

Automatic Generation of the HPC Challenge's Global FFT Benchmark

for BlueGene/P

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The HPC Challenge's Global FFT Benchmark

HPC Challenge

- New HPC Benchmark suite
- HPL, STREAM, RandomAccess, PTRANS, FFT, DGEMM, and b_eff
- Better characterization than HPL

Global FFT

- Large, parallel 1D FFT across the whole machine
- Strongly limited by the machine's communication system
- Baseline implementation: FFTE



http://icl.cs.utk.edu/hpcc/

Goal: Auto-generate efficient Global FFT implementation



- Spiral: Library Generation
- MPI-Friendly Global FFT Algorithm
- Experimental Results
- Summary



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M. Püschel, F. Franchetti, Y. Voronenko: Spiral. Encyclopedia of Parallel Computing, D. A. Padua (Editor), 2011.

Markus Püschel, José M. F. Moura, Jeremy Johnson, David Padua, Manuela Veloso, Bryan Singer, Jianxin Xiong, Franz Franchetti, Aca Gacic, Yevgen Voronenko, Kang Chen, Robert W. Johnson, and Nick Rizzolo: **SPIRAL: Code Generation for DSP Transforms.** Special issue, Proceedings of the IEEE 93(2), 2005.



Spiral Approach

Spiral: Automating Library Tuning

Traditionally





Electrical & Computer

Spiral's Formal Framework

Transform = Matrix-vector multiplication

Example: Discrete Fourier transform (DFT)

Fast algorithm = sparse matrix factorization = SPL formula Example: Cooley-Tukey FFT algorithm

$$\begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & j & -1 & -j \\ 1 & -1 & 1 & -1 \\ 1 & -j & -1 & j \end{bmatrix} = \begin{bmatrix} 1 & \cdot & 1 & \cdot \\ \cdot & 1 & \cdot & 1 \\ 1 & \cdot & -1 & \cdot \\ \cdot & 1 & \cdot & -1 \end{bmatrix} \begin{bmatrix} 1 & \cdot & \cdot & \cdot \\ \cdot & 1 & \cdot & \cdot \\ \cdot & \cdot & 1 & \cdot \\ \cdot & \cdot & \cdot & j \end{bmatrix} \begin{bmatrix} 1 & 1 & \cdot & \cdot \\ 1 & -1 & \cdot & \cdot \\ \cdot & \cdot & 1 & 1 \\ \cdot & \cdot & 1 & -1 \end{bmatrix} \begin{bmatrix} 1 & \cdot & \cdot & \cdot \\ \cdot & \cdot & 1 & \cdot \\ \cdot & \cdot & 1 & -1 \end{bmatrix} \begin{bmatrix} 1 & \cdot & \cdot & \cdot \\ \cdot & \cdot & 1 & \cdot \\ \cdot & \cdot & 1 & -1 \end{bmatrix} \begin{bmatrix} 1 & \cdot & \cdot & \cdot \\ \cdot & \cdot & 1 & \cdot \\ \cdot & \cdot & 1 & -1 \end{bmatrix} \begin{bmatrix} 1 & \cdot & \cdot & \cdot \\ \cdot & \cdot & 1 & \cdot \\ \cdot & \cdot & 1 & -1 \end{bmatrix} \begin{bmatrix} 1 & \cdot & \cdot & \cdot \\ \cdot & \cdot & 1 & \cdot \\ \cdot & \cdot & 1 & -1 \end{bmatrix} \begin{bmatrix} 1 & \cdot & \cdot & \cdot \\ \cdot & \cdot & 1 & \cdot \\ \cdot & \cdot & \cdot & 1 \end{bmatrix}$$

 $\mathrm{DFT}_4 = (\mathrm{DFT}_2 \otimes I_2) \mathsf{T}_2^4 (I_2 \otimes \mathrm{DFT}_2) \,\mathsf{L}_2^4$

