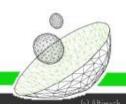
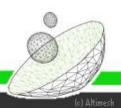
Altimesh Hybridizer™

Enabling Accelerators in .Net and more

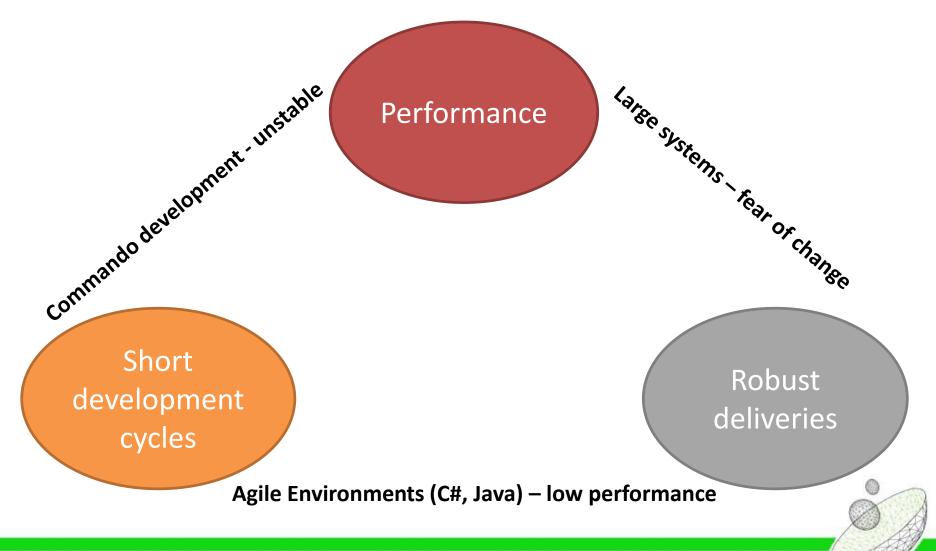


So many platforms, so few experts...

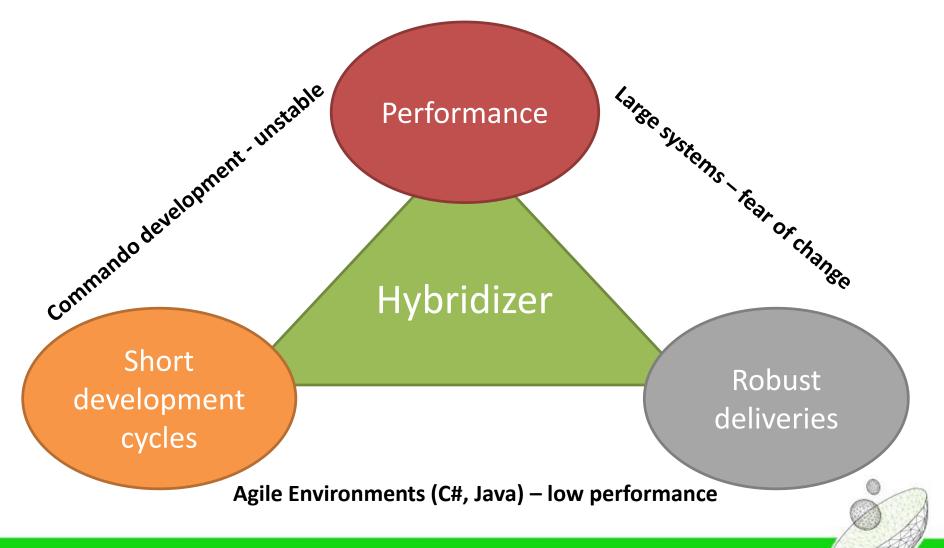
WHY THE HYBRIDIZER ?



Software development teams accommodate external constraints



Software development teams accommodate external constraints



Why the Hybridizer?

- Develop in a managed environment (C#/Java)
 - Fast developments (fast compile time, edit and continue...)
 - Testing and refactoring ecosystem
 - Glitch-safe memory management
 - Embrace Change

HIGHER PRODUCTIVITY REDUCE TCO OF APPLICATION DEVELOPMENT

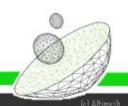
- Benefit from manycore architectures
 - With single version of the source code
 - Obtain first grade performances (use >80% of peak)
 - Fine tune optimizations with debugger/profiler integration
 - Variety of execution platforms
 - Change execution target without rewriting code

MORE EFFICIENT HARDWARE REDUCE TCO OF DATA CENTERS

IT spending : approx 30% in hardware and approx 20% in application development (Source : Gartner)

