

Hidehiko Hasegawa<sup>†, ††</sup>, Toshiaki Hishinuma<sup>†</sup>, and Teruo Tanaka<sup>††</sup><sup>†</sup>University of Tsukuba    <sup>††</sup>Kogakuin University

## Introduction

- High precision arithmetic is effective for reducing rounding errors and improving the convergence of Krylov methods[1].
- DD-AVX Library includes Double-Double precision[2] vector and Sparse Matrix operations optimized for SIMD AVX2[3].
- DD-AVX enables Double and Double-Double Mixed precision arithmetic by using operator and function overloading in C++.

## What is DD-AVX Library?

```
#include<dd-avx.hpp>
int main(){
    double alpha = 1.0;
    DD_Scalar beta=5.0, gamma=0.0;
    D_Vector x;
    DD_Vector y;
    D_Matrix A;
    DD_AVX_input(A, "input.mtx", "bcrs4x1");
    DD_AVX_vector_calloc(x, A.N);
    DD_AVX_vector_calloc(y, A.N);
    gamma = beta * 5.0 + DD(alpha);
    axpy(-gamma, x, y); //y += -gamma * x
    spmv(A,x,y);
    gamma.print();
}
```

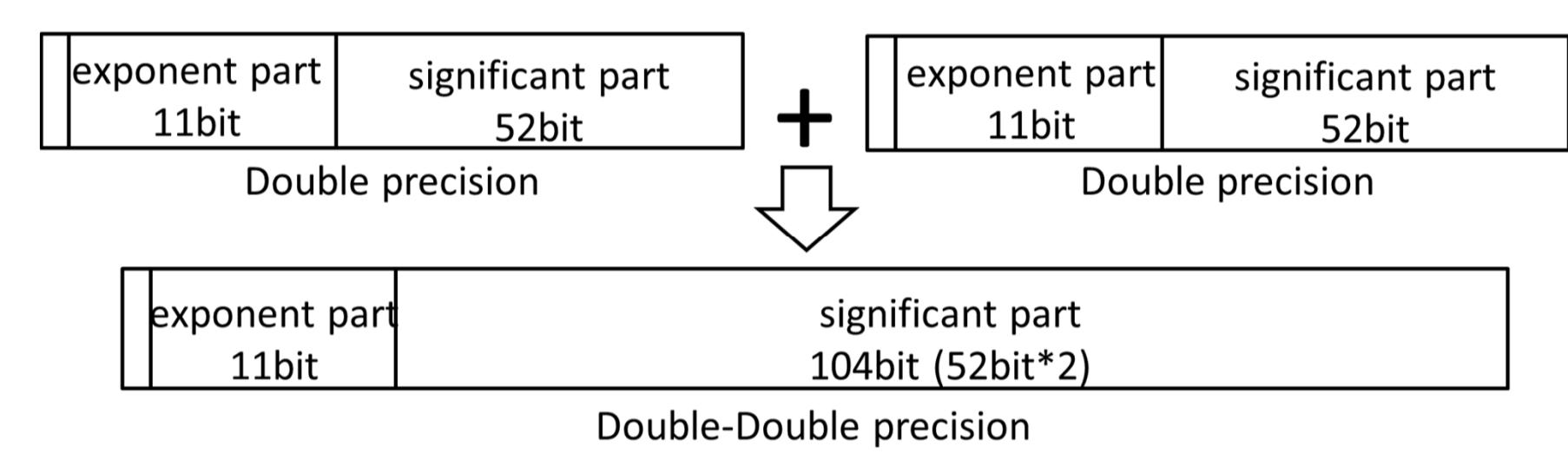
**Fig.1 Sample code of DD-AVX**

### A set of Double precision Sparse Matrix and DD precision vector operations:

- DD-AVX accelerates Double and DD precision arithmetic for SIMD AVX2/AVX/SSE2.
- DD-AVX supports
  - Vector operations : axpy, axpyz, xpay, dot, nrm2, and scale,
  - SpMV and transposed SpMV (Matrix of Double precision),
  - Two Sparse Matrix Storage format (CRS and BCRS4x1).
- A combination of BCRS4x1 and AVX2 can be good performance [3].

### EasyUI :

- Argument of functions does not depend on precisions.
- Interface of Functions is the same for D and DD.
- Mixed precision arithmetic is possible without changing the code.
- Arithmetic operators (+, -, \*, /) can be used for scalar arithmetic.
- SIMD intrinsics are used for avoiding overhead of C++ calls.
- Users can write code without knowledge of C++ programming language.

