

IDEAS Best Practices for HPC Software Developers Webinar July 15, 2020 Todd Gamblin Advanced Technology Office Livermore Computing



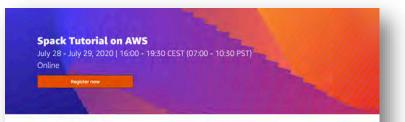
#### LLNL-PRES-811119

This work was performed under the auspices of the U.S. Department of Energy by Lawrence Livermore National Laboratory under contract DE-AC52-07NA27344. Lawrence Livermore National Security, LLC



### Join our virtual Spack tutorial, July 28-29!

- 2 sessions, July 28-29
  - 16:00 19:30 CEST (07:00 10:30 PST)
- Similar to the tutorials we give at SC, ISC
  - Beginner content on first day
  - Intermediate/advanced on second day
- Teaming up with AWS to offer this event — Open to all!
- Register at the URL below



#### About the event

The modern scientific software stack includes thousands of packages, from C, C++, and Fortran libraries, to packages written in interpreted languages like Python and R. HPC applications may depend on hundreds of packages spanning all of these ecosystems. To achieve high performance, they must also leverage low-level and difficult-to-build libraries such as MPI, BLAS, and LAPACK. Integrating this stack is extremely challenging. The complexity can be an obstacle to deployment and deters developers from building on each others' work.

Spack can help! Spack is an open source package manager that simplifies building, installing, customizing, and sharing HPC software stacks. In recent years, its adoption has grown rapidly: by end-users, by HPC developers, and by the world's largest HPC centers. Spack is also used to build reproducible scientific workflows in AWS.

More on Spack can be found at: - https://spack.io https://github.com/spack/spack

Spack provides a flexible dependency model, a simple Python syntax for writing package build recipes, and a repository of over 4,000 community-maintained packages. This tutorial provides a thorough introduction to Spack's capabilities

## spacktutorialonaws.splashthat.com







#### Spack provides a *spec* syntax to describe customized DAG configurations

\$ spack install mpileaks	unconstrained
\$ spack install mpileaks@3.3	@ custom version
\$ spack install mpileaks@3.3 %g	cc@4.7.3 % custom compiler
\$ spack install mpileaks@3.3 %g	cc@4.7.3 +threads +/- build option
\$ spack install mpileaks@3.3 cpp	oflags="-O3 –g3" set compiler flags
\$ spack install mpileaks@3.3 tar	get=skylake set target microarchitecture
\$ spack install mpileaks@3.3 ^m	pich@3.2 %gcc@4.9.3 ^ dependency information

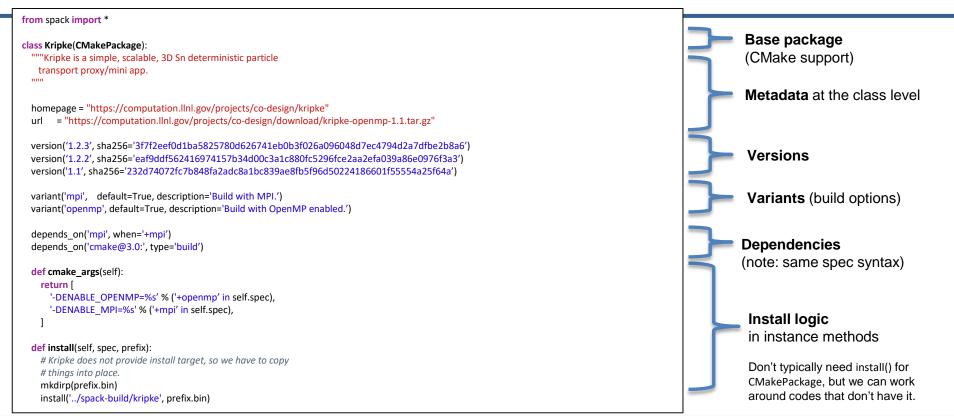
- Each expression is a *spec* for a particular configuration
  - Each clause adds a constraint to the spec
  - Constraints are optional specify only what you need.
  - Customize install on the command line!
- Spec syntax is recursive
  - Full control over the combinatorial build space





Not shown: patches, resources, conflicts, other directives.

#### Spack packages are *templates* They use a simple Python DSL to define how to build

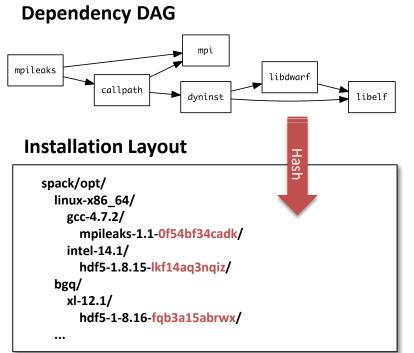


**)** github.com/spack





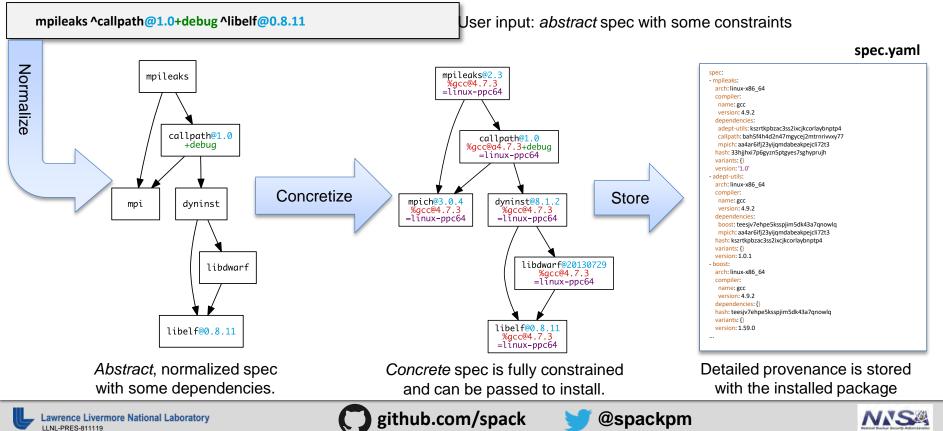
## Spack handles combinatorial software complexity.