Transforms and Breakdown Rules

DFT_n
$$\rightarrow$$
 (DFT_k \otimes I_m) Tⁿ_m(I_k \otimes DFT_m) Lⁿ_k, $n = km$
DFT_n \rightarrow P_n(DFT_k \otimes DFT_m)Q_n, $n = km$, gcd(k,m) = 1
DFT_p \rightarrow R^T_p(I₁ \oplus DFT_{p-1})D_p(I₁ \oplus DFT_{p-1})R_p, p prime
DCT-3
(1 \oplus 1) 1 n (DCT 2 (1 (4) \oplus DCT 2 (2 (4))
"Teaches" Spiral about existing algorithm knowledge
(~200 journal papers)
IMDCT_{2m} \rightarrow (J_m \oplus I_m \oplus I_m \oplus J_m)(([-1] \otimes I_m) \oplus ([-1] \otimes I_m)) J_{2m} DCT-4_{2m}
WHT_{2k} \rightarrow $\prod_{i=1}^{t}$ (I_{2k1+...+ki-1} \otimes WHT_{2ki} \otimes I_{2ki+1}+...+k_t), $k = k_1 + \dots + k_t$
DFT₂ \rightarrow F₂
DCT-2₂ \rightarrow diag(1, 1/ $\sqrt{2}$) F₂
DCT-4₂ \rightarrow J₂R_{13π/8}
Base case rules

Teaches Spiral about FFT algorithms

One Approach for all Types of Parallelism

- Multithreading (Multicore)
- Vector SIMD (SSE, VMX/Altivec,...)
- Message Passing (Clusters, MPP)
- Streaming/multibuffering (Cell)
- Graphics Processors (GPUs)
- Gate-level parallelism (FPGA)
- HW/SW partitioning (CPU + FPGA)

 $\mathbf{I}_p \otimes_{\parallel} A_{\mu n}, \quad \mathbf{L}_m^{mn} \bar{\otimes} \, \mathbf{I}_{\mu}$ $A \widehat{\otimes} \mathbf{I}_{\nu} \quad \underbrace{\mathbf{L}_{2}^{2\nu}}_{i \in 2}, \quad \underbrace{\mathbf{L}_{\nu}^{2\nu}}_{i \in 2}, \quad \underbrace{\mathbf{L}_{\nu}^{2\nu}}_{i \in 2}$ $\mathbf{I}_p \otimes_{\parallel} A_n, \quad \underbrace{\mathbf{L}_p^{p^2} \bar{\otimes} \mathbf{I}_{n/p^2}}_{\text{all-to-all}}$ $\mathbf{I}_n \otimes_2 A_{\mu n}, \quad \mathbf{L}_m^{mn} \bar{\otimes} \mathbf{I}_{\mu}$ n-1 $\prod A_i, \quad A_n \widehat{\otimes} \mathbf{I}_w, \quad P_n \otimes Q_w$ i=0 $n-1^{\mathsf{ir}}$ $\prod_{i=0} A, \quad \mathbf{I}_s \tilde{\otimes} A, \quad \underbrace{\mathbf{L}_n^m}_{\text{bram}}$ i = 0 $\underline{A_1}, \underline{A_2}, \underline{A_3},$ A_4 fpqa

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Translating a Formula into Code

Rewriting Input:

DFT₈ double

Output =

OL Formula: $(\mathsf{DFT}_2 \otimes I_4) T_4^8 (I_2 \otimes ((\mathsf{DFT}_2 \otimes I_2) T_2^4 (I_2 \otimes \mathsf{DFT}_2) L_2^4)) L_2^8$

f10 = 0.3826834323650898 * f0; f11 = (-0.9238795325112867) * f2;

y[3] = f10 + f11;





Synthesizing General Size Libraries

Input:

- **Transform**: DFT_n
- Algorithms: $DFT_{km} \rightarrow (DFT_k \otimes I_m)T_m^{km}(I_k \otimes DFT_m)L_k^{km}$ $DFT_2 \rightarrow \begin{bmatrix} 1 & 1\\ 1 & -1 \end{bmatrix}$
- Vectorization: 2-way SSE
- Threading: Yes

