

Packaging software in portable manner with Singularity

**Olivier Mattelaer
UCLouvain
CP3 & CISM**

What do I want to cover



- What is a container
 - ➔ Why it can be interesting for you?



- Singularity: Container for HPC
 - ➔ Features
 - ➔ Limitations

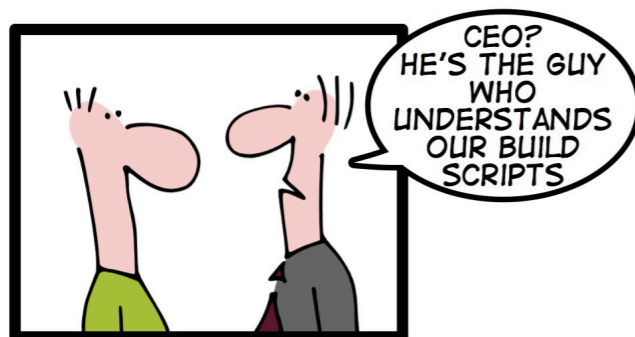
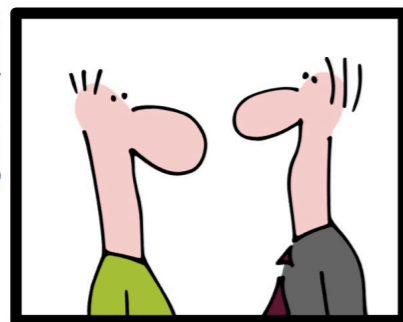
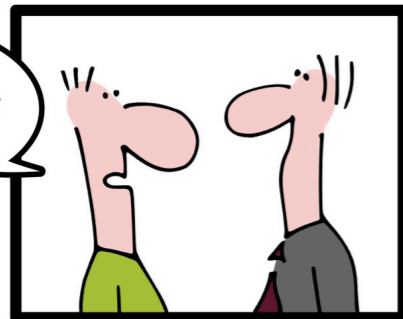


- Tutorial
 - ➔ Show that this is easy to do



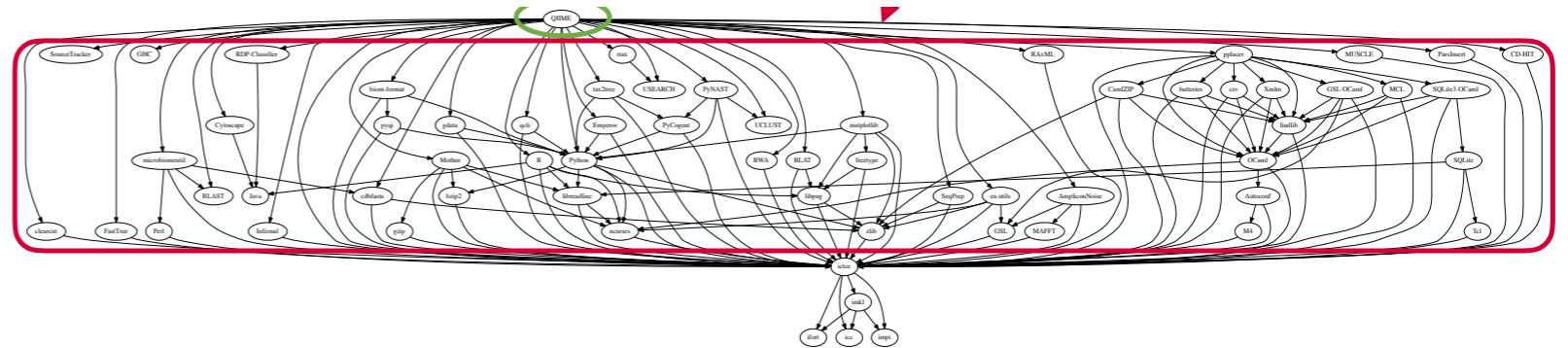
- HPC
 - ➔ Details on how to use our setup