- Each unique dependency graph is a unique configuration.
- Each configuration installed in a unique directory.
   Configurations of the same package can coexist.
- Hash of entire directed acyclic graph (DAG) is appended to each prefix.
- Installed packages automatically find dependencies
  - Spack embeds RPATHs in binaries.
  - No need to use modules or set LD\_LIBRARY\_PATH
  - Things work the way you built them



#### **Concretization fills in missing configuration details** when the user is not explicit.



#### Use `spack spec` to see the results of concretization

\$ spack spec mpileaks Input spec
mpileaks
Concretized
<pre>mpileaks@ 1.0%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^adept-utils@1.0.1%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^boost@1.61.0%gcc@5.3.0+atomic+chrono+date_time~debug+filesystem~graph ~icu_support+iostreams+locale+log+math~mpi+multithreaded+program_options ~python+radom +regex+serialization+shared+signals+singlethreaded+system +test+thread+timer+wave arch=darwin-elcapitan-x86_64 ^bzip2@1.0.6%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^zlib@1.2.8%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^openmpi@2.0.0%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^hwloc@1.11.3%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libpciaccess@0.13.4%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^hulopci2.4.6%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.10%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^callpath@1.0.2%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libglat.@1.0.2%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.10%gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.3.0 %gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.3.0 %gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.3.0 %gcc@5.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@2.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@3.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@3.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@3.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@3.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@3.3.0 arch=darwin-elcapitan-x86_64 ^libgiagev@3.3.0 arch=darwin-elcapitan-x86_64 </pre>





#### Spack is used worldwide!

Over **4,300** software packages Over **2,900** monthly active users (on docs site) Over 600 contributors from labs, academia, industry Plot shows sessions on spack.readthedocs.io for one month 488

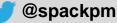




#### Users on our documentation site have also been increasing



github.com/spack





## Spack is being used on many of the top HPC systems

- Official deployment tool for the U.S. Exascale Computing Project
- 7 of the top 10 supercomputers
- High Energy Physics community

Summit (ORNL), Sierra (LLNL)

- Fermilab, CERN, collaborators
- Astra (Sandia)
- Fugaku (Japanese National Supercomputer Project)



EXASCALE COMPUTING PROJECT

SuperMUC-NG (LRZ, Germany) Edison, Cori, Perlmutter (NERSC)











Fugaku coming to RIKEN in 2021 DOE/MEXT collaboration

#### **One month of Spack development is pretty busy!**

Verview			
398 Active Pull Requests		111 Active Issues	2
11 333	<mark>۶</mark> 65	() 61	① 50

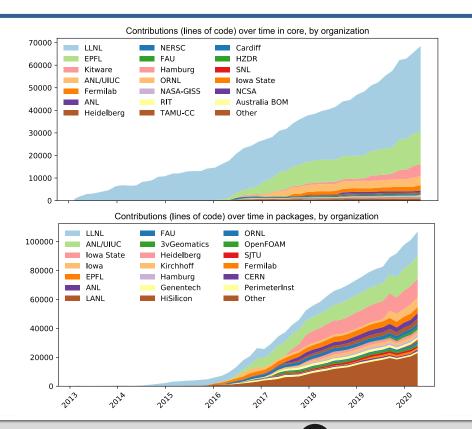
567 files have changed and there have been 16,144 additions and 2,496 deletions.



github.com/spack



#### **Contributions to Spack continue to grow!**



- In November 2015, LLNL provided most of the contributions to Spack
- Since then, we've gone from 300 to over 4,000 packages
- Most packages are from external contributors!
- Many contributions in core, as well.
- We are committed to sustaining Spack's open source ecosystem!

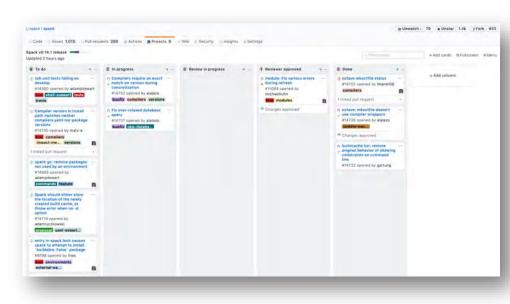
github.com/spack





## Spack has a release workflow

- We are creating GitHub projects (Kanban boards) per release
  - Includes major (0.13.0, 0.14.0) and minor (0.13.1, 0.13.2, etc.) releases
  - Each release shows the timeframe
  - You can easily see what's on the roadmap!
- Makes it easy to rely on release branches
  - You can expect us to backport fixes for critical bugs onto these branches
- Shooting for quarterly releases
  - Expect some movement of features from release to release
  - If we don't finish some things, we'll move them forward



Per-release Kanban boards allow the community to track releases better!





#### Spack has stable release branches

```
branch: develop (latest version)
0
    merge v0.14.1 into develop
0
     branch: releases/v0.14, tag: v0.14.1
     merge v0.14.0 into develop
0
11
     tag: v0.14.0
 0
    merge v0.13.2 into develop
0
     branch: releases/v0.13, tag: v0.13.2
     merge v0.13.1 into develop
Ó
|\rangle|
     tag: v0.13.1
     merge v0.13.0 into develop
|\rangle
     tag: v0.13.0
 0
0
0
```

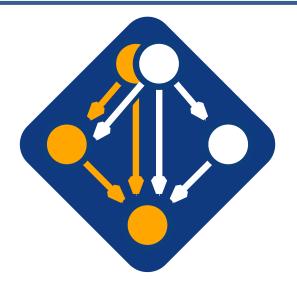
- Develop is where most of the action happens
  - Latest commits from pull requests
  - Package updates
- Release branches have release tags, minimize churn
  - Only bugfixes are backported from develop to stable releases
  - Major new features and package recipe changes happen in develop
- releases/v0.14 is the release branch for:
  - v0.14.0
  - v0.14.1
  - v0.14.2
  - Etc.





## Spack 0.13 was released in November, at SC19

- Spack stacks: combinatorial environments for facility deployment
- Spack detects and builds for specific microarchitectures
- Chaining: use dependencies from external "upstream" Spack instances









#### Ever tried to figure out what your processor is?

- You can get a lot of information from:
  - **/proc/cpuinfo** on linux
  - sysctl tool on macs
- But it's not exactly intuitive

## Humans call this architecture "broadwell"

## oh\_

processor	• 0
vendor_id	: GenuineIntel
cpu family	: 6
model	: 79
model name	: Intel(R) Xeon(R) CPU E5-2695 v4 @ 2.10GHz
stepping	
microcode	: 0xb000038 : 2101.000 what!?
cpu MHz	: 2101.000 Wildlight
cache size	: 46080 KB
physical id	: 0
siblings	: 18
core id	: 0
cpu cores	: 18
apicid	: 0
initial apicid	: 0
fpu	; yes
fpu_exception	: yes
cpuid level	: 20
win	1 1/05
flags	: fpu vme de pse tsc msr pae mce cx8 apic sep mtrr pg
mca cmov pat p	se36 clflush dts acpi mmx fxsr sse sse2 ss ht tm pbe s
scall nx pdpela	<pre>b rdtscp lm constant_tsc arch_perfmon pebs bts rep_goo</pre>

onitor ds\_cpl vmx smx est tm2 ssse3 sdbg fma cx16 xtpr pdcm pcid dca s se4\_1 sse4\_2 x2apic movbe popcnt tsc\_deadline\_timer aes xsave avx f16c rdrand lahf\_lm abm 3dnowprefetch epb cat\_13 cdp\_13 invpcid\_single int el\_ppin intel\_pt ssbd ibrs ibpb stibp tpr\_shadow vnmi flexpriority ept vpid fsgsbase tsc\_adjust bmi1 hle avx2 smep bmi2 erms invpcid rtm cqm rdt\_a rdseed adx smap xsaveopt cam\_llc cam\_occup\_llc cam\_mbm\_total ca m\_mbm\_local dtherm ida arat pln pts md\_clear spec\_ctrl intel\_stibp flu

bogomips : 4190.37 clflush size : 64 cache\_alignment : 64 address sizes power management:

