

## Resource Management for Dynamic Function Distribution with Parsl and Work Queue

Douglas Thain, Ben Tovar, Thanh Son Phung, and Barry Sly-Delgado Parsl / FuncX Workshop, 27 October 2021





## Parsl + Work Queue for Scalable Apps

## http://parsl-project.org



Productive parallel programming in Python Use Parsl to create parallel programs comprised of Python functions and external components. Execute Parsl programs on any compute resource from laptops to supercomputers

Don't miss ParslFest Oct 3-4!







Contribute

## **Powerful Pythonic Workflow Programming Model**

### http://ccl.cse.nd.edu

#### Work Queue: A Scalable Master/Worker Framework

Work Queue is a framework for building large master-worker applications that span thousands of machines drawn from clusters, clouds, and grids. Work Oueue applications are written in C. Perl, or Python using a simple API that allows users to define tasks, submit them to the queue, and wait for completion. Tasks are executed by a standard worker process that can run on any available machine. Each worker calls home to the master process, arranges for data transfer, and executes the tasks. The system handles a wide variety of failures, allowing for dynamically scalable and robust applications.

Work Queue



Work Queue has been used to write applications that scale from a handful of workstations up to tens of thousands of cores running on supercomputers. Examples include Lobster, NanoReactors, ForceBalance, Accelerated

Weighted Ensemble, the SAND genome assembler, the Makeflow workflow engine, and the All-Pairs and Wavefront abstractions. The framework is easy to use, and has been used to teach courses in parallel computing, cloud computing, distributed computing, and cyberinfrastructure at the University of Notre Dame, the University of Arizona, and the University of Wisconsin - Eau Claire.

#### For More Information

- · Work Oueue User's Manual
- Work Queue API (C | Perl | Python)
- Work Queue Example Program (C | Perl | Python)
- · Work Queue Status Display
- · Download Work Queue
- · Getting Help with Work Queue



## Scalable, Portable, Robust Distributed Execution

### **System Architecture**





on Local Disk



## Configuring Parsl + WQ

#### import parsl

```
from parsl.executors import WorkQueueExecutor
```

config = parsl.config.Config(

#### executors=[

WorkQueueExecutor(

label="wq-parsl-app",

port=9123,

```
project_name="wq-parsl-app",
```

shared\_fs=False,

full\_debug = True,

• • • • • • DE 0 ft + ft parsl.readthedocs.io # Parsl C Edit on GitHub Docs » API Reference guide » parsl.executors.WorkQueueExecutor parsl.executors.WorkQueueExecutor Ouickstart Parsl tutorial class pars1.executors.WorkOueueExecutor(label: str = 'WorkOueueExecutor', provider: parsl.providers.provider base.ExecutionProvider = LocalProvider(channel=LocalChannel(envs={}, script dir=None, User guide userhome='/home/docs/checkouts/readthedocs.org/user\_builds/parsl/checkouts/latest/docs'), cmd\_timeout=30, init\_blocks=1, launcher=SingleNodeLauncher(debug=True, fail\_on\_any=False), max\_blocks=1, min\_blocks=0, move files=None, nodes per block=1, parallelism=1, worker init="), working dir: str = ", managed: bool = True, □ API Reference guide project\_name: Optional[str] = None, project\_password\_file: Optional[str] = None, address: Optional[str] = None, port: int = 0, env: Optional[Dict] = None, shared fs: bool = False, storage access: Core Optional[List[pars].data provider.staging.Staging]] = None, use cache: bool = False, source: bool = False, pack: bool = False, extra\_pkgs: Optional[List[str]] = None, autolabel: bool = False, autolabel\_window: int = 1, autocategory: Configuration bool = True, max\_retries: Optional[int] = 1, init\_command: str = ", worker\_options: str = ", full\_debug: bool = True, Channels worker executable: str = 'work queue worker') [source] Data management Executor to use Work Queue batch system ⊟ Executors The WorkQueueExecutor system utilizes the Work Queue framework to efficiently delegate parsl.executors.base.ParslExecutor Parsl apps to remote machines in clusters and grids using a fault-tolerant system. Users can run parsl.executors.status handling.BlockProvid the work queue worker program on remote machines to connect to the WorkQueueExecutor, and Parsl apps will then be sent out to these machines for execution and retrieval. parsl.executors.ThreadPoolExecutor parsl.executors.HighThroughputExecutor Parameters parsl.executors.WorkOueueExecutor label (str) - A human readable label for the executor, unique with respect to other Work parsLexecutors ExtremeScaleExecutor Queue master programs. Default is "WorkQueueExecutor". parsl.executors.LowLatencyExecutor working\_dir (str) - Location for Parsl to perform app delegation to the Work Queue system. parsl.executors.FluxExecutor Defaults to current directory. parsl.executors.swift t.TurbineExecutor managed (bool) - Whether this executor is managed by the DFK or externally handled. Launchers Default is True (managed by DFK). Providers project\_name (str) - If a project\_name is given, then Work Queue will periodically report its Exceptions status and performance back to the global WQ catalog, which can be viewed here: Internal http://ccl.cse.nd.edu/software/workgueue/status Default is None. Overrides address. project\_password\_file (str) - Optional password file for the work queue project. Default is Read the Docs None.

#### )])

## **Common Challenges**



Two common problems of scaling up:

- What resources should be assigned to a function call?
- What software dependencies does this function need?

