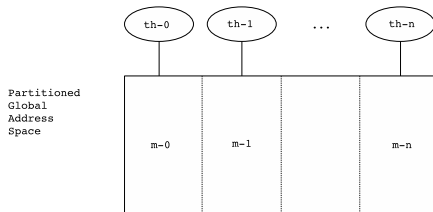
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# Studied Numerical Operations

## BLAS Libraries

- Basic Linear Algebra Subprograms
- Specification of a set of numerical functions
- Widely used by scientists and engineers
- SparseBLAS and PBLAS (Parallel BLAS)

## Studied Routines

- *usmv*: Sparse Matrix-Vector Product ( $\alpha * A * x + y = y$ )
- *usmm*: Sparse Matrix-Matrix Product ( $\alpha * A * B + C = C$ )

# Studied Storage Formats

## Elements ordered by rows

- Coordinate
- Compressed Sparse Row (CSR)
- Block Sparse Row (BSR)
- Skyline with lower matrices

## Elements ordered by columns

- Compressed Sparse Column (CSC)
- Skyline with upper matrices

## Elements ordered by diagonals

- Diagonal

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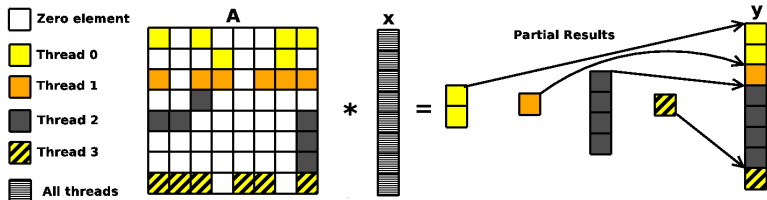
# Syntax

$$\alpha * A * x + y = y$$

## Structures

- $\alpha$  -> Scalar
- $A$  -> Sparse matrix
- $x$  -> Dense vector
- $y$  -> Dense vector

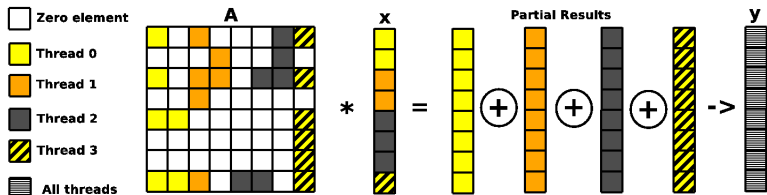
## Distribution by rows



### Characteristics

- Well balanced computational workload in multiplication
- Unbalanced computational workload in final additions
- Gathering of data only with one copy per thread

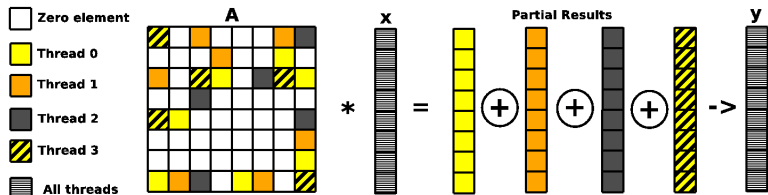
## Distribution by columns



### Characteristics

- Well balanced computational workload
- Gathering of data with one reduce per vector element

## Distribution by diagonals



### Characteristics

- Unbalanced computational workload
- Gathering of data with one reduce per vector element

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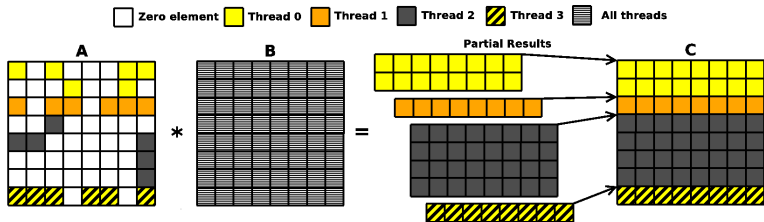
# Syntax

$$\alpha * A * B + C = C$$

## Structures

- $\alpha$  -> Scalar
- $A$  -> Sparse matrix
- $B$  -> Dense matrix
- $C$  -> Dense matrix

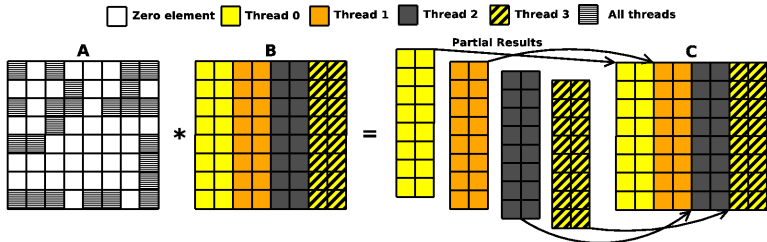
## Distribution by rows



### Characteristics

- Well balanced computational workload in multiplication
- Unbalanced computational workload in additions
- Gathering of data only with one copy per thread

## Distribution by columns



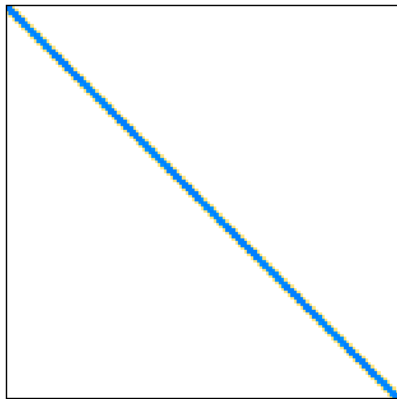
### Characteristics

- Well balanced computational workload in multiplication
- Well balanced computational workload in additions
- Gathering of data with one copy per thread and row