#### what!?

: 46 bits physical, 48 bits virtual



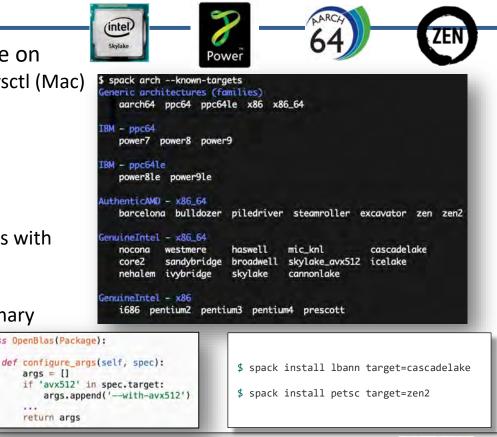


## Spack now understands specific target microarchitectures

- Spack knows what type of machine you're on
  - Detects based on /proc/cpuinfo (Linux), sysctl (Mac)
  - Allows comparisons for compatibility, e.g.:

skvlake > broadwell zen2 > x86 64

- Key features:
  - Know which compilers support which chips with which flags
  - Determine compatibility \_\_\_
  - Enable creation and reuse of optimized binary packages class OpenBlas(Package):
  - Easily guery available architecture feature portable build recipes



Specialized installati

github.com/spackfeature que@spackpm

. . .

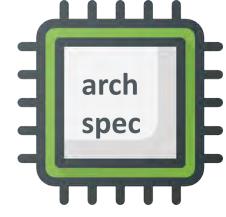
## Archspec: a library for reasoning about microarchitectures

- Standalone library, extracted from Spack
- Use fine-grained, human-readable labels, e.g.:
  - broadwell, haswell, skylake
  - instead of x86\_64, aarch64, ppc64 etc.
- Query capabilities
  - "Does haswell support AVX-512?" "no."
- Query compiler flags
  - "How do I compile for broadwell with icc?"
- Python package for now, but we want more bindings!
  - Actual data is in a common JSON file w/schema









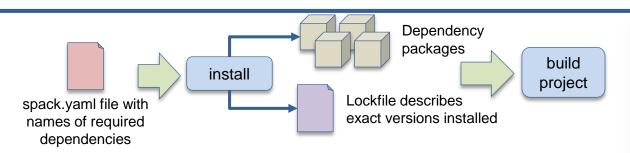


ReadTheDocs: archspec.rtfd.io

License: Apache 2.0 OR MIT

pip3 install archspec

#### Spack environments enable users to build customized stacks from an abstract description Simple spack.yaml file



- Allows developers to bundle Spack configuration with their repository
- Can also be used to maintain configuration together with Spack packages.
  - E.g., versioning your own local software stack with consistent compilers/MPI implementations
- Manifest / Lockfile model pioneered by Bundler is becoming standard
  - spack.yaml describes project requirements
  - spack.lock describes exactly what versions/configurations were installed, allows them to be reproduced.



include: - ../special-config-directory/ - ./config-file.yaml # add package specs to the 'specs' list specs: - hdf5 - libelf - openmpi Concrete spack.lock file (generated) 'concrete\_specs": { "6s63so2kstp3zyvjezglndmavy6l3nul": { "hdf5": { "version": "1.10.5", "arch": { "platform": "darwin", "platform\_os": "mojave", "target": "x86 64" }, "compiler": { "name": "clang",

# include external configuration

"version": "10.0.0-apple"
},
"namespace": "builtin",
"parameters": {
 "cxx": false,
 "debug": false,
 "fortran": false,
 "hl": false,
 "mpi": true,
 "pic": true,

"shared": true, "szip": false.

@spack

spack:



### We have developed Spack stacks: combinatorial environments for entire facility deployments

```
spack:
    definitions:
        compilers:
            [%gcc@5.4.0, %clang@3.8, %intel@18.0.0]
        mpis:
            [^mvapich2@2.2, ^mvapich2@2.3, ^openmpi@3.1.3]
        packages:
            - nalu
            - hdf5
            - hypre
            - trilinos
            - petsc
            - ...
    specs:
        # cartesian product of the lists above
        matrix:

    [$packages]

            - [$compilers]
            - [$mpis]
   modules:
        lmod:
            core_compilers: [gcc@5.4.0]
            hierarchy:
                             [mpi, lapack]
            hash_length:
```

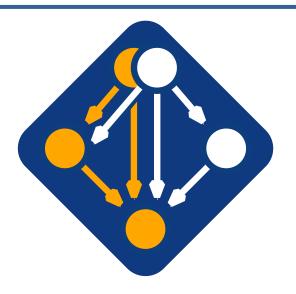
- Allow users to easily express a huge cross-product of specs
  - All the packages needed for a facility
  - Generate modules tailored to the site
  - Generate a directory layout to browse the packages
- Build on the environments workflow
  - Manifest + lockfile
  - Lockfile enables reproducibility
- Relocatable binaries allow the same binary to be used in a stack, regular install, or container build.
  - Difference is how the user interacts with the stack
  - Single-PATH stack vs. modules.





## Spack 0.14.0 was released at the end of February

- Completely reworked GitLab pipeline generation
   spack ci command
- Generate container recipes from environments
  - spack containerize command
- Distributed/parallel builds
  - srun –N 8 spack install
  - Spack instances coordinate effectively via locks

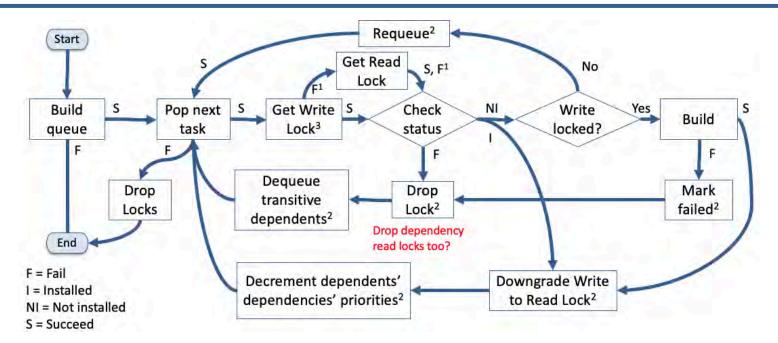








### New distributed locking algorithm enables parallel builds (0.14)



- Spack instances can coordinate with each other using only filesystem locks (no MPI required)
  - Independently run instances on login nodes, or
  - srun –N 8 –n 32 spack install -j 16 <package>