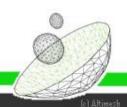
What the Hybridizer is not

- Hybridizer is not a magic wand: some hints have to be given
 - Memory management is performed either in a naïve way, or needs to be done by hand
 - Memory level usages need to be defined
 - Some execution behaviors cannot be guessed
- Work distribution needs to be explicit
 - Loop parallelization is not automatic
 - Concurrency needs to be handled by hand
 - Code patterns need to be changed from sequential to parallel

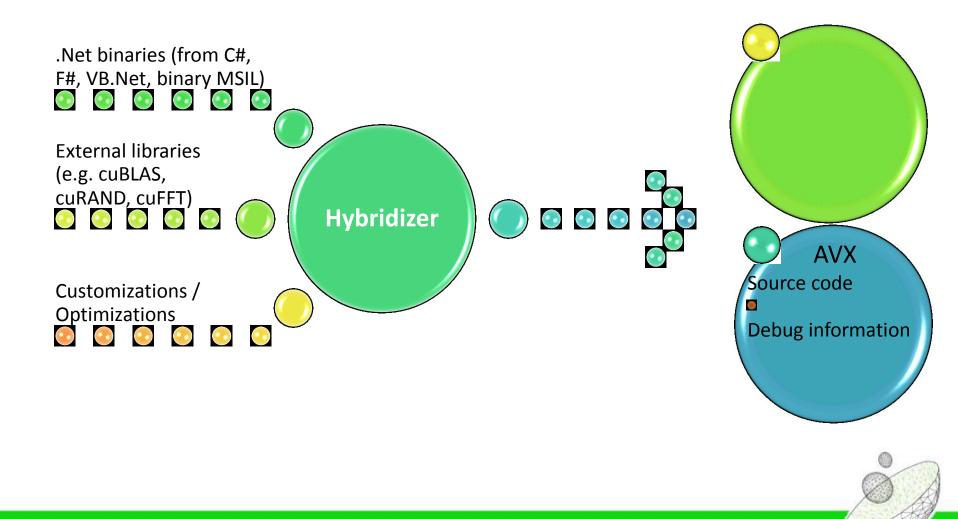


What the Hybridizer does

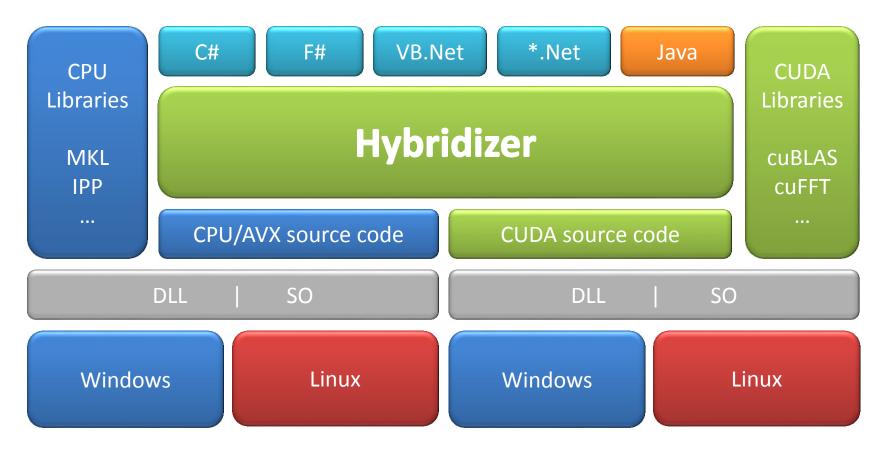
- Generates source code from binaries
 - Input is dot net binary (C#, VB.Net, Managed C++, other MSIL languages, Java)
 - Output is source code that can be used in various environments (plain C/C++ projects, CUDA projects, Windows/Linux, DotNet / Java runtimes)
- Supports the following language constructs
 - Virtual functions, generic types
 - Use of external libraries with seamless integration (e.g. CUBLAS, CURAND for CUDA environment) user-extensible
 - Perform debugging within original source code say C#. (this feature needs pdb)

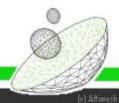


What the Hybridizer does

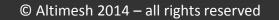


Software Stack



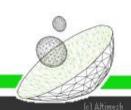


Flexibility of managed environments, 80%+ usage of hardware HYBRIDIZER IN ACTION



Basic features

- CUDA-style work distribution
- Seamless integration (attribute-based)
- Extensibility:
 - Usage of existing functions (erfc, hand-written, …)
 - Usage of external libraries (cuBLAS, cuRand, ...)
 - Printf available using Console.Out / System.out
 - System.Math maps to <cmath> functions
- Customizable memory management
 - Zero copy arrays
 - Resident array (single copy for multiple kernel calls)