Output:

- Optimized library (10,000 lines of C++)
- For general input size (not collection of fixed sizes)
- Vectorized
- Multithreaded
- With runtime adaptation mechanism
- Performance competitive with hand-written code





Spiral: Library Generation

MPI-Friendly Global FFT Algorithm

- Experimental Results
- Summary

FFT needs Local FFTs and Global Transposes



FFTs along rows and columns of distributed square matrix



Linear Memory vs. Tiled Memory

Column FFTs: Need contiguous columns



Requires MPI all-to-allv, explicit copy, or FFT on tiled memory



MPI All-to-all "Friendly" Six Step FFT



Standard batch FFT library (on 1D contiguous memory) Specialized node FFT library: batch FFT+twiddles on 2D tiled memory Standard MPI all-to-all on contiguous data Node-local pre-processing (data scrambling)

SIMD Vectorization for FFT

 $\mathbf{DFT}_{mn} \rightarrow \left(\mathbf{I}_{\underline{mn}} \otimes \mathbf{L}_{\nu}^{2\nu}\right) \left(\overline{\mathbf{DFT}_{m} \otimes \mathbf{I}_{\underline{n}}} \otimes \mathbf{I}_{\nu}\right) \overline{\mathsf{T}}_{n}^{mn}$

Standard FFT

 $\operatorname{DFT}_{mn} o (\operatorname{DFT}_m \otimes \operatorname{I}_n) \mathsf{T}_n^{mn} (\operatorname{I}_m \otimes \operatorname{DFT}_n) \mathsf{L}_m^{mn}$

Vectorized arithmetic Data reorganization (requires architecture specific vetorization)

Automatic formula rewriting

Short Vector FFT for v-way vector instructions

Only 3 permutations require architecture-specific vectorization: $\mathbf{L}_{2}^{2\nu}$, $\mathbf{L}_{\nu}^{2\nu}$, $\mathbf{L}_{\nu}^{\nu^{2}}$ Works for any N=mn with $v^{2}|N$

 $\left(\mathbf{I}_{\frac{m}{\nu}}\otimes\left(\mathsf{L}_{\nu}^{2n}\otimes\mathbf{I}_{\nu}\right)\left(\mathbf{I}_{\frac{2n}{\nu}}\otimes\mathsf{L}_{\nu}^{\nu^{2}}\right)\left(\mathbf{I}_{\frac{n}{\nu}}\otimes\mathsf{L}_{2}^{2\nu}\otimes\mathbf{I}_{\nu}\right)\left(\overline{\mathbf{DFT}}_{n}\otimes\mathbf{I}_{\nu}\right)\right)\left(\mathsf{L}_{\frac{m}{\nu}}^{\frac{mn}{\nu}}\otimes\mathsf{L}_{2}^{2\nu}\right)$

F. Franchetti, M. Püschel: **"Short Vector Code Generation for the Discrete Fourier Transform,"** In Proceedings of the 17th International Parallel and Distributed Processing Symposium (IPDPS '03), pages 58-67

F. Franchetti, S. Kral, J. Lorenz, C. W. Ueberhuber: "Efficient Utilization of SIMD Extensions," Proceedings of the IEEE Special Issue on "Program Generation, Optimization, and Adaptation," Vol. 93, No. 2, 2005, pages 409-425