#### **Generate container images from environments (0.14)**

spack:	
specs:	
- gromacs+mpi	
- mpich	
	# Build stage with Spack pre-installed and ready to be used
<pre>container: # Select the format of the recip # singularity or anything else t format: docker # Select from a valid list of im base:</pre>	<pre>FROM spack/centos?ilatest as builder # what we want to install and how we want to install if # is specified in a manifest file (spack.yaml) RUM mkdir /opt/spack-environment \ 66 (echo "spack:" \ 66 (echo "specs:" \ 66 (echo " - gromacsempi" \ 66 (echo " - mpich" \ 66 (echo " - ormacsempi" \ 66 (echo " contrectization: together" \ 66 (echo " contrectization: together" \ 66 (echo " )</pre>
<pre>image: "centos:7"</pre>	So echo " install tree: /opt/software" \
spack: develop	<pre>&amp;&amp; echo " view: /opt/view") &gt; /opt/spack-environment/spack.yaml</pre>
<pre># Whether or not to strip binari strip: true # Additional system packages tha os_packages:</pre>	<pre>\$ Strip all the binaries RUM find -L /opt/vie/* -type f -exec readlink -f '()' \i   \ xargs file -i   \ grep 'charstetbiary'   \ </pre>
- libgomp	<pre>grep 'x-executable\[x-archive\]x-sharedlib'   \ awk -F: '{print \$1}'   xargs strip -s</pre>
<pre># Extra instructions extra_instructions:     final:  </pre>	ank -: (print ar)   Aarys stip -: # Modifications to the environment that are necessary to run RUN cd /opt/spack-environment && ) spack env activatesh -d . >> /etc/profile.d/z10_spack_environment.sh
RUN echo 'export PS1="\[\$(tput bold)	# Bare 05 image to run the installed executables
<pre># Labels for the image</pre>	COPY from=builder /opt/spack-environment /opt/spack-environment
<pre>labels: app: "gromacs" mpi: "mpich"</pre>	COPY — from-builder /opt/software /opt/software COPY — from-builder /opt/software /opt/software COPY — from-builder /opt/view /opt/view CY — from-builder /etc/profile.d/z10_spack_environment.sh /etc/profile.d/z10_spack_env
	n update -y && yum install -y epel-release && yum update -y install -y libgonp \ rm -rf /var/cache/yum && yum clean all
1	PHN acks Issent DS1-Wilditaut heldilijitettaut cotof 1) llaromacelijitetaut cotof 2) livitettaut

RUN echo 'export PS1="\[\$(tput bold)\]\[\$(tput setaf 1)\]|gromacs]\[\$(tput setaf 2)\]\u\[\$(tpu

- Any Spack environment can be bundled into a container image
  - Optional container section allows finer-grained customization
- Generated Dockerfile uses multistage builds to minimize size of final image
  - Strips binaries
  - Removes unneeded build deps with spack gc
- Can also generate Singularity recipes

#### spack containerize

github.com/spack





# Spack can now generate CI Pipelines from environments

- User adds a gitlab-ci section to environment
  - Spack maps builds to GitLab runners
  - Generate gitlab-ci.yml with spack ci command
- Can run in a Kube cluster or on bare metal at an HPC site
   Sends progress to CDash

Pipeline Jobs 123					<pre>- spack-cloud-ubuntu: match:</pre>
Stage-0       Ø         Ø diffutils 3.6 gc       Ø         Ø diffutils 3.6 gc       Ø         Ø gal 2.5 gcc@5       Ø         Ø gal 2.5 gcc@5       Ø         Ø libiconv 1.15 gc       Ø         Ø libiconv 1.15 gc       Ø         Ø libiconv 2.11       Ø         Ø libigsegv 2.11       Ø	Stage-1 <ul> <li>bzip210.6 gcc</li> <li>b</li></ul>	Stage-2       0         Image: Design 1, 159,0 g.m.       0	Stage-3         Image: Stage-	spack ci	<pre>- os=ubuntu18.04 runner-attributes: tags:     - spack-k8s     image: spack/spack_builder_ubuntu_18.     spack-cloud-centos:     match:         - os=centos7     runner-attributes:         tags:             - spack-k8s             image: spack/spack_builder_centos_7 cdash:     build-group: Release Testing     url: https://cdash.spack.io     project: Spack     site: Spack AWS Gitlab Instance</pre>
Lawrence Livermore	National aborator	vare	github.	.com/spack 🛛 🤟 @	spackpm

spack:

definitions:
 pkgs:

- oses:

specs: - matrix:

- [\$pkgs]
- [\$compilers]
- [\$oses]
mirrors:

gitlab-ci:

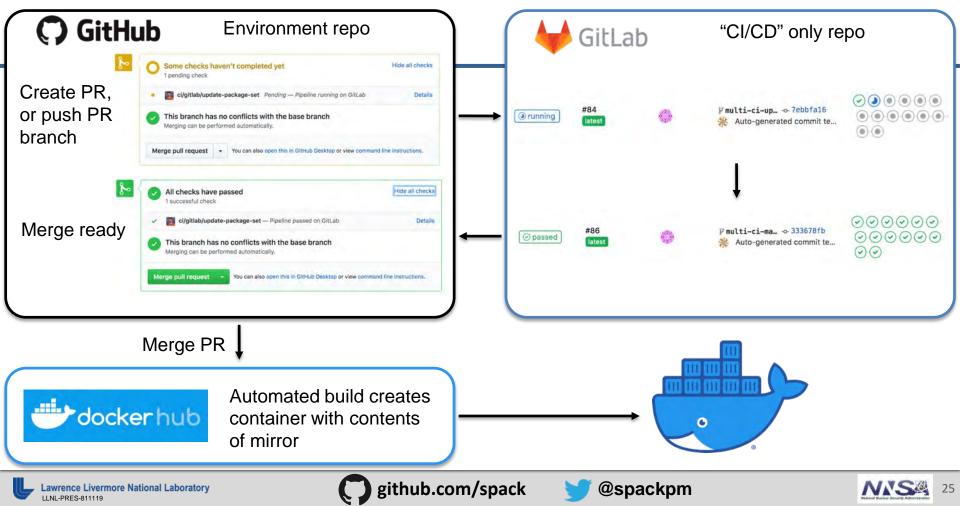
mappings:

- readline@7.0
- compilers:
- '%gcc@5.5.0'

- os=ubuntu18.04
- os=centos7

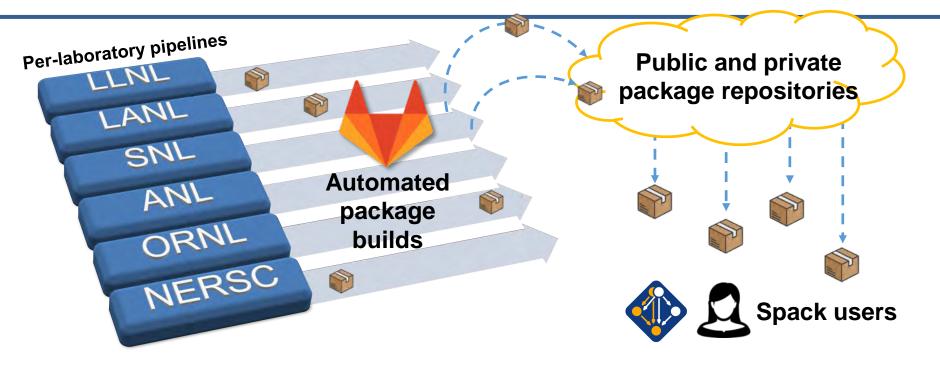
cloud\_gitlab: https://mirror.spack.io

#### Making use of the new workflow



# Automated builds using GitLab CI will enable a robust, widely available HPC software ecosystem.





With pipeline efforts at E6 labs, users will no longer need to *build* their own software for high performance.

