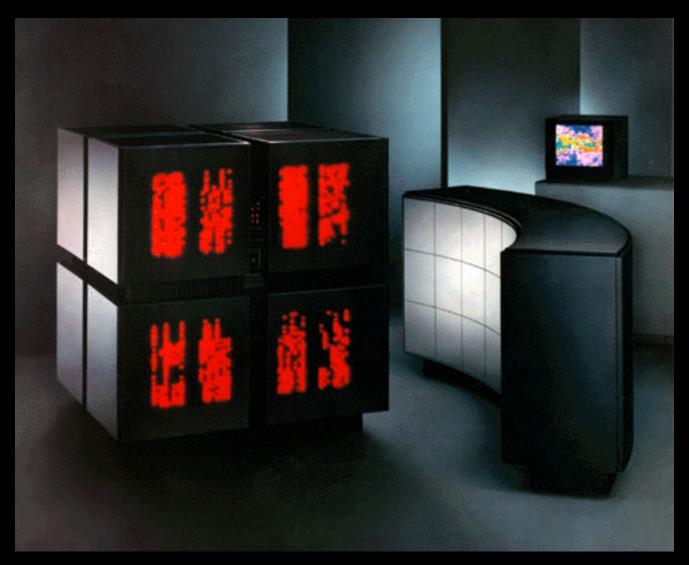




CATS: ALL YOUR BASE ARE BELONG TO US.



"Zero Wing", 1991





Connection Machine CM-2

Big Data: Facebook stats (August 2012)

- 2.5 Billion content items shared per day
- 2.7 Billion "Likes" per day
- 300 Million photos per day
- 500+ Terabytes new data ingested per day
- 105 Terabytes data processed every 30 minutes
- 100+ Petabytes in no-sql Hadoop storage



Disk is the new Tape Memory is the new Disk



Modern Cloud Service Model

Incoming Data
Streams



In-memory
Real Time Data
processing



Huge noSQL Storage and Analytics



The Manycore era is here now



1997: THE FIRST INTEL® TERAFLOP COMPUTER

consisted of:

9,298 INTEL PROCESSORS 72 SERVER CABINETS

and occupied:

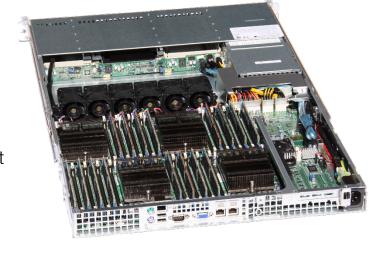
THE INTEL® XEON® PHI™ COPROCESSOR will provide: and occupy:

1 PCle 1 TERAFLOP OF PERFORMANCE | SLOT (intel) inside Xeon Phi

~\$4.2K

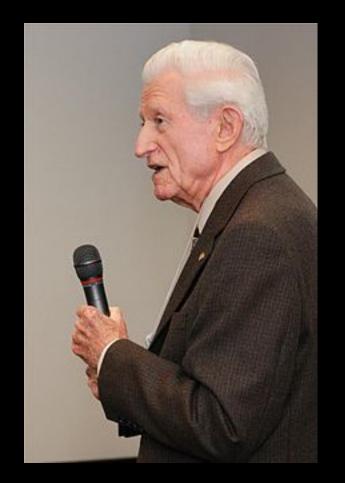
AMD Opteron family 15h 64 cores: 16 per chip x 4 sockets Streaming SIMD extensions (SSE4) 128 GB RAM-512GB max 8 NUMA Domains with Hypertransport

~\$4.7K













Traditional software does not scale on manycore

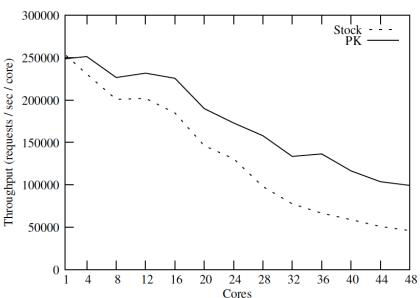
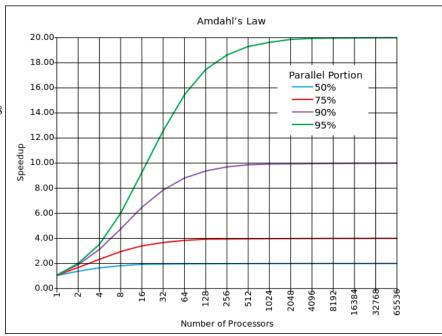


Figure 5: memcached throughput.