**Fig.2 Double-Double precision**

## Performance of $y_{DD} = A_D x_{DD}$ and $y_{DD} = A_D^T x_{DD}$ using DD-AVX

Intel Core i7 4770K 3.4GHz 4core, 16GB, CentOS 6.4, intel C++ Compiler 13.1.0

### Design policy: Precision of Matrix is Double.

- Input Matrices are given in Double precision in many cases.
- The bytes/flops of a product of Sparse Matrix and Vector  $y_{DD} = A_D x_{DD}$  becomes small.
- Precision of matrix has small influence for their convergence.

**Table 1** bytes/flops of  $y = Ax$ 

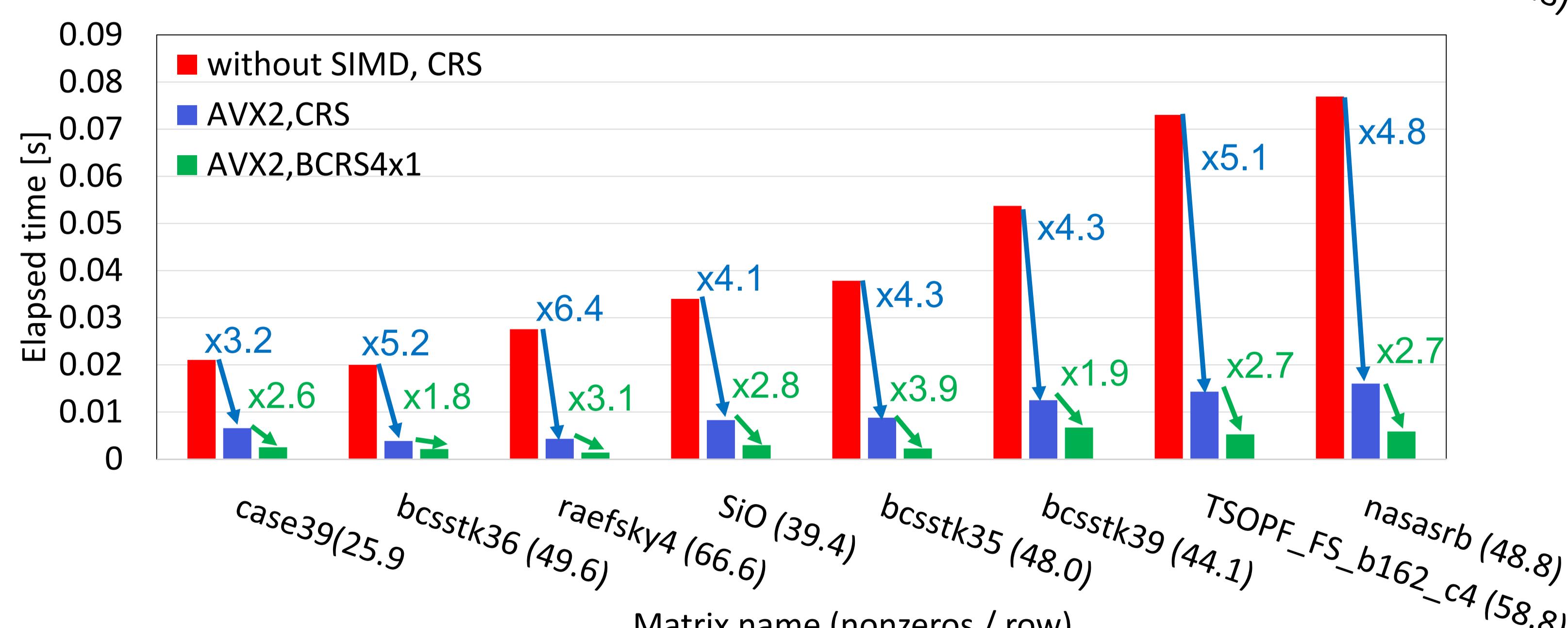
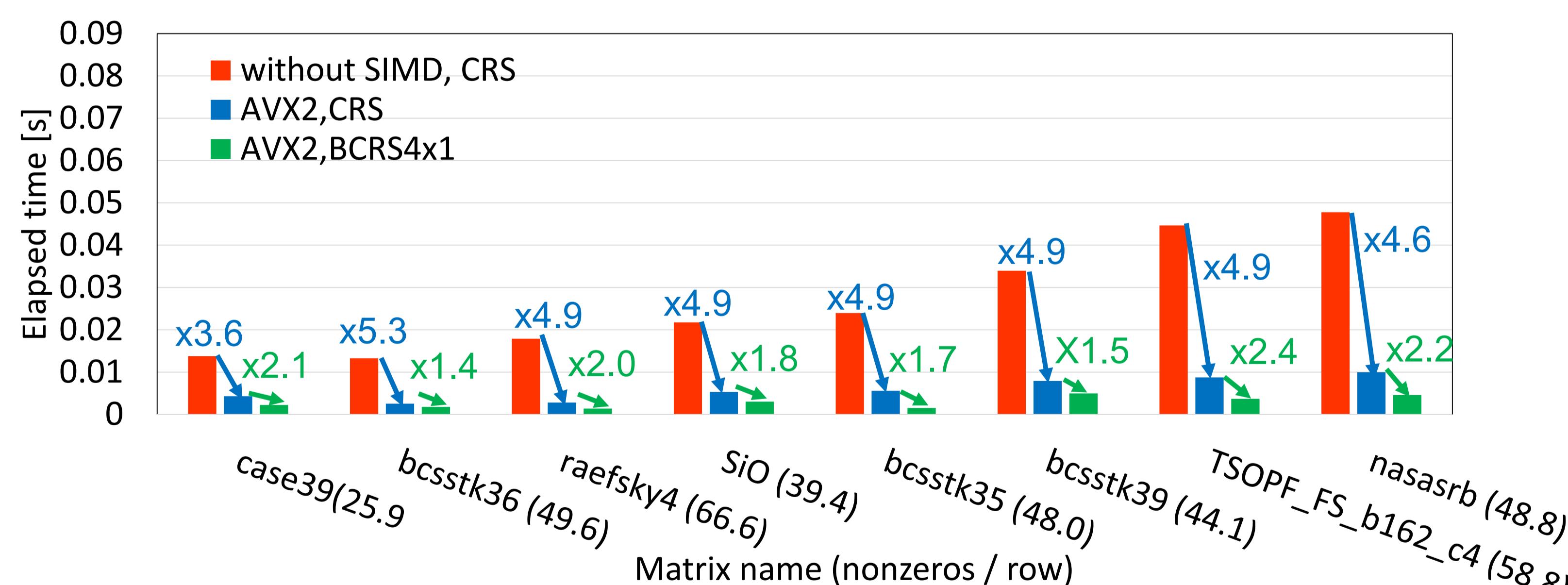
	bytes / flops
$y_D = A_D x_D$	14 (28 bytes / 2 flops)
$y_{DD} = A_{DD} x_{DD}$	2.26 (52 bytes / 23 flops)
$y_{DD} = A_D x_{DD}$	2.09 (44 bytes / 21 flops)