Lawrence Livermore National Laboratory LLNL-PRES-811119





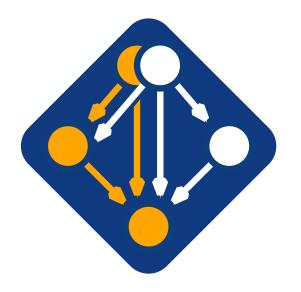


## Spack 0.15 was released 2 weeks ago

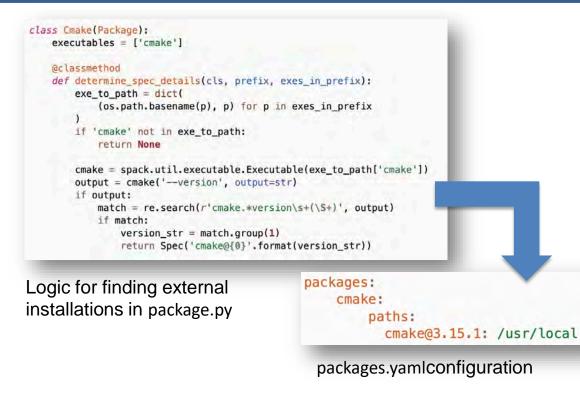
- Packages can specify how they should be found on the system
  - spack external find command
- Source code mirror for all Spack packages (from 0.15.1)
- Testing builds in GitLab for all packages in E4S
- Better Cray support
- Better compiler optimization support on macOS
  - apple-clang now its own compiler
- Enhancements and simplification to configuration
  - spack config add / spack config remove







## spack external find



- Spack has has compiler detection for a while
  - Finds compilers in your PATH
  - Registers them for use
- We can find any package now
  - Package defines:
    - possible command names
    - how to query the command
  - Spack searches for known commands and adds them to configuration
- Community can easily enable tools to be set up rapidly

github.com/spack





## Getting external libraries right is tricky

- Current support for external finding is really for build dependencies
- Can work for dependencies like MPI that have well-defined commands
  - mpice showme can be used to guery information about libraries
  - Provides well defined versions, link path
- Without this, we'd need to inspect libraries, which hard:
  - Are they built for the right architecture?
  - Are they ABI compatible?
  - What variants are enabled?
  - What version is the library?
- Future work: figure out how to detect more libraries **safely** 
  - Could look at tools like pkg-config for this





## Spack 0.15.1 introduced a source code mirror for all packages

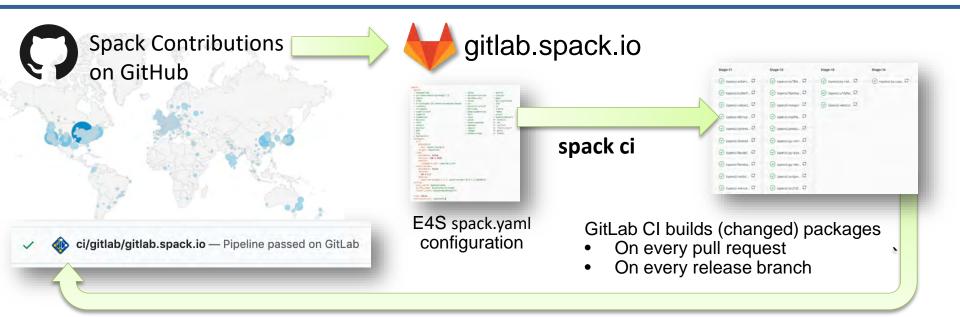
- Spack has long been vulnerable to unreliably hosted code
  - Outages at large sites like Sourceforge or GNU would leave Spack essentially down too.
  - Outages have been known to persist for long periods of time (GNU).
- Spack now has a dedicated S3 bucket with all sources, patches, and other resources needed to build
  - This is the first place we'll download things now
- If other sites go down, Spack is still in business.







#### We are testing our development branch and our release branches with ECP's E4S software stack



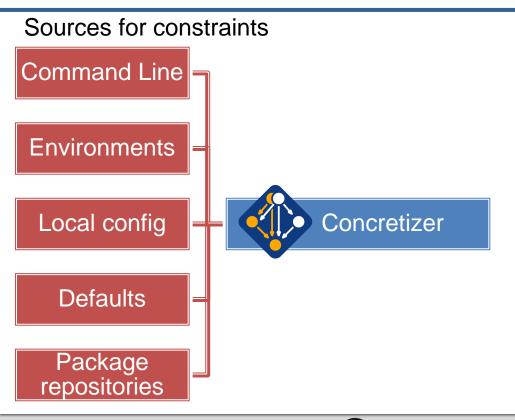
- E4S is about 250 packages will eventually include all ECP software products
   We've started with E4S built for CentOS6, CentOS7, Ubuntu18

  - Will start expanding to include more packages from Spack, ECP facility platforms, more instances
- More on E4S at https://e4s.io





### The concretizer has gotten pretty complicated



- Current implementation is ad-hoc:
  - Traverse the DAG
  - Evaluate conditions, add dependencies
  - Fill in defaults from many sources
  - Repeat until DAG doesn't change

#### Issues:

- Limited support for backtracking causes some graphs to resolve incorrectly
- Some constraints are strictly ordered
- Lots of conditional complexity
- Design doesn't scale to all the criteria
  - Hard to add new features/logic
  - Can be slow





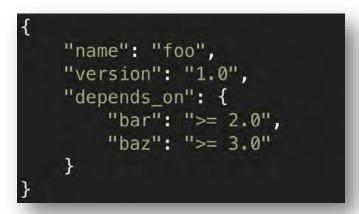
## What is managed by dependency managers?

#### **1.** What packages does this project depend on?

- This is a property of the project.
- Developers determine this

#### 2. What version of each package should I install?

- Specified by developers of project and dependencies
- Version pinning may be too specific
- Leaving version ranges open leaves room for error



#### Simple package model

#### Concerns:

- Correct/compatible versions?
- Latest vs. most tested version?
- Most secure version?

Developers manage Developers manage Developers manage

#### It's hard for developers just to manage packages and versions







# With a more diverse ecosystem, there's more that needs to be managed

- Build configuration options
  - Optional features/interfaces
  - Choice of parallelism model
    - OpenMP, CUDA, HIP, etc.
- Interfaces: which library implementation
  - MPI: MPICH, OpenMPI, MVAPICH
  - BLAS: OpenBLAS, Intel MKL, ARM math libs, etc.
  - CUDA versions
- Which compiler
  - Intel, gcc, PGI, clang, XL, AMD, Cray, NAG, others...
  - Compiler version?
  - Which optimization flags?
  - Which runtime libraries (libstdc++, fortran ABIs)
  - Potentially mixed compilers
- Microarchitecture
  - Mostly SIMD instruction features
    - AVX-512, AVX-256, SSE, ARM SVE, etc.