Locks in traditional O-O languages limit scalability per Amdahl's Law

http://pdos.csail.mit.edu/papers/linux:osdi10.pdf



Erlang and NodeJS to the rescue!







Erlang

Node.JS

Single assignment

No shared state

Lightweight processes

Message passing

Recursion and pattern matching

Concurrency built in

Supervisor based reliability model

Server side Javascript with Google V8 engine

Single threaded asynchronous callback model

Multi-core via OS processes (1 or more per core)

Existing libraries wrapped in closures—functional programming for the uninitiated

Message passing via [domain] sockets



```
-module(tut15).
-export([start/0, ping/2, pong/0]).
ping(0, Pong_PID) ->
    Pong_PID ! finished,
    io:format("ping finished~n", []);
ping(N, Pong_PID) ->
    Pong_PID ! {ping, self()},
    receive
        pong ->
            io:format("Ping received pong~n", [])
    end,
    ping(N - 1, Pong_PID).
pong() ->
    receive
        finished ->
            io:format("Pong finished~n", []);
        {ping, Ping_PID} ->
            io:format("Pong received ping~n", []),
            Ping_PID ! pong,
            pong()
    end.
start() ->
    Pong_PID = spawn(tut15, pong, []),
    spawn(tut15, ping, [3, Pong_PID]).
```



NodeJS example

```
// Simplest HTTP server
var http = require('http'),
    port = 8000;

var server = http.createServer(function (request, response) {
    response.writeHead(200, {"Content-Type": "text/plain"});
    response.end("Hello World\n");
});

server.listen(port);
console.log("Listening on <insert your favorite ip>:" + port);
```



Now something more complex....



Ruby Rails Erlang Style!



Build your next website with Erlang — the world's most advanced networking platform.

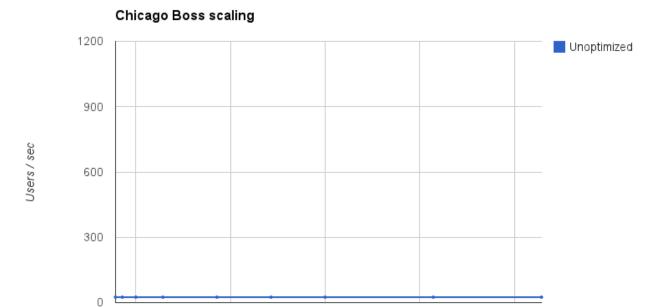


Do you pine for a simpler time when web pages loaded in under one second? **Chicago Boss** is the answer to slow server software: a Rails-like framework for Erlang that delivers web pages to your users as quickly and efficiently as possible.