How can we solve these problems automatically at runtime, without requiring the user to make advance declarations?



## **Packing Functions Into Manycore Nodes**







## **Packing Functions Into Manycore Nodes**







**Mix Function A and Function B?** 

## **Packing Functions Into Manycore Nodes**





## How to measure a single function call?



Tim Shaffer, Zhuozhao Li, Ben Tovar, Yadu Babuji, TJ Dasso, Zoe Surma, Kyle Chard, Ian Foster, and Douglas Thain, Lightweight Function Monitors for Fine-Grained Management in Large Scale Python Applications, IEEE International Parallel & Distributed Processing Symposium, May, 2021. DOI: 10.1109/IPDPS49936.2021.00088

## Lightweight Function Monitors (LFMs)



## Activate LFMs with an import and the @monitored keyword

```
In [7]: from resource monitor import monitored
    from time import sleep
```

In [12]: # declare a function to be monitored with the @monitored() decorator

```
@monitored()
def my_function_1(wait_for):
    sleep(wait_for)
    return 'waitied for {} seconds'.format(wait_for)
    (result, resources) = my_function_1(.1)
    print(result, '{}'.format({'memory': resources['memory'], 'wall_time': resources['wall_time']}))
```

waitied for 0.1 seconds {'memory': 49, 'wall\_time': 101689}



Thanh Son Phung, Logan Ward, Kyle Chard, Douglas Thain, "Not All Tasks are Created Equal: Adaptive Resource Allocation for Hetergeneous Tasks in Dynamic Workflows", WORKS Workshop at Supercomputing 2021.



Bucket 1 Bucket 2

## **Memory Consumption of Colmena-XTB's** Tasks





#### Problem

Tasks can consume as low as 2 GBs or as high as 30 GBs of RAM! Solution

Bucket tasks with similar consumption and allocate new tasks accordingly.

### **K-means Bucketing**







## Run Time Dependency Management



Barry Sly-Delgado







How do we ensure that all the tasks get a consistent, minimal environment matching the manager?

# CCTools

## **Poncho Toolkit**

The Poncho Toolkit allows users to create and deploy self contained Python environments at user level in arbitrary distributed systems via a JSON specification file.

- poncho\_package\_analyze
- poncho\_package\_create
- poncho\_package\_run

```
https://cctools.readthedocs.io/en/latest/poncho/
```

```
"conda":{
       "channels":[
              "defaults".
              "conda-forge"
       "packages":[
              "ndcctools=7.3.0",
              "parsl=1.1.0",
"pip":
       "topcoffea"
"git": {
       "DATA DIR": {
               "remote": "http://.../repo.git"
```

## **Run Time Dependency Management**

Manager Environment





## Package per Task



## Package per Worker



modify the worker command and input files.

## First Look: Orders of Magnitude

poncho\_package\_create

Application	No Versions Specified	All Versions Specified
TopEFT	2940s	170s
SHADHO	257s	159s

poncho\_package\_run

Application	Size compressed	Size unpacked	Unpack Time
SHADHO	438MB	1.4GB	12s
TopEFT	594MB	2GB	21s
Colmena-XTB	1.4GB	4.8GB	46s

## Next Steps...

- Do we really need all this code just to run a function? (maybe)
- Understanding the dependencies *actually used* by a function execution, and how they evolve over time.
- Extending dependency detection to other kinds of resources: databases, executables, file system resources...
- Closing the loop on application configuration: capture discovered resource configurations from multiple runs and use to predict future runs.
- Conveying known application categories from top to bottom through software stacks.

## **End to End Integration Testing**

#### All workflows

Showing runs from all workflows

Event <del>-</del>	Status <del>-</del>	Branch <del>-</del>	Actor <del>+</del>
		런 16 hours a 谢 3m 39s	go
		📋 2 days ago 🕐 3m 44s	·
main		📋 2 days ago 🏹 4m 43s	· ···
main		📋 2 days ago 🏹 30m 4s	····
		📋 3 days age 🏹 30m 25s	• •••
		苗 4 days age ở 30m 0s	····
		苗 4 days age ở 30m 27s	····
	Event - main	Event - Status - main	Event +       Status +       Branch +

End-to-end daily test that simply installs parsl+workqueue and runs a trivial example out of the manual to see if it gets the right result.

conda-forge dropped support for python 3.6, resulting in attempts to install taking forever while conda tries to solve an unsolvable dependency problem!

## For More Information...

#### **Quick Start:**

conda install -c conda-forge python=3.9 ndcctools parsl

### https://cctools.readthedocs.io https://ccl.cse.nd.edu/software/workqueue

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ject Names and t ver	Work Queue	DEBICH COCO				
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ommended Prac	Parrot	About	0	miour		
ging facilities	Chirp	Cotting Hole	Over	view		
anced Topics	Catalog Server	SOETMARE	resourc	ce_monitor is a tool to monito	or the computational resour	ces used by
ther Information	E Poncho	SOFTWARE	the pro	cess created by the command	d given as an argument, and	all its
yright	Commands	Mark Oueue	desceni	dants. The monitor works indi ment changed while a proces	irectly, that is, by observing	how the
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	Specification File	Resource Monitor	contras	t with direct methods, such a	is ptrace). It works on Linux,	, and it can be
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