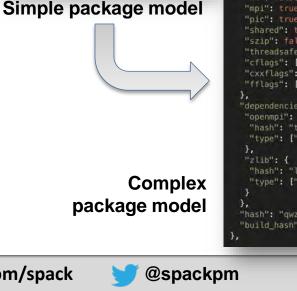
"name": "foo",

"version": "1.0",

"bar": ">= 2.0",

"baz": ">= 3.0"

"depends\_on": {



"hdf5": { "version": "1.10.6", "arch": { "platform": "darwin", "platform\_os": "mojave", "target": { "name": "skylake", }, "compiler": { "name": "clang", "version": "10.0.0-apple" }, "namespace": "builtin", "parameters": { "cxx": false, "debug": false, "fortran": false. "hl": false, "mpi": true. "pic": true, "shared": true, "szip": false, "threadsafe": false, "cflags": ["-03", "-g"], "cxxflags": ["-03", "-g"], "fflags": ["-O3", "-g", "-fdefault-double-8"], "dependencies": { "openmpi": { "hash": "tvjyinwp7x3eb5eit3xwgwjrt73o4s6r", "type": ["build", "link"] "hash": "licwn64il2mmstixvgfdmjjgby7ay3ey", "type": ["build", "link"] "hash": "gwzmhcempklkpf5ih7dw6vasxpoklt5c", "build hash": "d44a2dh37ecvex3ifnztg7iosalnrgnr"



## SAT solvers look appealing, but they're very low-level

#### Some options:

- picosat (used by Conda): basic Boolean SAT solver
  - A basic SAT solver finds any valid solution
  - We need to optimize for a lot of different criteria
  - We'd like to be able to use numbers, some math in the solve
- libsolv: very targeted towards traditional package model
  - Packages, versions, standard formats, picking latest version
- Doing optimization in a SAT solver is hard!
  - Conda implements its own math routines in pure SAT
  - $-\,$  This is kind of like implementing your own binary adders and multipliers  $\textcircled{\odot}$
  - Apparently a lot slower than libsolv (cf. Mamba project using libsolv in Conda)





## Some higher-level solver options

#### SMT: Satisfiability modulo theories

- Z3 seems to be the industry standard: very powerful, very active community
- Support for integer math, implications, higher level logic operations
- Support for multi-criteria optimization
- Traction in the formal verification community
- Nice high level Python interface
- Can generate unsatisfiable cores and proofs for error cases (but proofs are complex)

#### ASP: Answer Set Programming (not the other ASP)

- Potassco project seems to be the most actively developed/active (and very fast)
- Nice prolog-like first-order logic syntax; boils down to SAT
- Support for multi-criteria optimization
- Python interface
- No support for generating unsat cores or proofs







otassco

### We ended up implementing a prototype concretizer in ASP

- Used Clingo, the Potassco grounder/solver package
- ASP program has 2 parts:
  - 1. Large list of facts generated from our package repositories
    - 6,000 9,000 facts is typical includes dependencies, options, etc.
  - 2. Small logic program (~130 lines)
- New algorithm (at least our part) is conceptually simpler:
  - Generate facts for all possible dependencies
  - Send facts and our logic program to the solver
  - Build a DAG from the results
- Solve time is much faster than existing concretizer
  - Typically a fraction of a second (so far), plus parsing
  - Can fall off a cliff it's NP-complete after all

% Pack	age: ucx
Marsia	m_declared("ucx", "1.6.1", 0).
VEP STO	n_declared("ucx", "1.6.0" 1).
	n_declared("ucx", "1.5.2", 2).
	m_declared("ucx", "1.5.0" 4),
verste	n_declared("ucx", "1.4.0", 5).
versto	n.declared("ucx", "1.4.0", 5). n.declared("ucx", "1.3.1", 6). n.declared("ucx", "1.3.0", 7).
versite	declared ber 1.5.1 8)
versio	n_declared("ucx", "1.2.2", 8).
	n_declared("ucx", "1.2.1", 9).
versio	m_declared("ucx", "1.2.0", 10).
variar	t("ucx", "thread_multiple").
variar	t_single_value("ucx", "thread_multiple").
varian	<pre>ht_default_value("ucx", "thread_multiple", "False").</pre>
variar	<pre>t_possible_value("ucx", "thread_multiple", "False").</pre>
variar	t_defoult_value("ucx", "thread_multiple", "False"), t_possible_value("ucx", "thread_multiple", "False"), t_possible_value("ucx", "thread_multiple", "True").
declar	red_dependency("ucx", "numactl", "build"),
	red_dependency("ucx" "numactl" "link").
	'numactl") - depends_an("ucx", "numactl"), node("ucx").
nouer	hunder 1 - acpends on ack i hunder 1 house ack 1.
declar	ed_dependency("ucx", "rdma-core", "build"). ed_dependency("ucx", "rdma-core", "link"). rdma-care") depends.pn("ucx" "rdma-core"). node("ucx").
declar	<pre>ed_dependency("ucx", "rdma-core", "build"). ed_dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx").</pre>
declar	red_dependency("ucx", "rdma-core", "link"),
declar node(	red_dependency("ucx", "rdma-core", "link"),
declar node(* % Pack % Pack % versio	ed.dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"). ngge: util-linux m.declared("util-linux", "2.29.2" 0),
declar node(* % Pack % Pack % versio	ed.dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"). ngge: util-linux m.declared("util-linux", "2.29.2" 0),
declar node(* % Pack % Pack % versio	ed_dependency("ucx", "rdma-core", "link"). rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"). age: util-linux
declar node(* % Pack % Versid versid versid	<pre>ed.dependency('ucx", "rdma-core", 'link"), rdma-core") :- depends_on('ucx", "rdma-core"), node("ucx"). age: util-linux n_declared('util-linux", "2.29.2", 0), n_declared('util-linux", "2.29.1, 1), n_declared('util-linux", "2.25", 2).</pre>
declar node(* % Pack % Pack % versio versio versio versio	<pre>ed.dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"), age: util-linux n.declared("util-linux", "2.29.2" 0), m_declared("util-linux", "2.29.1", 1), m_declared("util-linux", "2.25", 2), tt("util-linux", "libuuid").</pre>
declar node(" % Pack % Pack versio versio versio variar	<pre>ed.dependency('ucx', 'rdma-core', 'link'). rdma-core') :- depends_on('ucx', 'rdma-core'), node('ucx').  age: util-linux n_declared('util-linux', '2.29.2', 0), n_declared('util-linux', '2.29.1', 1), n_declared('util-linux', '2.29.5', 2). t('util-linux', 'libuuid'). t_single_value('util-linux', 'libuuid').</pre>
declar node(" % Pack % Pack versio versio versio variar	<pre>ed.dependency('ucx', 'rdma-core', 'link'). rdma-core') :- depends_on('ucx', 'rdma-core'), node('ucx').  age: util-linux n_declared('util-linux', '2.29.2', 0), n_declared('util-linux', '2.29.1', 1), n_declared('util-linux', '2.29.5', 2). t('util-linux', 'libuuid'). t_single_value('util-linux', 'libuuid').</pre>
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declar node(" % Pack % Pack versic versic versic variar variar variar	<pre>ed.dependency('ucx', 'rdma-core', 'link'). rdma-core') :- depends_on('ucx', 'rdma-core'), node('ucx').  age: util-linux n_declared('util-linux', '2.29.2', 0), n_declared('util-linux', '2.29.1', 1), n_declared('util-linux', '2.29.5', 2). t('util-linux', 'libuuid'). t_single_value('util-linux', 'libuuid').</pre>
declar node(* % Pack %	<pre>ed_dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"). age: util-linux m_declared("util-linux", "2,29,2", 0), m_declared("util-linux", "2,29,1", 1), m_declared("util-linux", "2,25", 2). tt"_util-linux", "libuid"), tt_single_value("util-linux", "libuid"). tt_possible_value("util-linux", "libuid", "True"), tt.possible_value("util-linux", "libuid", "True"), tt.possible_value("util-linux", "libuid", "True"), tt.possible_value("util-linux", "libuid", "True"), d_dependency("util-linux", "pkaconfig", "build").</pre>
declar node(* % Pack %	<pre>ed_dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"). age: util-linux m_declared("util-linux", "2,29,2", 0), m_declared("util-linux", "2,29,1", 1), m_declared("util-linux", "2,25", 2). tt"_util-linux", "libuid"), tt_single_value("util-linux", "libuid"). tt_possible_value("util-linux", "libuid", "True"), tt.possible_value("util-linux", "libuid", "True"), tt.possible_value("util-linux", "libuid", "True"), tt.possible_value("util-linux", "libuid", "True"), d_dependency("util-linux", "pkaconfig", "build").</pre>
declar node(* % Pack % Versic versic versic variar variar variar declar declar	<pre>ed.dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"). age: util-linux m_declared("util-linux", "2.29.2" 0), m_declared("util-linux", "2.29.1", 1), m_declared("util-linux", "2.25", 2). tt_adefault_value("util-linux", "libuuid"), st_adefault_value("util-linux", "libuuid"), st_adefault_value("util-linux", "libuuid"), st_adefault_value("util-linux", "libuuid"), "fraise"), st_possible_value("util-linux", "libuuid", "fraise"), st_possible_value("util-linux", "libuuid", "rrue"),</pre>
declar node(" % Pack % Pack % versic versic versic variar variar variar variar declar node("	<pre>ed.dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"), agge: util-linux m.declared("util-linux", "2.29.2" 0), m.declared("util-linux", "2.29.1", 1), m.declared("util-linux", "libuuid"), tt_single_value("util-linux", "libuuid"), tt_defoult_value("util-linux", "libuuid"), tt_possible_value("util-linux", "libuuid", "True"), tt_possible_value("util-linux", "libuuid", "True"), tt_adependency("util-linux", "libuuid", "True"), ed_dependency("util-linux", "pkgconfig", "build"), ed_dependency("util-linux", "pkgconfig", "node("util-linux")</pre>
declar node(" % Pack % Pack % version version variar variar variar variar declar node(" declar	<pre>ed_dependency('uux'', 'rdma-core', 'link'), rdma-core') :- depends_on('uux'', "rdma-core'), node('uux''). age: util-linux m_declared('util-linux'', '2.29.2'', 0), m_declared('util-linux'', '2.25'', 2), tt('util-linux'', 'libuuid''), tt.single.value('util-linux', 'libuuid'', 'True'), tt_possible.value('util-linux', 'libuuid'', 'False'), tt_possible.value('util-linux', 'libuuid'', 'False'), tt_possible.value('util-linux', 'libuuid'', 'True'), ed_dependency('util-linux', 'pkgconfig'', "build'). ed_dependency('util-linux', 'pkgconfig'', 'linux'), ed_dependency('util-linux', 'pkgconfig'', 'linux'), ed_dependency('util-linux', 'pkgconfig'', 'build').</pre>
declar node(" % Pack %	<pre>ed.dependency("ucx", "rdma-core", "link"), rdma-core") :- depends_on("ucx", "rdma-core"), node("ucx"), agge: util-linux m.declared("util-linux", "2.29.2" 0), m.declared("util-linux", "2.29.1", 1), m.declared("util-linux", "libuuid"), tt_single_value("util-linux", "libuuid"), tt_defoult_value("util-linux", "libuuid"), tt_possible_value("util-linux", "libuuid", "True"), tt_possible_value("util-linux", "libuuid", "True"), tt_adependency("util-linux", "libuuid", "True"), ed_dependency("util-linux", "pkgconfig", "build"), ed_dependency("util-linux", "pkgconfig", "node("util-linux")</pre>

