# conda-forge



supporting the growth of the volunteer-driven, community-based packaging project

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EuroSciPy, 2022 · Aug 31st

#### We are part of the conda-forge core team





## Jaime Rodríguez-Guerra

Software eng, PhD in Biotech. Conda enabled my research on molecular simulation and biotechnology.







# Outline

#### ~30 mins

- 1. A brief overview of conda-forge
- 2. Organization and maintenance
- 3. Growth-driven community innovation
- 4. The future of the conda ecosystem

## **1**. A brief overview of conda-forge



## Historical context for conda

B. C.

2012

2013

- Install Python across platforms
- User permissions?
- Compiled extensions?
- Good luck, specially on Windows!

Continuum Analytics introduces Anaconda

Solves all those problems!

• conda and conda-build tools





## Binstar (Anaconda.org) empowers communities

• Single vendor bottleneck! Non-mainstream, niche packaging needs?

2014	Binstar Search Packages Q About Binstar Plans & Pricing Help	Log
	Package Everything	Username Password Login
IOOS	Binstar is a service that allows you to create and manage <b>public</b> and <b>private</b> package repositories	I forgot my password New to binstar? Sign up. Username
Bioconda		Email Password
Scitools	Omnia Astropy	Confirm password  I accept the Terms & Conditions

### Channel maintenance in pre-conda-forge times

Dioos / conda-recipes Public archive								
<> Code   Issues  A Pull requests  A	actions 🗄 Projects 🛱 Wiki							
P master - conda-recipes / recipes / netcdf4 /								
O ocefpaf Update netcdf stack								
COPYING	Update netcdf stack							
🗋 bld.bat	Move all to one directory							
🗅 build.sh	Use conda-build 2							
🗅 meta.yaml	Update netcdf stack							
🗅 run_test.py	Move all to one directory							

Set up like this:

- Mono-repo
- All recipes
- CI-driven
- Conda-build-all

#### Problems:

- Duplication of effort
- Subtle incompatibilities
- CI limits / scaling issues
- Permission granularity

## **Emergence of conda-forge**

2015

- Key idea: one recipe per repository!
  - CI limits 🔽
  - Granular permissions 🗸
  - 🔥 Cross-repository tooling needed!
- 🖵 conda-forge / conda-smithy designed to create and

update "feedstocks", repositories with this structure:



- onda build recipe (meta.yaml + build scripts)
- CI workflows
- Global configuration for conda build
- Supporting scripts and metadata

## 2. Organization and maintenance



## Foundational principles



## 7 years of successful growth!

🎂 2015/04/11 쓥 🎉 <b>7+</b> years 🎉	<ul> <li>4.2K maintainers,</li> <li>26 active core,</li> <li>15 staged-recipes</li> </ul>	17.2K repositories, 19.1K packages, 1M artifacts	<b>6</b> platforms Linux (x64, PPC, ARM) MacOS (x64, ARM) Windows (x64)
<b>&gt;172K</b> commits (157K by bots)	<b>247.3K</b> issues/PRs (236K closed)	<b>5 TB</b> storage*	<b>300M</b> dls, <b>1.4 PB</b> bandwidth per month*

## **Key benefits**

# Standardized build environments

Preconditioned system state (Docker images, preparation scripts)

Cross-repository conda build configuration

ABI-aware pinnings

$\leftarrow \rightarrow C$ $\triangleq$ cs.github.com/?scopeName=All+repos&scope=&q=path%3						
All repos	Q path:build.sh org:conda-forge					
Better collaboratio model	on		Bigger, unified community			
Per-package issue tracker			Sum > individual parts			
Granular interest			Ever-growing <u>corpus</u> of knowledge			
Focused help / onboarding			<u>Programmatic</u> insights, <u>build scripts wiki</u> !			

## Who runs conda-forge

- 100% community driven on <u>GitHub</u>
- <u>Core team</u>: 8 emeritus, 26 active
- 15 <u>Staged-recipes</u> + domain-specific <u>help teams</u>
- 4.2k maintainers, managing <u>17k repositories</u>
- inter, user commands, admin requests, migrations, staged to feedstock, artifact validation, repodata collection...







## How does it work?

conda install -c conda-forge numpy



## 3. Growth-driven innovation









Number of packages by architecture

Monthly Downloads by channel





#### Infrastructure

- Many concurrent package builds
- CDN "delay": the speed with which the channel is re-indexed & travels to CDN
- Managing repository integrity without rebuilding the world

#### **Client side**

- Large index files to be downloaded each time
  - $\circ$  ~120 Mb for Linux / 23 Mb gzip'd
- Huge solution space for the satisfiability solver (SAT solver)
  - long solving times

#### ON THE **CLOUD** SIDE

## Azure, GitHub Actions, cirun.io

- conda-forge "burned" through many CI services: Travis, Circle CI, Drone, ...
- Running at conda-forge scale: 200 parallel Azure runners
- Since a couple weeks: 60 parallel Github Actions runners
- Currently investigating cirun.io for long running builds
  - We have a time limit of 3 hours & 2 cores for builds on Azure
  - Qt, TensorFlow, Pytorch run longer  $\rightarrow$  need for custom runners
- Pre-test PRs using our bots & mamba to avoid unsolvable PRs