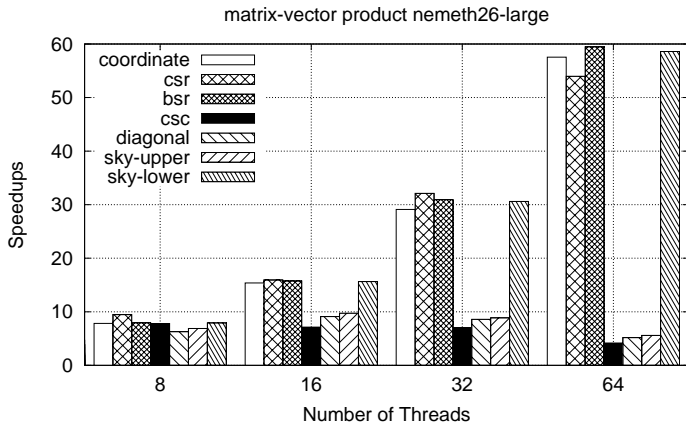


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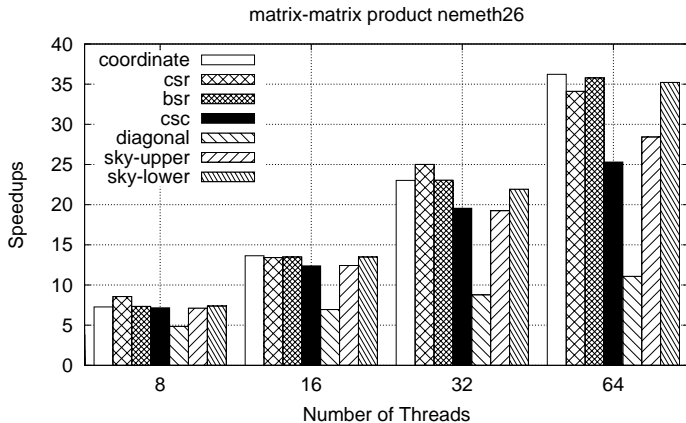
## Experimental Results with a Regular Matrix (I)



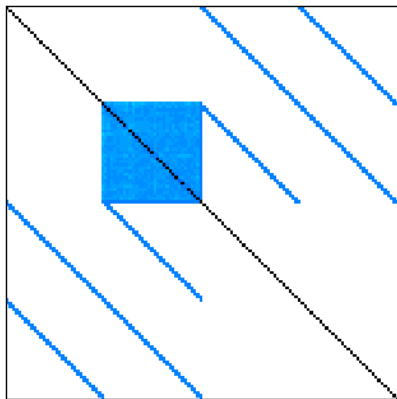
## Experimental Results with a Regular Matrix (II)



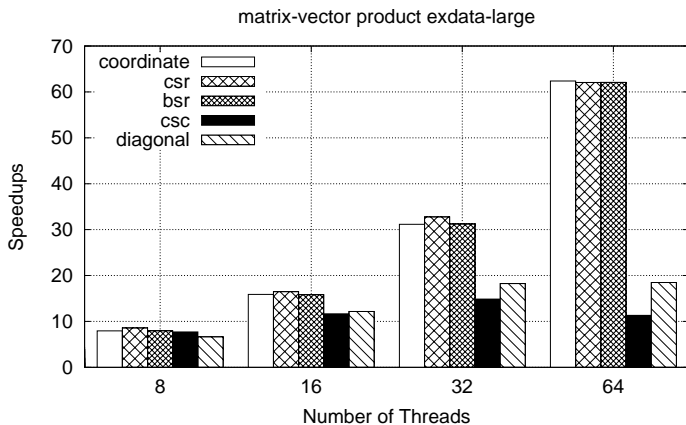
# Experimental Results with a Regular Matrix (and III)



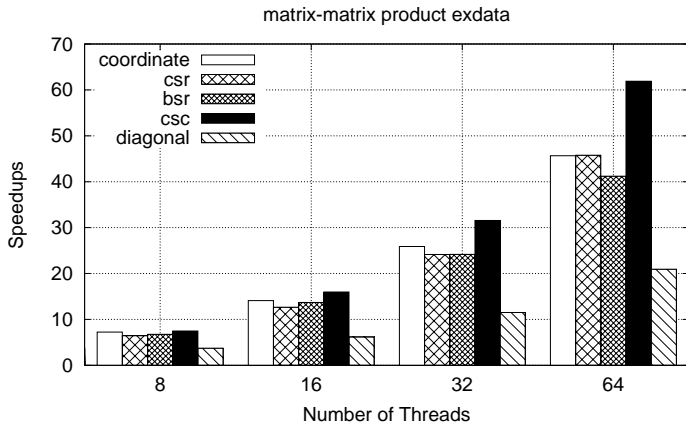
## Experimental Results with an Irregular Matrix (I)



## Experimental Results with an Irregular Matrix (II)



# Experimental Results with an Irregular Matrix (and III)



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# Main Conclusions

## Summary

- High speedups for both routines
- Best approach:
  - Sparse matrix-vector product -> by rows
  - Sparse matrix-matrix product
    - If regular sparse matrix -> by rows
    - If irregular sparse matrix -> by columns

## Future Work

- Study the impact of performing each distribution

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