Performances bandwidth & double precision





KEPLER – K20C

i7-3610 QM - AVX

Compute	GCFLOPS	usage	GFLOPS	usage
whetstone	541	92%	43.2	87%
peak	587	-	49.6	-

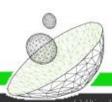
NOTE : Whetstone is our internal naive reproduction of the basic Whetstone test operating on doubles

Memory	GB/s	usage	GB/s	usage
stream	162	78%	20.4	80%
peak	208	-	25.6	-

NOTE : FMA IS COUNTED AS 1 FLOP HENCE REDUCING PEAK TO HALF 1 CFLOP = 1^{e} 9 FMA DP – MEASURES ON K20C

1GB/s = 1^e9bytes /s here – MEASURES ON K20C – ECC OFF – CUDA 5.0

CORE i7-3610 QM (HT activated) @ 2.3 GHz TurboBoost @ 3.1 GHz (observed using monitor) AVX - OpenMP with 8 threads (4 cores)



Virtual Functions

Support for Virtual functions

Function overriding : using inheritance

Use of Interfaces (single or multiple interfaces on classes or structs)

Native integration: no dedicated code needed.

```
public interface ISimple
   int f();
public class Answer : ISimple
{
    [Kernel]
    public int f()
        return 42 ;
public class Other : ISimple
    [Kernel]
    public int f()
        return 12;
    }
```

Performances virtual functions



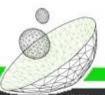
KEPLER – K20C

Expm1 ²	GFLOPS	GCFLOPS	usage
Local	975	538	92%
Dispatch	478	263	45%
peak	1174	587	-

Virtual functions suffer significant performance penalty

NOTE : FMA IS COUNTED AS 1 FLOP HENCE REDUCING PEAK TO HALF 1 GCFLOP = 1^{e} 9 FMA DP – MEASURES ON K20C

²: EXPM1 IS A TAYLOR EXPANSION OF EXP(X)-1: (1 ADDITION, 13 FUSED MULTIPLY ADD, 2 MULTIPLY)



Improve performances with Generics

Generics can be converted to Templates

Generic constraints lead to usage of template functions (no virtual call)

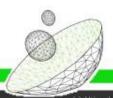
Performances are very close to performance obtained with local functions (no inheritance/interface)

```
[HybridTemplateConcept]
public interface IMyArray {
    double this[int index] { get; set; }
}
```

{

[HybridRegisterTemplate(Specialize=typeof(MyAlgorithm<MyArray>))]
public struct MyArray : IMyArray

```
double[] _data;
[Kernel] public double this[int index] {
    get { return _data[index]; }
    set { _data[index] = value; }
  }
}
public class MyAlgorithm<T> where T : struct, IMyArray
{
    T a, b;
[Kernel] public void Add(int n) {
    for (int k = threadIdx.x + blockDim.x * blockIdx.x;
        k < n; k += blockDim.x * gridDim.x)
        a[k] += b[k];
  }
}
```



Performances generics



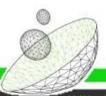
KEPLER – K20C

Expm1 ²	GFLOPS	GCFLOPS	usage
Local	975	538	92%
Dispatch	478	263	45%
Generics	985	544	93%
peak	1174	587	-

Mapping generics to templates restores performances

NOTE : FMA IS COUNTED AS 1 FLOP HENCE REDUCING PEAK TO HALF 1 GCFLOP = 1^{e_9} FMA DP – MEASURES ON K20C

²: EXPM1 IS A TAYLOR EXPANSION OF EXP(X)-1: (1 ADDITION, 13 FUSED MULTIPLY ADD, 2 MULTIPLY)



Performances single precision





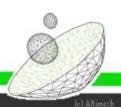
	KEPLER — 1536 cores @ 1006 GF		MAXWELL — GTX 750Ti 640 cores @ 1.085 GHz = 694.4 GCFLOPS				
Expm1 ² benchmark	GCFLOPS	Usage	GCFLOPS	usage			
Local	953.6 - 1234	61% - 80%	450.8 - 660.0	65% - 95%			
Dispatch	392.3 - 632.7	25% - 41%	171.0 - 343.2	25% - 49%			
Template	958.1 - 1069	62% - 69%	440.3 - 539.3	63% - 78%			
peak	1545	-	694.4	-			
	without - <i>with</i> vectorization		without - <i>with</i> vectorization				