Real world Chicago Boss application (concurix.com) December 2012

18



32

Schedulers

46

60





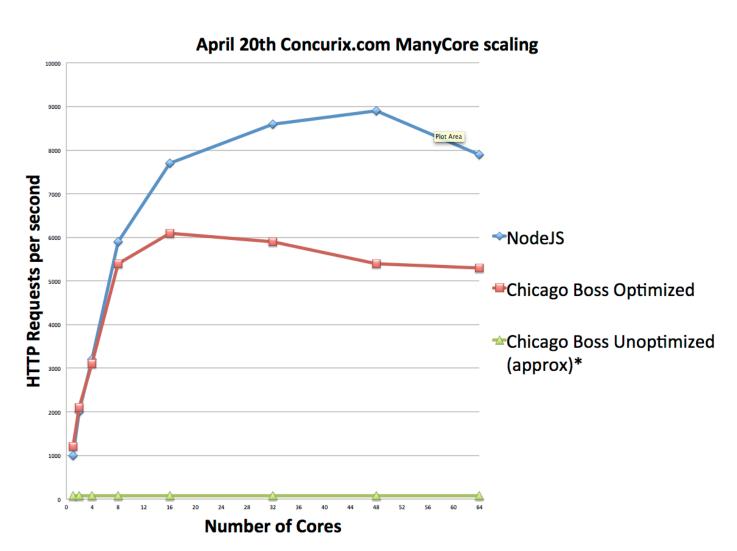


Back to Amdahl's Law—it's all about the locks





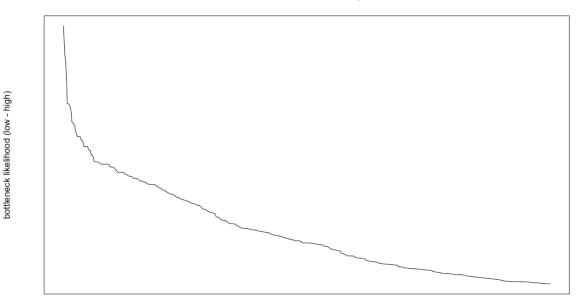
Where we are now... 45x+!!!



^{*:} A different load tester was used in the December 2012 numbers, this is rough approximation of the December numbers in the new tool.

We are not alone...

distribution of bottleneck scale by bench runs



customer traces (0% - 100%)

Concurix has over 1.2 million (and growing!) profile data sets.



100% of these profiles show at least 1 bottleneck candidate

How we did it...



Profiling with Real Time Visualizations and Big Data



Gprof!

Flat profile:

Each sample counts as 0.01 seconds.

| % (| cumulative | self | | self | total | |
|-------|------------|---------|-------|---------|---------|---------|
| time | seconds | seconds | calls | ms/call | ms/call | name |
| 33.34 | 0.02 | 0.02 | 7208 | 0.00 | 0.00 | open |
| 16.67 | 0.03 | 0.01 | 244 | 0.04 | 0.12 | offtime |
| 16.67 | 0.04 | 0.01 | 8 | 1.25 | 1.25 | memccpy |
| 16.67 | 0.05 | 0.01 | 7 | 1.43 | 1.43 | write |
| 16.67 | 0.06 | 0.01 | | | | mcount |
| 0.00 | 0.06 | 0.00 | 236 | 0.00 | 0.00 | tzset |
| 0.00 | 0.06 | 0.00 | 192 | 0.00 | 0.00 | tolower |
| 0.00 | 0.06 | 0.00 | 47 | 0.00 | 0.00 | strlen |
| 0.00 | 0.06 | 0.00 | 45 | 0.00 | 0.00 | strchr |
| 0.00 | 0.06 | 0.00 | 1 | 0.00 | 50.00 | main |
| 0.00 | 0.06 | 0.00 | 1 | 0.00 | 0.00 | memcpy |
| 0.00 | 0.06 | 0.00 | 1 | 0.00 | 10.11 | print |
| 0.00 | 0.06 | 0.00 | 1 | 0.00 | 0.00 | profil |
| 0.00 | 0.06 | 0.00 | 1 | 0.00 | 50.00 | report |



Can we do better...?





Not enough insight ("it's slow")

Depth of instrumentation

Too much data—2Gz+ * 64 cores



Automatically detect and instrument a semantic "middle"

Not enough insight ("it's slow")

Semantic level (e.g. code modules)



Big Data Analytics

Too much data—2Gz+ * 64 cores



Depth of instrumentation

Measuring Similarity

If we line up the data in an ordered vector, treat the vector as a point in N dimensional space, then similarity between data sets can be measured by distance between the points

One implementation is the cosine similarity

$$\theta = \arccos(\frac{a \cdot b}{\sqrt{\sum_{k=1}^{n} a^2_k} \sqrt{\sum_{k=1}^{n} b^2_k}})$$

Application example

Identify transitions

Data = the number of messages sent between any pair of sender-receiver, during a time window

Vector = line up the data along all possible pairs, , like "mochiweb-to-poolboy", in fixed order

Data for each time window is a vector of length of NxN (N = number of processes)

Big change in similarity between the data vectors means big shift in message passing activity

Benchmark repeatability



```
1.000 0.999 0.923 0.999 benchrun-399
---- 1.000 0.917 0.999 benchrun-403
---- 1.000 0.910 benchrun-404
---- 1.000 benchrun-406
```

Clustering

Grouping data points by similarity on some metric Algorithm: repeat until converge

Assignment to clusters:

$$Cluster^{(t)}_{i} = \{ p : ||p - center^{(t)}_{i}|| \le ||p - center^{(t)}_{j}|| \forall j \le k \}$$