Rewriting for SMP Parallelization

$$\underbrace{\operatorname{DFT}_{mn}}_{\operatorname{smp}(p,\mu)} \rightarrow \underbrace{\left((\operatorname{DFT}_{m} \otimes \operatorname{I}_{n})\operatorname{T}_{n}^{mn}(\operatorname{I}_{m} \otimes \operatorname{DFT}_{n})\operatorname{L}_{m}^{mn}\right)}_{\operatorname{smp}(p,\mu)} \\
\cdots \\
\rightarrow \underbrace{\left(\operatorname{DFT}_{m} \otimes \operatorname{I}_{n}\right)}_{\operatorname{smp}(p,\mu)} \underbrace{\operatorname{T}_{n}^{mn}}_{\operatorname{smp}(p,\mu)} \underbrace{\left(\operatorname{I}_{m} \otimes \operatorname{DFT}_{n}\right)}_{\operatorname{smp}(p,\mu)} \underbrace{\operatorname{L}_{m}^{nm}}_{\operatorname{smp}(p,\mu)} \\
\cdots \\
\rightarrow \left((\operatorname{L}_{m}^{mp} \otimes \operatorname{I}_{n/p\mu}) \overline{\otimes} \operatorname{I}_{\mu}\right) \left(\operatorname{I}_{p} \otimes_{\parallel} (\operatorname{DFT}_{m} \otimes \operatorname{I}_{n/p})\right) \left((\operatorname{L}_{p}^{mp} \otimes \operatorname{I}_{n/p\mu}) \overline{\otimes} \operatorname{I}_{\mu}\right) \\
\left(\underbrace{\bigoplus_{i=0}^{p-1} \operatorname{T}_{n}^{mn,i}}_{i=0} \right) \left(\operatorname{I}_{p} \otimes_{\parallel} (\operatorname{I}_{m/p} \otimes \operatorname{DFT}_{n})\right) \left(\operatorname{I}_{p} \otimes_{\parallel} \operatorname{L}_{m/p}^{mn/p}\right) \left((\operatorname{L}_{p}^{pn} \otimes \operatorname{I}_{m/p\mu}) \overline{\otimes} \operatorname{I}_{\mu}\right)$$

Two types of base cases: load-balanced, no false sharing

$$\mathbf{I}_p \otimes_{\parallel} A_{\mu n} \quad \bigoplus_{i=0}^{p-1} || \mathsf{T}_n^{mn,i} \quad P_n \bar{\otimes} \, \mathbf{I}_{\mu}$$

F. Franchetti, Y. Voronenko, M. Püschel: **"FFT Program Generation for Shared Memory: SMP and Multicore,"** In Proceedings Supercomputing (SC), 2006.



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Electrical & Computer

BlueGene/P Intrepid at ANL

- 40 racks of Blue Gene/P
- 1024 nodes per rack
- one 850 MHz quad-core processor and 2GB RAM per node
- Double FPU SIMD
- 3D Torus network







HPC Challenge Global FFT on BlueGene/P

1D Global FFT

performance [Gflop/s]



6.4 Tflop/s FFTE baseline: 5 Tflop/s

G. Almási, B. Dalton, L. L. Hu, F. Franchetti, Y. Liu, A. Sidelnik, T. Spelce, I. G. Tānase, E. Tiotto, Y. Voronenko, X. Xue:
2010 IBM HPC Challenge Class II Submission. Winner of the 2010 HPC Challenge Class II Award (Most Productive System).



Double FPU and Multicore Performance

DFT, double precision, XL C compiler

performance [Mflop/s]



DFT, double precision, XL C compiler

performance [Mflop/s]



Single BlueGene/L CPU at 700 MHz

IBM T. J. Watson Research Center

SIMD vectorization

Single BlueGene/P node (4 CPUs) at 850 MHz Argonne National Laboratory

SIMD vectorization + multi-threading

F. Gygi, E. W. Draeger, M. Schulz, B. R. de Supinski, J. A. Gunnels, V. Austel, J. C. Sexton, F. Franchetti, S. Kral,
C. W. Ueberhuber, J. Lorenz: Large-Scale Electronic Structure Calculations of High-Z Metals on the BlueGene/L Platform.
In Proceedings of Supercomputing, 2006. Winner of the 2006 Gordon Bell Prize (Peak Performance Award).

