Introduction
Tasks
Low level parallel Julia
MapReduce
Distributed arrays
Last words
Questions

## Parallel computing in Julia

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- Introduction
- 2 Tasks
- 3 Low level parallel Julia
- 4 MapReduce
- Distributed arrays
- 6 Last words
- Questions

Introduction
Tasks
Low level parallel Julia
MapReduce
Distributed arrays
Last words
Questions

# Background(1)

" We want a language thats open source, with a liberal license. We want the speed of C with the dynamism of Ruby. We want a language thats homoiconic, with true macros like Lisp, but with obvious, familiar mathematical notation like Matlab. We want something as usable for general programming as Python, as easy for statistics as R, as natural for string processing as Perl, as powerful for linear algebra as Matlab, as good at gluing programs together as the shell. Something that is dirt simple to learn, yet keeps the most serious hackers happy. We want it interactive and we want it compiled."

Julia developers on "Why we created Julia"



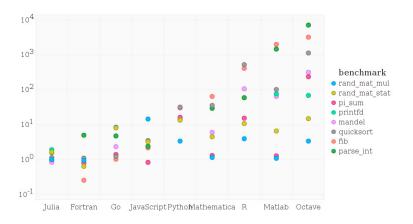
# Background(2)

#### Julia is:

- General purpose high-level dynamic programming language
- Free & Open source (MIT licensed)
- Development started in 2009, v0.1 in 2012
- Designed for parallelism & distributed computation
- Core written in C/C++, STL in Julia
- JIT Compiled
- Optimized for speed of calculation



### **Benchmarks**



<sup>&</sup>lt;sup>1</sup>Speed relative to C

1

## Some syntax

```
Examples
julia> [i*2 for i=1:5]
[1 4 6 8 10]
julia > function printargs(args...)
          for a in args
              println(a)
          end
        end
julia> map(x \rightarrow (x\%3 = 0), [3 4 12])
[true, false, true]
```

#### Macros

Expressions are Julia objects. These can be modified and then run.

#### **@time** macro

```
macro time(d::Expr)
  local t0 = time()
  local val = $d
  tocal t1 = time()
  println("elapsed time: ", t1-t0, " seconds")
  return val
end
julia > @time rand(100,100)
elapsed time 0.00679384 seconds
100x100 Array{Float64}
```

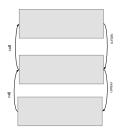
- Introduction
- 2 Tasks
- Sow level parallel Julia
- MapReduce
- Distributed arrays
- 6 Last words
- Questions



# Tasks(1)

# Functions (Sub-routines)

Call / Return



### Tasks (Co-routines)

Yielding to other tasks (saving state)



# Tasks(2)

#### Example: Integrator



- Introduction
- 2 Tasks
- 3 Low level parallel Julia
- 4 MapReduce
- Distributed arrays
- 6 Last words
- Questions



## Parallel implementation in Julia

- No native threads (yet?)
- Uses tasks/coroutines for scheduling
- Message passing interface for data communication
- Implementation of message passing is one-sided

# Worker processes

#### Syntax:

```
julia -p N [filename]
```

- Launches N worker processes
- Runs filename or interactive session
- Workers are numbered 2: N+1
- Can run on multiple cores or cluster of computers (specified using a machinefile)

### Remote calls & references

#### Executing statements on specific worker processes

```
julia -p 2
julia> r = remotecall(2, sin, pi/4)
RemoteRef(3,1,2)
julia> fetch(r)
0.7071067811865475
julia> remotecall_fetch(2, myid)
2
julia > @spawn cos(pi/4)
RemoteRef(3,1,3)
```

- Introduction
- 2 Tasks
- MapReduce
- Distributed arrays
- 6 Last words
- Questions

## Parallel map

#### Parallel map:

```
pmap(function, collection)
```

Performs function on collection. Uses a 'feeder' task for each worker process to serve data, while waiting for result the task yields to next feeder task until work is complete.

#### Example: list of expressions

```
julia> pmap(eval, {:(4+4), :(4*4), :(7-2), :(6/2)} )
[8, 16, 5, 3]
```

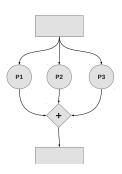
### MapReduce

#### MapReduce macro:

Oparallel (reduction) for collection

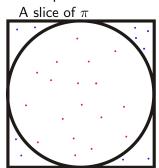
#### Example: coin toss

```
heads =
@parallel (+) for i=1:10000000
  randbool()
end
```



### Example

#### Example:



Generate random points from uniform distribution, get  $\pi$  from ratio of points in the circle.

$$A_{rect} = (2r)^2 = 4r^2$$

$$A_{circle} = \pi r^2$$

$$\pi = 4 \frac{A_{circle}}{A_{rect}}$$

- Introduction
- 2 Tasks
- Sow level parallel Julia
- MapReduce
- Distributed arrays
- 6 Last words
- Questions



### Syntax

#### Constructor:

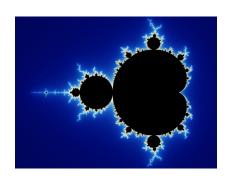
```
DArray(init, dims[, procs, dist])
```

#### Example with 8 workers:

```
julia> d = DArray(I->rand(length(I[1]),length(I[2])),
(80, 80), #dimensions
[2:9], #worker processes
[4,2]); #distribution

julia> remotecall_fetch(2,localindexes,d)
(1:20, 1:40)
julia> remotecall_fetch(7,localindexes,d)
(21:40, 41:80)
```

## Example: Mandelbrot Set



$$z \in \mathbb{C}$$
:  
 $z_0 = z$   
 $z_{n+1} = z_n^2 + z$ 

Set of *c* for which orbit of z around 0 remains bounded. Colours indicate escape time.

- Introduction
- 2 Tasks
- Sow level parallel Julia
- MapReduce
- Distributed arrays
- 6 Last words
- Questions

#### Links

- http://julialang.org/
- http://learnxinyminutes.com/docs/julia/
- https://github.com/jboomer/parallel-julia/
- http://www.dabeaz.com/coroutines/

- Introduction
- 2 Tasks
- 3 Low level parallel Julia
- MapReduce
- Distributed arrays
- 6 Last words
- Questions