NOTE : FMA IS COUNTED AS 1 FLOP HENCE REDUCING PEAK TO HALF : 1 GCFLOP = 1°9 FMA SP

²: EXPM1 IS A TAYLOR EXPANSION OF EXP(X)-1: (1 ADDITION, 13 FUSED MULTIPLY ADD, 2 MULTIPLY)

Developers perspective

INTEGRATION WITH VISUAL STUDIO



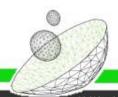
Debugging session using NSIGHT for Visual Studio [2010]

					·	Espion 1 ×				
🛠 Hybridizer.Samples.Gene	rics.MapReduce.Disc	:o 👻 🔍 F	(int i)		•	Nom		Valeur		Туре
{					4	🗧 🔷 rate		0.026148	87155552715	double
public class	Discount : IMap	Operator				🖉 🤣 pse	lf->rates[i]	0.026148	87155552715	_device_ double&
{							lf->nbSims	0x00011	-	_device_ int
public in						😑 🥥 thre	adIdx		0000000, y = 0x/ o	const uint3
	<pre>ouble[] values;</pre>					🧳 🖉		0x00000		unsigned int
public do	<pre>ouble[] dates;</pre>					. 🔍 🧹 🖉		0x00000		unsigned int
	nt nbSims;				-	🧳 I 🖉	Z	0x00000	000 i	unsigned int
	<pre>buble[] rates;</pre>									
	<pre>ouble[] output;</pre>									
{ doubl doubl for ({	<pre>bid F(int i) le result = 0.0; le rate = rates[(int k = 0; k < result += values</pre>	i]; count; +	++k) //stem.Math.Exp(-ra	ate * da	ates[k]);					
}	ut[i] = result;									
}										
<pre>} public class { </pre>										
<pre>} } public class { 00 % < </pre>	Pricer				Þ					
<pre>}</pre>	Pricer M									
<pre>} public class { 00 % < <</pre>	Pricer III	Filter								
<pre>} public class { public class { public class } UDA Info 1 Warps </pre>	Pricer III		Warp Index threadId	ix .	PC	Active Mask	Status	Exception	Exception Detail	s Global Status Details
<pre>} public class f public class f uDA Info 1 Warps </pre>	Pricer III Grid ID blockidx			× 0, 0)			Status Breakpoint		Exception Detail	s Global Status Details None
<pre>} public class { public class { public class } public class } UDA Info 1 UDA Info 1 Current Frozen CUcontext</pre>	Pricer 		Warp Index threadId	0, 0)		0xffffffff		None		
public class public class f public class f CUDA Info 1 Warps Current Frozen CUcontext	Pricer 	0, 0)	Warp Index threadId: 0 (0,	0, 0) 0, 0)	0x00050bf8	0xffffffff 0xfffffffff	Breakpoint	None None	None	None
	Pricer 	0, 0) 0, 0)	Warp Index threadId: 0 (0, 1 (32,	0, 0) 0, 0) 0, 0)	0x00050bf8 0x00050bf8	0xffffffff 0xffffffff 0xffffffff	Breakpoint Breakpoint	None None None	None	None None

Breakpoint is set and hit in C# code

Values can be explored using Watch

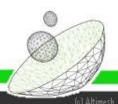
Execution is on GPU



Profiling session using NSIGHT for Visual Studio [2010]

Compilation with line-info allows dot net source-level profiling (also in release mode)