#### Some facts for HDF5 package







Define the space:

each package must be assigned exactly one version.

Disallow conflicted versions

Minimize the total of all version Weights (more on this later)

```
something is a package, it has only one version and that must be a
                  : version_possible(P, V) } 1 :- node(P).
% If a version is declared but conflicted, it's not possible.
version_possible(P, V) :- version_declared(P, V), not version_conflict(P, V).
% version weight and optimization
version_weight(P, V, N) :- version(P, V), version_declared(P, V, N).
 #minimize{ N@8,P,V : version_weight(P, V, N) }.
```



### **Previously complicated logic became very simple**

- Every node in the DAG has a compiler and a target architecture
  - Some compilers don't support generating code for some targets
  - But we want to pick the best target possible for each compiler
- Previously this required some complicated logic mixed in with the rest of the solve

Each node has 1 target assigned

Disallow cases where the compiler doesn't support the target.

Minimize the total weight of all targets

```
% one target per node -- optimization will pick the "best" one
1 { node_target(P, T) : target(T) } 1 :- node(P).
% can't use targets on node if the compiler for the node doesn't support them
:- node_target(P, T), not compiler_supports_target(C, V, T),
    node_compiler(P, C), node_compiler_version(P, C, V).
% if a target is set explicitly, respect it
    node_target(P, T) :- node(P), node_target_set(P, T).
% each node has the weight of its assigned target
    node_target_weight(P, N) :- node(P), node_target(P, T), target_weight(T, N).
#minimize{ N@5,P : node_target_weight(P, N) }.
```

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## Dependency logic is pretty concise, too (even with virtuals)

- It was easy to express what were previously pretty complicated constraints:
  - There can be at most one provider of any virtual dependency in the DAG
  - Depending on a virtual means you depend on one of its providers
  - Preferences for virtuals can come from multiple sources
  - Pick the most preferred virtual packages
- Each of these sections stands alone and is easy to compose with others

```
% declared dependencies are real if they're not virtual
depends_on(P, D, T) :- declared_dependency(P, D, T), not virtual(D), node(P).
% if you declare a dependency on a virtual, you depend on one of its providers
1 { depends_on(P, Q, T) : provides_virtual(Q, V) } 1
    :- declared_dependency(P, V, T), virtual(V), node(P).
% if a virtual was required by some root spec, one provider is in the DAG
1 { node(P) : provides_virtual(P, V) } 1 :- virtual_node(V).
% for any virtual, there can be at most one provider in the DAG
provider(P, V) := node(P), provides_virtual(P, V).
0 { provider(P, V) : node(P) } 1 :- virtual(V).
% give dependents the virtuals they want
provider_weight(D, N)
    :- virtual(V), depends_on(P, D), provider(D, V),
       pkg_provider_preference(P, V, D, N)
provider_weight(D, N)
    :- virtual(V), depends_on(P, D), provider(D, V),
       not pkg_provider_preference(P, V, D, _).
       default_provider_preference(V, D, N)
% pick most preferred virtual providers
 minimize{ N*R@9,D : provider_weight(D, N), root(P, R) }
```