#### ON THE **CLOUD** SIDE Failovers: more mirrors

- Setup an OCI-registry mirror on Github packages (similar to Homebrew)
  - OCI registry is a vendor neutral spec implemented by many hosts
  - Available on https://github.com/orgs/channel-mirrors/packages
- Might lead to a faster CDN sync and faster build/migration times
- Ideally: Linux-style mirrors around the globe (like Universities, Telecom providers, ...)

https://github.com/mamba-org/conda\_oci\_mirror https://github.com/regro/cf-oci-mirror-action

#### ON THE CLOUD / CLIENT SIDE Repodata workarounds in place

#### current\_repodata.json

- A smaller package index only containing the latest packages
  - the latest version of each package
  - any earlier versions of dependencies needed to make the latest versions satisfiable

#### conda-forge-repodata-patches

- Repodata patching
  - Instead of rebuilding packages with "corrected" metadata we patch the repodata
  - Missing upper bounds on dependencies, wrong prioritization, ...

# ON THE **CLIENT** SIDE

**Mamba** 

- Faster solving, downloading and extracting
- Using
  - C++ as implementation language
  - libsolv for fast package resolution (also used by OpenSuse / RedHat's dnf)
  - libcurl for parallel downloads
  - libarchive for parallel extraction
- libsolv is using a back-tracking SAT solver vs. global optimization employed by conda

#### ON THE **CLIENT** SIDE

## Mamba CZI grant: more improvements coming!

- Use zchunk for repodata this will allow smaller repodata downloads
  - Only download updated chunks of repodata
- Support mirrors for distributed, fast & reliable downloads
  - Mirror support with automatic fastest mirror selection
  - OCI registries and S3 buckets support
  - Ongoing work to use Github packages OCI registry as cf-mirror
- Better error messages, inspired by PubGrub
  - Make error messages less confusing and add relevant information

### mambabuild & boa

#### conda mambabuild

- Monkey-patching conda-build to use libmamba as solver
- Default on conda-forge now

#### boa build ...

- Introduces a new recipe format (pure YAML)
- Use mamba as a solver

## **Continuing the growth**

#### Platforms:

- osx-arm64, linux-aarch64 & linux-ppc64le already available
- Experimental emscripten-32 support (emscripten-forge)

#### Programming languages:

- Python, C/C++, R historically good support among many others
- Rust and Go have great support now
- Lots of other up-and-coming ecosystems: Julia, Zig, Nim, ...



emscripten

## 4. The future of the conda ecosystem



### Behind conda-forge: challenges in conda

- Governance of "conda and friends" trails conda-forge
- Code bases need to cater to changing user base
- <u>CEPs</u> are central in future
- New maintenance and release strategy (<u>CEP 8</u>)
- Focus on and support of community efforts
- Maintenance is a process



Open conda and conda-build issues over the years

## Supporting mamba from conda

- conda-forge has additional requirements given its size and scope compared to Anaconda's channels or other smaller conda channels
- mamba clearly helping users with improved user experience
- What if parts of mamba would be integrated in conda?
  - 2021 work on building a integration layer between libmamba and conda
  - Available via conda-forge and Anaconda's defaults channel
  - Experimental release of conda-libmamba-solver in Q1/2022 to get feedback
  - Stable release expected in Q4/2022 with further optimizations
- More opportunities for collaboration on user-facing features, e.g. error reporting, I/O backend and similar user experience improvements

## Scaling for the community needs

- Lots of other components in the larger "conda and friends" ecosystem
- New plugin API (<u>CEP 4</u>) to achieve goals:
  - Improve usage of conda APIs and cater to "<u>Hyrum's Law</u>":

With a sufficient number of users of an API,

it does not matter what you promise in the contract:

all observable behaviors of your system

will be depended on by somebody.

- Facilitate additional use cases that don't fit conda's scope
- Allow more community innovation to happen
- Comprehensive documentation of explicit plugin APIs

## Updated conda/-incubator governance policy

- conda-forge **pioneered** community-driven innovation and required governance structure to scale it
- Leaner steering council with maximum number of 2 members per "funding source" to correct historic imbalance and prevent capture
- Provisional memberships to **onboard underrepresented community members** and organizations
- Submitted application for **fiscal sponsorship via NumFOCUS nonprofit** to pave the way for further project independence
- New Code of Conduct with **dedicated Code of Conduct team** for a more inclusive community
- Project and federated teams to provide organizational infrastructure for community projects

## conda-forge provides packages for all



## How can you help conda-forge?

If you like:

- Adding new functionality •
- Keeping things running
- Automation (like you're obsessed with automation, ····· ► • Bot team (docs, source, gitter) maybe too obsessed)
- Financially **supporting**

Then you should consider:

- Staged-recipes review team
- <u>General Q&A in gitter</u>
- General Feedstock maintenance
- **Documentation**

- NumFOCUS donation, earmarked for conda-forge
- Donations of servers, VMs or cloud storage ۲ (Anaconda, NVIDIA, OVHCloud, Quansight)



www.conda-forge.org

github.com/conda-forge

#### twitter.com/condaforge

gitter.im/conda-forge/conda-forge.github.io

## Thanks!



#### PyLadies Lunch @ EuroScipy: Wednesday 31<sup>st</sup> August – Room 028

### everyone is welcome



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