Update cluster
$$cer_{center}^{(t+1)}{}_{i} = \frac{1}{|Cluster^{(t)}{}_{i}|} \sum_{p \in Cluster^{(t)}{}_{i}} p$$

Applications

Often used for discovery tasks when there are little prior knowledge about data

Example: Bucket the many processes to a few types according to their activities over time

State sequence clustering - Cluster 2

State sequence clustering - Cluster 2

State sequence clustering - Cluster 2

State sequence clustering - Cluster 3

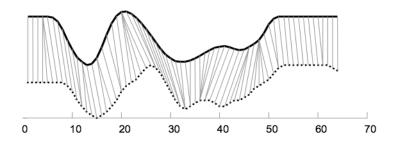
State sequence clustering - Cluster 3

State sequence clustering - Cluster 3

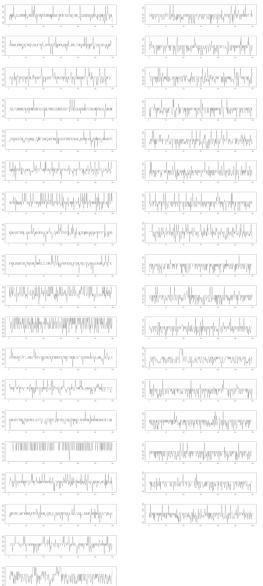
State sequence clustering - Cluster 5

Time series analysis

Use "dynamic time warping" distance to measure how well two time series match



Diff DTW $a == b \quad |a - b|$ INSERT Shift time out
DELETE Shift time in





Network analysis: centrality

Centrality: relative importance of a vertex in the network

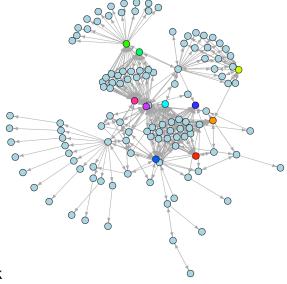
Computation

Degree centrality $C_D(v) = degree(v)$

Closeness centrality $C_C(v) = \frac{n-1}{\sum\limits_{u \in V} shortest-distance(v,u)}$

Eigenvector centrality $C_{EC}(v) = \lambda \sum_{\{u,v\} \in E} C_{EC}(u)$

Betweenness centrality $C_B(v) = \sum_{s \neq v \neq t \in V} \frac{\sigma_{st}(v)}{\sigma_{st}}$



Application

Detecting most important process in message passing network Bottleneck detection



Predictive Bottleneck Detection

Build a statistical model of how an application performs, and try to predict when bottlenecks can occur *before* they occur.

We accomplish this by watching the relationship between events and time over time...or:

fit a line time = $a + b * task to points {(task₁, time₁), (task₂, time₂), ..., (task_N, time_N)}$

$$\sigma_{task} = \sqrt{\frac{1}{(N-1)} \sum_{i=1}^{N} \left(task_i - \overline{task} \right)^2} \qquad \sigma_{time} = \sqrt{\frac{1}{N-1} \sum_{i=1}^{N} \left(time_i - \overline{time} \right)^2}$$

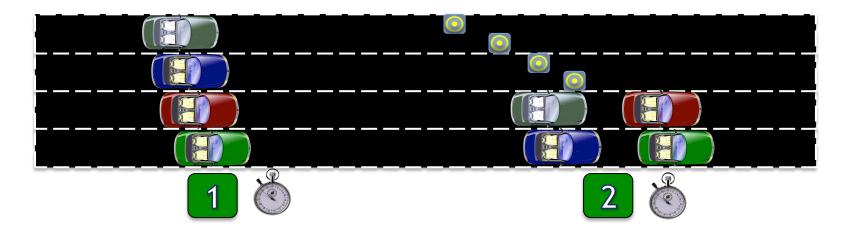
$$r_{task,time} = \frac{\sum_{i=1}^{N} (task_i - \overline{task})(time_i - \overline{time})}{(N-1)\sigma_{task}\sigma_{time}} \qquad b = r_{task,time} \frac{\sigma_{time}}{\sigma_{task}}$$



$$a = \overline{time} - b * \overline{task}$$

Bottleneck detection (simplified)