J. Lorenz, S. Kral, F. Franchetti, C. W. Ueberhuber: **Vectorization Techniques for the Blue Gene/L double FPU.** IBM Journal of Research and Development, Vol. 49, No. 2/3, 2005.

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Towards BlueGene/Q: QPX Code Generation

```
void dft16(double *Y, double *X) {
    const vector4double C1 = (vector4double) (1.0, 0.70710678118654757, 0.0, (-0.70710678118654757));
    const vector4double C2 = (vector4double) (0.0, 0.70710678118654757, 1.0, 0.70710678118654757);
    const vector4double C3 = (vector4double) (1.0, 0.92387953251128674, 0.70710678118654757, 0.38268343236508978);
    const vector4double C4 = (vector4double) (0.0, 0.38268343236508978, 0.70710678118654757, 0.92387953251128674);
    const vector4double C5 = (vector4double) (1.0, 0.38268343236508978, (-0.70710678118654757), (-0.92387953251128674));
    const vector4double C6 = (vector4double) (0.0, 0.92387953251128674, 0.70710678118654757, (-0.38268343236508978));
    vector4double a90, a91, a92, a93, a94, a95, s139, s140, s141, s142, s143, s144, s145, s146, s147, s148,...,;
    vector4double *a89, *a96;
    a89 = ((vector4double *) X);
    s139 = a89[0];
    s140 = a89[1];
    a90 = vec gpci(0xa60);
                                                                                                   qr12=qr13,qr4,fcr
                                                   78| 00014C qvfmul
                                                                        118D0132
                                                                                   1
                                                                                         OVFMUL
    s141 = vec perm(s139, s140, a90);
                                                   79| 000150 qvfmul
                                                                        11AD0172
                                                                                                   qr13=qr13,qr5,fcr
                                                                                   1
                                                                                         OVFMUL
    a91 = vec gpci(0xef2);
                                                   84| 000154 qvfmul
                                                                        11CF01B2
                                                                                   1
                                                                                         QVFMUL
                                                                                                   qr14=qr15,qr6,fcr
    s142 = vec perm(s139, s140, a91);
                                                   85| 000158 qvfmul
                                                                        11EF01F2
                                                                                                   qr15=qr15,qr7,fcr
                                                                                   1
                                                                                         OVFMUL
    s143 = a89[4];
                                                   86| 00015C qvfmul
                                                                        12110232
                                                                                   1
                                                                                         QVFMUL
                                                                                                   qr16=qr17,qr8,fcr
    s144 = a89[5];
                                                   87| 000160 qvfmul
                                                                        12310272
                                                                                   1
                                                                                         OVFMUL
                                                                                                   gr17=gr17,gr9,fcr
    s145 = vec perm(s143, s144, a90);
                                                   60| 000164 qvfperm 1253B00C
                                                                                                   qr18=qr19,qr22,qr0
                                                                                   1
                                                                                         OVFPERM
                                                                                                   qr19=qr19,qr22,qr1
                                                   62| 000168 qvfperm 1273B04C
                                                                                   1
                                                                                         QVFPERM
    s170 = vec perm(s158, s162, a95);
                                                   65| 00016C qvfperm 12F4A80C
                                                                                                   qr23=qr20,qr21,qr0
                                                                                   1
                                                                                         QVFPERM
    s171 = vec sub(vec mul(C1, s165), vec mul(
                                                   66| 000170 qvfperm 1294A84C
                                                                                                   gr20=gr20,gr21,gr1
                                                                                   1
                                                                                         QVFPERM
    s172 = vec add(vec mul(C2, s165), vec mul(
                                                                                                   gr21=gr18,gr23,gr3
                                                   72| 000174 gvfperm 12B2B8CC
                                                                                   1
                                                                                         OVFPERM
    t145 = vec add(s163, s171);
                                                   73| 000178 gvfperm 12D3A08C
                                                                                                    qr22=qr19,qr20,qr2
                                                                                   1
                                                                                         OVFPERM
    t146 = vec add(s167, s172);
                                                   74| 00017C qvfperm 1073A0CC
                                                                                   1