CUDA Source View												
Discounter	Grid Dim: {140, :			Block	Dim: (512, 1, 1)			Duration: 9636.448 µs			Compute Capability: 3.0	
mapreducesample.cs View: Sc	urce and PTX 🔹 🔲 📃	High to Low: 🛕 👻 Li	ow to High: 🔼 🔹									
ų t				4	1 1 1	Ł		1				
		Thread Threa		Memory ,	L1 Memory Above	L*-	Line Source		Teste at	Thread Threa	chi Branc Memory Type Access Access Ideal	L1 L2
Source		Executed Executed Efficie	Branche Branc Taken Efficie Memory Type	e Access	Access Size Ideal	TI	Line Source		Execute	Instruction Execu Taken	chi Branc n Efficie Memory Type Acces Access Ideal Type Size Transact	Tran Tra
public double[] output;		Executed Emer		Type	Access Size Ideal Transa		6776			Executed	Transact	OVE OV
<pre>public double[] output;</pre>							6777 add.s32	%r86, %r91, 44 ;				
							6778					
[Kernel] public void F(int i)							6779 1d.u32	%r12, [%r86+-36];	2240	71680 100.0	Generic, Global Load Size32 0	1.0 0.3
public vola # (int 1)						-	6780 mov.f64	\$fd62, 0d0000000000000;	4480	143360 100.0		
double result = 0.0;							6781 mov.u32	%r89, 0;	2240	71680 100.0		
double rate = rates[i];							6782					
<pre>for (int k = 0; k < count;</pre>	++*)	338240 10823680 100.0	Generic, Glob	a bool le	Size32		6783 BB43_6:					
2 {		176960 5662720 97.5		2000 2	52052	_	6784 shl.b32	%r44, %r89, 3;				
	ystem.Math.Exp(-rate * dates[k]);	1019200 32614400 100.0	Generic, Glob	a Load S	Size32, Size64 -33600		6785 add.s32	%r45, %r11, %r44;	168000	5376000 100.0		
1			ouncine, one				6786 6787 1d.£64	%fd5, [%r45];		5376000 100.0	Generic Global Load Size64 -168000	
output[i] = result;							6788 add.s32	%r46, %r12, %r44;			Generic, Global Load Size64 -168000	0.5 0.1
5 }							6789	0110, 0112, 0111,	100000	5376000 100.0		
7 }							6790 1d. £64	%fd19, [%r46];	168000	5376000 100.0	Generic Global Load Size64 -168000	05.01
8							6791 mul.f64	\$fd6, \$fd19, \$fd3;		5376000 100.0	Generic, Giobai Loadi Sizeo4 -106000	0.5 0.1
9 public class Pricer							6792		100000	3370000 100.0		
5 - {						-	6793 {					
						•						
Discounter<<<140,512>>> [CUDA Launch]	CUDA											
Device Launches	Name Discounter											
Call Graph	Mangled Name Discounter											
Discounter [CUDA Kernel]	Signature Discounter											
	All Launches of Kernel "Discounter"											
F [41] [CUDA Module]	Drag a column header and drop it here to group by	that column										
 Experiment Results 							Cache	Shared Memory				
 CUDA Occupancy 	Grid Block Laur Dimensions V Dimensions V Laur	nch V Start Time V En	Time T Duration	Active Warp	Occupancy 🖓	Registers	Configuration V	Configuration V				
CUDA Source Profiler				Time(µs)			Executed	Executed				
- CUDA Instruction Count	1 {140, 1, 1} {512, 1, 1} Hos	t 738,598.386 7	48,234.834 9,636.448		100.00 %	2	6 PREFER_SHARED	FOUR_BYTE_BANK_SIZE				
CUDA Divergent Branch												
CUDA Memory Transactions												

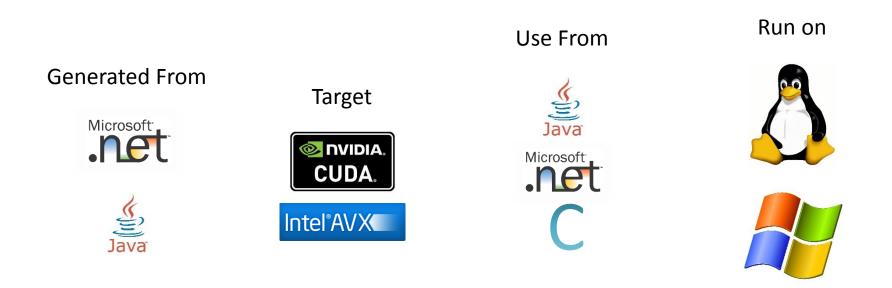


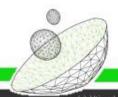
Profiling session using VTune Amplifier for Visual Studio [2010]

