# Timely Dataflow with Heterogeneous Systems

eg timely + arrayfire = win? Nat McAleese

# Heterogenous computing

Computing over a variety of hardware

### What is ArrayFire?

Free; general-purpose; open-source (kinda)

Targets parallel and massively-parallel architectures including CPUs, GPUs, and other hardware acceleration devices.

Used on devices from low-powered mobile phones to high-powered GPU-enabled supercomputers

And it has **rust** bindings!

# What is Timely?

"Timely dataflow is a low-latency cyclic dataflow computational model, introduced in the paper Naiad: a timely dataflow system. This project is an extended and more modular implementation of timely dataflow in Rust." [0]

[0] https://github.com/frankmcsherry/timely-dataflow

## Why is this worthwhile?

We should expect a latency / throughput trade-off - but you never really know 'till you measure!

It should be legitimately useful for people trying to do compute-bounded dataflow computations.

#### Work Plan

- Run some timely demos 🧹
- Run some arrayfire demos 🗸
- Pick benchmarks
- Build testbed
- Measure
- Extend!

<pre>nat@nat-xps-13 ~//naiad-gpu/src \$ RUST_BACKTRACE=1 cargo run Finished dev [unoptimized + debuginfo] target(s) in 0.0 secs</pre>		
Running `/ho	ome/nat/Dr	<pre>ropbox/part-3-coursework/large_scale/open-source/naiad-gpu/target/debug/naiad-gpu`</pre>
ArrayFire v3.5.1	(CPU, 64-	bit Linux, build 0a675e8)
[0] Intel: Intel(	R) Core(T	M) i5-2467M CPU @ 1.60GHz, 3271 MB, Max threads(4)
Info String:		hit linux huild On675n0)
AFRAYFIRE V3.5.1	(CPU, 04-	DIT LINUX, DUILO 000/DEX) TM\ i5 2467M CDL @ 1 60CHz 2271 MB Max throads(4)
Arravfire version	(3 5)	1)
Element-wise arit	hmetic	-/
a =>		
[5 3 1 1]		
0.6010 0.	7273	0.8704
0.1195 0.	4348	0.2977
0.2643 0.	9311	0.0250
0.3943 0.	5332	0.9039 A 1123
0.2201 0.	5552	0.1125
sin(a) + 1.5 =>		
[5 3 1 1]		
2.0654 2.	1649	2.2646
1.6192 1.	9212	1./933
1.7012 2.	6207	2.3139
1.7241 2.	0083	1.6120
a(seq(1,3,1), spa	in)	
	12.10	0.0077
0.1195 0.	4348	0.29//
0.2045 0.	1210	0.9509 A 0850
0.3345 0.	1210	0.5055
a(indices, seq(0, 2, 1))		
[3 3 1 1]		
0.1195 0.	4348	0.2977
0.2643 0.	9311	0.950
0.3945 0.	1210	0.9039
nat@nat-xps-13 ~/	/naiad	l-gpu/src \$
eq(1,3,1), span 3 1 1] 0.1195 0 0.2643 0 0.3945 0 ndices, seq(0, 3 1 1] 0.1195 0 0.2643 0 0.3945 0 @nat-xps-13 ~/	an) 4348 9311 1210 2, 1)) 4348 9311 1210 (/naiad	0.2977 0.9509 0.9859 0.2977 0.9509 0.9859

```
nat@nat-xps-13 ~/.../naiad-gpu/src $ cargo run
   Compiling naiad-gpu v0.1.0 (file:///home/nat/Dropbox/part-3-coursework/large scale/open-source/naiad-gpu)
warning: unused import: `Exchange`
 --> main.rs:4:42
    use timely::dataflow::operators::{Input, Exchange, Inspect, Probe};
4
                                            ******
  = note: #[warn(unused imports)] on by default
    Finished dev [unoptimized + debuginfo] target(s) in 11.20 secs
    Running `/home/nat/Dropbox/part-3-coursework/large scale/open-source/naiad-gpu/target/debug/naiad-gpu`
worker 0:
               hello 0
worker 0:
               hello 1
worker 0:
               hello 2
worker 0:
               hello 3
          hello 4
worker 0:
worker 0:
               hello 5
worker 0:
               hello 6
worker 0:
               hello 7
worker 0: hello 8
worker 0:
          hello 9
nat@nat-xps-13 ~/.../naiad-gpu/src $
```

#### **Planned Benchmarks**

Wordcount

**Streaming KMeans** 

MLP training?