**DD-AVX 2.0.0 (alpha)**

Download DD-AVX library 2.0.0 (alpha)  
<http://www.slis.tsukuba.ac.jp/~s1530534/DD-AVX.html>

Contact: [hishinuma@slis.tsukuba.ac.jp](mailto:hishinuma@slis.tsukuba.ac.jp)**References**

- [1] T. Kouya : A Highly Efficient Implementation of Multiple Precision Sparse Matrix-Vector Multiplication and Its Application to Product-type Krylov Subspace Methods, IJNMA, Vol. 7, Issue 2, pp. 107-119 (2012).
- [2] Bailey, D. H.: High Precision Floating-Point Arithmetic in Scientific Computation, Computing in Science and Engineering, pp. 54-61 (2005).
- [3] T.Hishinuma, et al.: AVX acceleration of DD arithmetic between a sparse matrix and vector, Lecture Notes in Computer Science 8384, pp. 622-631 (2014).

**Fig.3 Elapsed time of  $y_{DD} = A_D x_{DD}$  (above) and  $y_{DD} = A_D^T x_{DD}$  (below)**

- DD-AVX can accelerate the product of Double precision Sparse Matrix in BCRS4x1 and DD precision Vector by using SIMD AVX2 (x1.4~x3.9 speedup!).
- This makes Krylov Subspace methods more stable with a small extra cost.
- Mixed precision arithmetic will be possible to reduce computation time of High precision Klylov methods.