🦉 Ho	otspots - Hotspots 🗶 🧿							
⊲ 💮	Analysis Target 🕺 Analysis Type 📟 Collection Log 🕅 Summary 💊 Bo	ottom-up 😽 Top-down 1	ſree	🔣 Tasks ar	nd Frame	s 🔓 GFlops.cs 🕺		
Sour	ce Assembly 🔢 📰 🖓 🎲 換 🗄							
Sour	Source	CPU Time 🛸		Code Lo	Sour	Assembly	CPU Time	* ^
149	public class MultiExpm1 : IMapOperator			0x4033f9	165	vmulpd ymm7, ymm2, ymm6	2.004ms	
150	{			0x4033fd	165	vaddpd ymm3, ymm7, ymm1		
151	double[] input;			0x403401	165	vmulpd ymm7, ymm3, ymm6	1.004ms	
152	double[] output;			0x403405	165	vmovupd ymm6, ymmword ptr [0x40b260]	1.968ms	
153				0x40340d	165	vaddpd ymm3, ymm7, ymm6		
154	<pre>public double[] Input { get { return input; } set { input</pre>			0x403411	165	vmovupd ymm7, ymmword ptr [ecx+0x40fa20]	1.996ms	
155	<pre>public double[] Output { get { return output; } set { output</pre>			0x403419	165	vblendvpd ymm2, ymm2, ymm3, ymm7		
156				0x40341f	165	vmovupd ymm7, ymmword ptr [esp+0x7e0]	2.002ms	
157	double expm1(double x)			0x403428	165	vmovupd ymm3, ymmword ptr [esp+0x340]		
158	{			0x403431	165	vmovupd ymmword ptr [esp+0x3c0], ymm2		
159	/* 7.5 GFLOPS */			0x40343a	165	vmulpd ymm2, ymm3, ymm7	0.996ms	
160	double res = 15.0 + x;	77.519ms		0x40343e	165	vaddpd ymm2, ymm2, ymm1	2.992ms	
161	res = (res * x + 210.0) * x + 2730.0;	105.744ms		0x403442	165	vmulpd ymm7, ymm2, ymm7	1.971ms	
162	res = (res * x + 32760.0) * x + 360360.0;	78.677 ms		0x403446	165	vaddpd ymm2, ymm7, ymm6	4.004ms	
163	res = (res * x + 3603600.0) * x + 32432400.0;	67.963ms		0x40344a	165	vmovupd ymm7, ymmword ptr [ebx+0x40fa20]	1.000ms	
164	res = (res * x + 259459200.0) * x + 1816214400.0;	74.681ms		0x403452	165	vblendvpd ymm7, ymm3, ymm2, ymm7	1.997ms	
165	res = (res * x + 10897286400.0) * x + 54486432000.0;	85.372ms		0x403458	165	vmovupd ymm2, ymmword ptr [esp+0x800]	1.999ms	-
166	res = (res * x + 217945728000.0) * x + 653837184000.0;	71.847ms	-	0x403461	165	vmulpd ymm3, ymm5, ymm2		1
167	res = res * x + 1307674368000.0;	55.043ms		0x403465	165	vaddpd ymm3, ymm3, ymm1		
L68	return res * x * 7.6471637318198164759011319857881e-13	73.130ms		0x403469	165	vmulpd ymm2, ymm3, ymm2		
169	}	40.604ms		0x40346d	165	vaddpd ymm3, ymm2, ymm6	1.002ms	
170				0x403471	165	vmovupd ymm2, ymmword ptr [ebp+0x40fa20]	0.995ms	
171	[Kernel]			0x403479	165	vblendvpd ymm5, ymm5, ymm3, ymm2		
172	public void F(int i)			0x40347f	165	vmovupd ymm3, ymmword ptr [esp+0x820]	2.996ms	
173	{		Ξ	0x403488	165	vmovupd ymmword ptr [esp+0x3e0], ymm5		
L74	output[i] = expml(expml(expml(expml(expml(expml(expml)			0x403491	165	vmovupd ymm5, ymmword ptr [esp+0x360]	3.999ms	
175	}	12.017ms		0x40349a	165	vmulpd ymm2, ymm5, ymm3		
176	}			0x40349e	165	vaddpd ymm2, ymm1	1.993ms	
	Selected 1 row(s):	85.372m	5 +			Highlighted 68 row(s)	:	85.372ms +
		۰ III) ا				< III •		•

See line association between original sequential C# code and vectorized x86/AVX assembly instructions

Usages - runtimes - execution environments





"We have been using the Hybridizer for more than a year now with very satisfactory results. With **no prior knowledge of GPU programming**, we have been able to achieve **significant speedups in a large scale application** with unexcessive effort. Hybridizer enabled rapid integration of GPU within our development environment, with limited impact on a team of hundred programmers. It took nine months to a handful of developers to go from early testing to production on our first perimeter, and six more months to cover some of our most compute intensive calculations."

Régis FRICKER - GPU project leader at Société Générale Investment Banking

Florent.Duguet@altimesh.com
Guillaume.de-Roujoux@altimesh.com

THANK YOU