#### Not everything was simple

- The learning curve for ASP is fairly high.
  - If you haven't been exposed to this before, it can take a while to get in the right mindset
- The shorter the program, the more thought per line
  - The examples before are simple to talk about and they're easy to maintain
  - Writing all of this from scratch took a lot of thought (at least for me)
- Structuring optimization criteria can be a challenge
  - Took a little while to really think through the implications
  - Maximizing criteria tend to expand the DAG unnecessarily, so had to learn to prefer minimization to maximization for most things.
  - Deciding the order in which to optimize different criteria involves some tradeoffs
- The solver is very aggressive, which can lead to some surprising cases

   hdf5~mpi ^mpich





# Sometimes the solver can be overly aggressive

Previous solver couldn't figure out how to toggle build options, e.g.:

spack install hdf5 ^mpich

 This would fail because mpich is optional; it's only in the DAG if the mpi variant is enabled:

spack install hdf5 +mpi ^mpich

But the new solver can be too smart for its own good . Consider:

spack install hdf5 -mpi ^mpich

- This quickly finds a really obscure way to depend on MPI:
   hdf5 → libaec → cmake → libarchive → lz4 → valgrind → mpi
- Need to disable searches through build dependencies (cmake) to avoid this kind of weirdness

(loft-gamblin):spack\$ spack solve hdf5 ~mpi Ampich ⇒ Best of 338 answers. > Optimization: [5, 6, 0, 0, 0] hdf5@1.10.6%clang@10.0.0-apple~cxx~debug~fortran~hl~mpi+pic+shar ^libaec@1.0.2%clang@10.0.0-apple build\_type=RelWithDebInfo a ^cmake@3.16.2%clang@10.0.0-apple~doc+ncurses+openssl~own Abzip2@1.0.8%clang@10.0.0-apple+shared arch=darwin-r ^diffutils@3.7%clang@10.0.0-apple arch=darwin-mo Alibiconv@1.16%clana@10.0.0-apple arch=darwi ^curl@7.68.0%clang@10.0.0-apple+darwinssl~gssapi~lib ^zlib@1.2.11%clang@10.0.0-apple+optimize+pic+sha ^expat@2.2.9%clang@10.0.0-apple~libbsd arch=darwin-m Alibarchive@3.3.2%clang@10.0.0-apple arch=darwin-mo ^libxml2@2.9.9%clang@10.0.0-apple~python arch=da ^pkgconf@1.6.3%clang@10.0.0-apple arch=darwi ^xz@5.2.4%clang@10.0.0-apple arch=darwin-mo Alz4@1.9.2%clang@10.0.0-apple arch=darwin-mojave ^valgrind@3.15.0%clang@10.0.0-apple+boost+mp ^boost@1.70.0%clang@10.0.0-apple+atomic+ iber+filesystem+graph~icu+iostreams+locale+log+math~mpi+multithr nals-sinalethreaded+system-taggedlayout+test+thread+timer Ampich@3.3.2%clang@10.0.0-apple device= mojave-skyla Afindutils@4.6.0%clang@10.0.0-apple ^autoconf@2.69%clang@10.0.0-appl

^m4@1.4.18%clang@10.0.0-appld ^libsigsegv@2.12%clang@10 ^perl@5.30.1%clang@10.0.0-appl ^gdbm@1.18.1%clang@10.0.0 ^readline@8.0%clang@1 ^ncurses@6.1%clan ^ncurses@6.1%clang@10.0.0-appl ^libtool@2.4.6%clang@10.0.0-appl ^libtool@2.4.6%clang@10.0.0-apple ^libtool@2.4.6%clang@10.0.0-apple ^libtool@2.4.6%clang@10.0.0-apple ^libtool@2.4.6%clang@10.0.0-apple ^libtool@2.4.6%clang@10.0.0-apple ^libtool@2.4.1%clang@10.0.0-apple arch=darwin-moja ^openssl@1.1.1d%clang@10.0.0-apple arch=darwin-mojave=3 ^libuv@1.25.0%clang@10.0.0-apple arch=darwin-mojave=4 ^rhash@1.3.5%clang@10.0.0-apple arch=darwin-mojave=4

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## **Getting information about errors is still tough**

- Good error messages are important for unsatisfiable cases
  - Need to be able to tell the user something useful about the problem
  - PubGrub is very good at this
- PubGrub essentially generates a proof of why the DAG isn't satisfiable
  - Tells you the salient constraints, points you to what to change
- Potassco currently doesn't have great ways to get this information
  - No unsatisfiable cores or proofs
- Z3 has support for proof generation, so we're looking at trying it
  - Z3 proofs are complicated; challenge to translate them to good messages
  - This is a work in progress





## Spack 0.16 Roadmap: permissions and directory structure

#### Sharing a Spack instance

- Many users want to be able to install Spack on a cluster and `module load spack`
- Installations in the Spack prefix are shared among users
- Users would spack install to their home directory by default.
- This requires us to move most state *out* of the Spack prefix
  - Installations would go into ~/.spack/...

#### Getting rid of configuration in ~/.spack

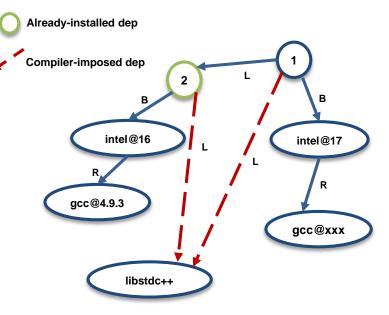
- While *installations* may move to the home directory, *configuration* there is causing issues
- User configuration is like an unwanted global (e.g., LD\_LIBRARY\_PATH ))
  - Interferes with CI builds (many users will rm -rf ~/.spack to avoid it)
  - Goes against a lot of our efforts for reproducibility
  - Hard to manage this configuration between multiple machines
- Environments are a much better fit
  - Make users keep configuration like this in an environment instead of a single config



## Spack 0.16 roadmap: compilers as dependencies

- We need deeper modeling of compilers to handle complex ABI issues
  - libstdc++, libc++ compatibility
  - Compilers that depend on compilers
- Future GPU, OpenMP target, etc. libraries have similar issues
  - Entire stack for a large code needs to be consistent
  - We currently do not have visibility into what's under the compiler
- Packages that depend on languages
  - Depend on cxx@2011, cxx@2017, fortran@1995, etc.
  - Model langauges, openmp, cuda, etc. as virtuals





Compilers and runtime libs fully modeled as dependencies

@spackpm





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#### PubGrub

- Natalie Weizenbaum implemented awesome error reporting in Pub, the package manager for Dart
- Builds on a basic CDCL SAT solver with a data structure to keep track of conflicts and to generate great error messages
  - Model of PubGrub so far seems to be package/version
  - Has some custom callbacks to evaluate version constraints
- Optimization is done by exploring versions in order
  - We need multi-criteria optimization more complex tactics
  - lots of peoples' life work has gone into faster solvers than we think we could implement ourselves.
- Worried about implementing a custom solver in Python
  - We're solving more complex problems than most tools
  - Poetry, other Python-native solvers can already be quite slow, and they only deal with packages and versions