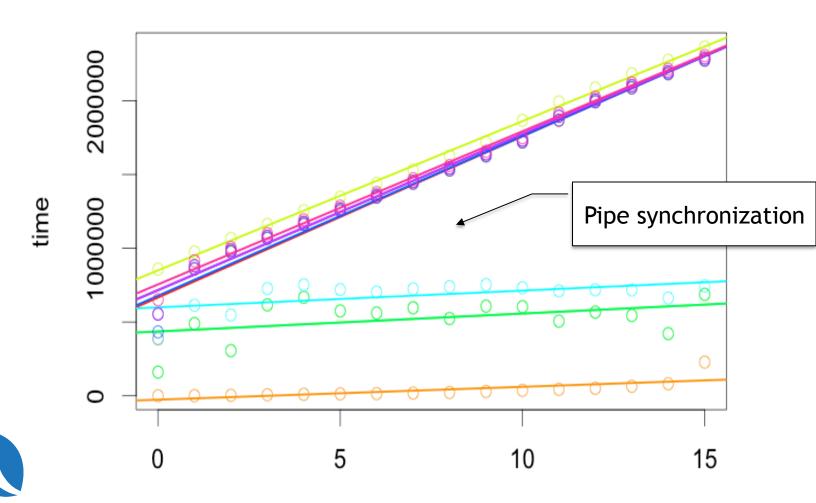
Order cars by arrival



Later cars are delayed more



Python MapReduce Bottleneck



Works cross-language: C and Erlang implemented, NodeJS soon

The Bet

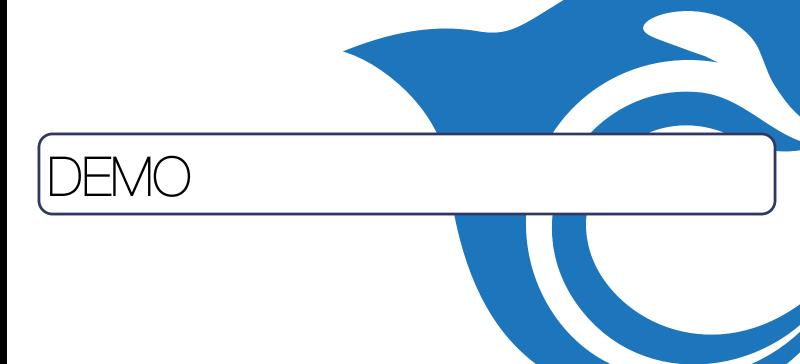




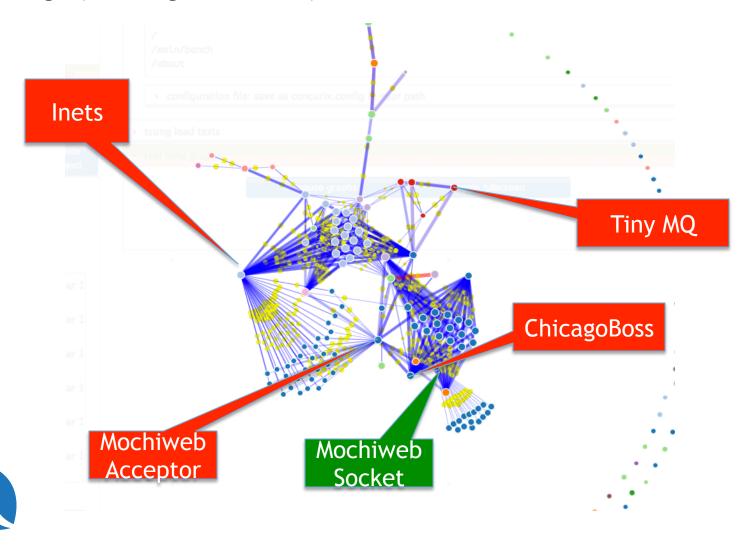
Code for the bet...

```
reload_routes() ->
18
        gen_server:call(boss_web, reload_routes).
20
    reload_translation(Locale) ->
21
        gen_server:call(boss_web, {reload_translation, Locale}).
22
    reload_all_translations() ->
24
        gen_server:call(boss_web, reload_all_translations).
25
    reload init scripts() ->
        gen_server:call(boss_web, reload_init_scripts).
27
28
29
    get_all_routes() ->
30
        gen_server:call(boss_web, get_all_routes).
31
32
    get_all_models() ->
33
        gen_server:call(boss_web, get_all_models).
34
35
    get_all_applications() ->
36
        gen server: call(boss web, get all applications).
37
38
    base_url(App) ->
39
        gen_server:call(boss_web, {base_url, App}).
40
    domains(App) ->
42
        gen server: call(boss web, {domains, App}).
43
    static_prefix(App) ->
45
        gen_server:call(boss_web, {static_prefix, App}).
    translator_pid(AppName) ->
47
48
        gen_server:call(boss_web, {translator_pid, AppName}).
49
50
    router_pid(AppName) ->
51
        gen_server:call(boss_web, {router_pid, AppName}).
52
53
    application_info(App) ->
54
        gen_server:call(boss_web, {application_info, App}).
```