                                                                                         QVFPERM
                                                                                                   qr3=qr19,qr20,qr3
    t147 = vec sub(s163, s171);
                                                   79| 000180 qvfnmadd 10B62B3E
                                                                                   1
                                                                                         OVFNMADD
                                                                                                   qr5=qr5,qr22,qr12,fcr
    t148 = vec sub(s167, s172);
                                                   80| 000184 qvfmadd 1096237A
                                                                                         OVFMADD
                                                                                                   qr4=qr4,qr22,qr13,fcr
                                                                                   1
    s173 = vec sub(vec mul(C3, s164), vec mul(
                                                   85| 000188 gvfnmadd 10F53BBE
                                                                                         OVFNMADD
                                                                                                   qr7=qr7,qr21,qr14,fcr
                                                                                   1
    s174 = vec add(vec mul(C4, s164), vec mul(
                                                   86| 00018C qvfmadd 10D533FA
                                                                                         OVFMADD
                                                                                                    qr6=qr6,qr21,qr15,fcr
                                                                                   1
    s175 = vec sub(vec mul(C5, s166), vec mul(
                                                   87| 000190 qvfnmadd 11234C3E
                                                                                   1
                                                                                         QVFNMADD
                                                                                                   qr9=qr9,qr3,qr16,fcr
    s176 = vec add(vec mul(C6, s166), vec mul(
                                                   88| 000194 qvfmadd 1063447A
                                                                                         OVFMADD
                                                                                                   qr3=qr8,qr3,qr17,fcr
                                                                                   1
    t149 = vec add(s173, s175);
                                                   70| 000198 qvfperm 1112B88C
                                                                                                    qr8=qr18, qr23, qr2
                                                                                   1
                                                                                         QVFPERM
                                                   75| 00019C gvfperm 104A588C
                                                                                   1
                                                                                         OVFPERM
                                                                                                   qr2=qr10,qr11,qr2
    a96[3] = s182;
                                                                                                   qr10=qr8,qr5,fcr
                                                   81| 0001A0 qvfadd
                                                                        1148282A
                                                                                   1
                                                                                         QVFADD
    s183 = vec perm(t159, t160, a92);
                                                                                                   qr11=qr2,qr4,fcr
                                                   82| 0001A4 qvfadd
                                                                        1162202A
                                                                                   1
                                                                                         QVFADD
    a96[6] = s183;
                                                   89| 0001A8 qvfadd
                                                                        1187482A
                                                                                                   qr12=qr7,qr9,fcr
                                                                                   1
                                                                                         OVFADD
    s184 = vec perm(t159, t160, a93);
                                                   90| 0001AC qvfadd
                                                                        11A6182A
                                                                                                   qr13=qr6,qr3,fcr
                                                                                   1
                                                                                         QVFADD
    a96[7] = s184;
                                                   83| 0001B0 qvfsub
                                                                        10A82828
                                                                                   1
                                                                                         OVFSUB
                                                                                                   qr5=qr8,qr5,fcr
}
```



First BlueGene/Q Performance Results

Spiral FFT: BlueGene/Q Single Thread @ 1.6 GHz

performance [Mflop/s]



problem size



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Summary

- Node FFT libraries are tuned for linear, contiguous data But 2D abstraction required for the transpose in the FFT
- MPI all-to-all (transpose) is suboptimal on linearized 2D data
 2D tiles are not contiguous in memory
- Solution: Special FFT functions that work on 2D tiles
 Same FFT performance as linear memory, full MPI performance
- Spiral auto-generates specialized node libraries
 As fast as ESSL and FFTW, but works on 2D tiled memory
- Performance results on ANL's BlueGene/P (Intrepid) Performance improvement from 5 Tflop/s to 6.4 Tflop/s



More Information: www.spiral.net www.spiralgen.com