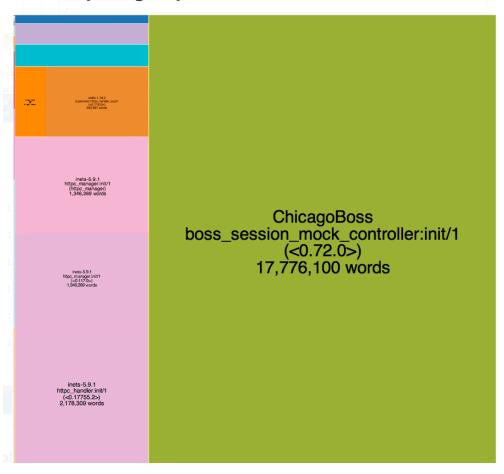


Message passing between processes



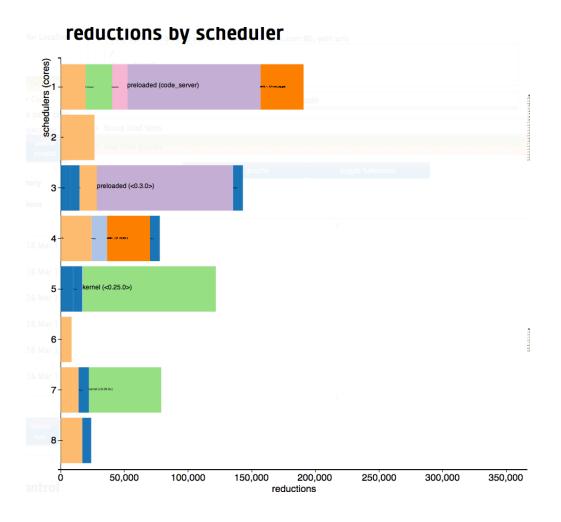
Excessive Memory Usage

memory usage by service





Uneven CPU Core utilization





Try it yourself--Erlang!

1. Add concurix_runtime to your rebar.config file:

2. Start the concurix_runtime system:

```
concurix_runtime:start()
```

3. Navigate to http://concurix.com/main/bench





Try it yourself--NodeJS! (available mid May, 2013)

Install the Concurix NodeJS runtime:

```
>npm install concurixjs
```

2. Start the concurix_runtime system:

```
var cx = require('concurixjs')
cx.start();
```

3. Navigate to http://concurix.com/main/bench





Promising future

More languages / frameworks









More Scenarios: cyber-security detection?

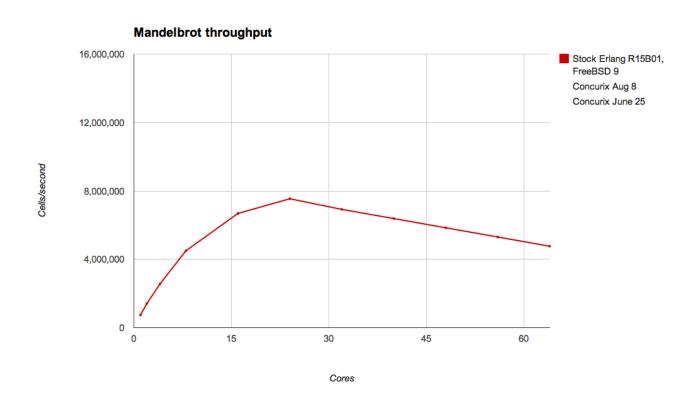






Q&A

Almost...even very parallelizable workloads had trouble scaling





After a bit of work....