Installing Software

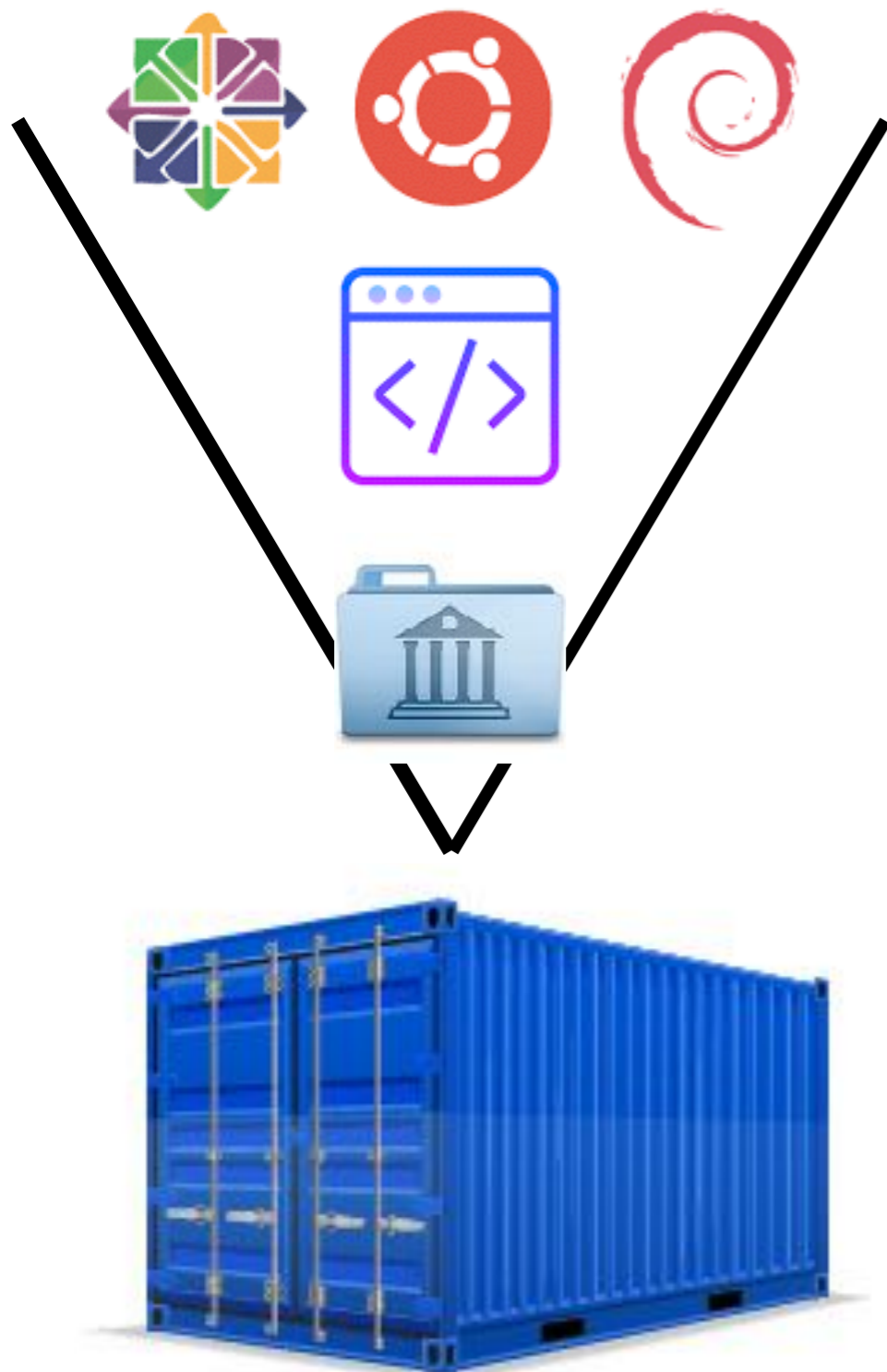


HOW TO BECOME INVALUABLE

- Tedious/complicated
 - ➔ For user
 - ➔ For sys-admin
- Dependencies Hell



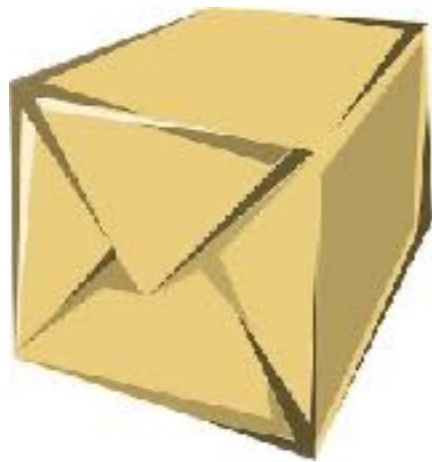
Container Solution



- machine agnostic code
 - ➔ A (small) OS
 - ➔ Your code (executable)
 - ➔ All the dependencies (libraries)
- That can run “everywhere”



What for?

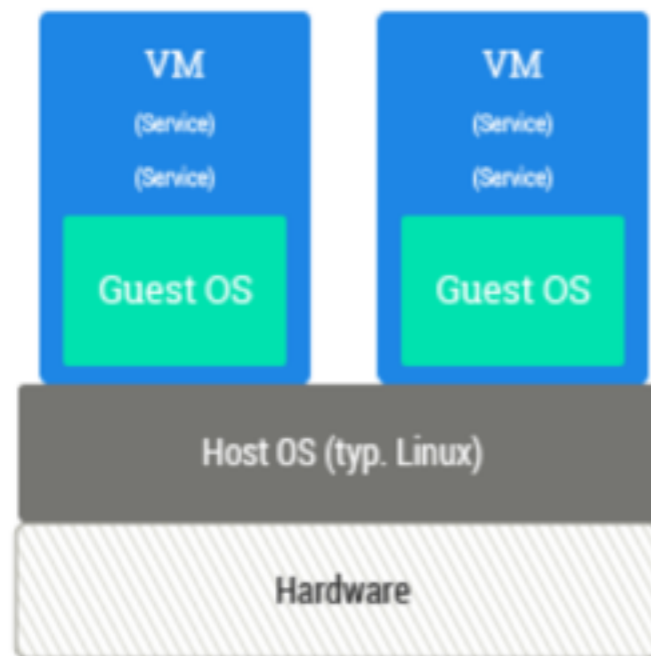


- ➔ **reproducibility** on any (unix) machine
 - ◆ **Nice** to send to a collaborator !
- ➔ **deployment** (cloud/laptop/hpc/...)
 - ◆ **Nice** to distribute the workload
- ➔ With a **paper**
 - ◆ **Nice** for being able to reproduce results
 - ◆ **Nice** for other scientists

VM versus container

VM

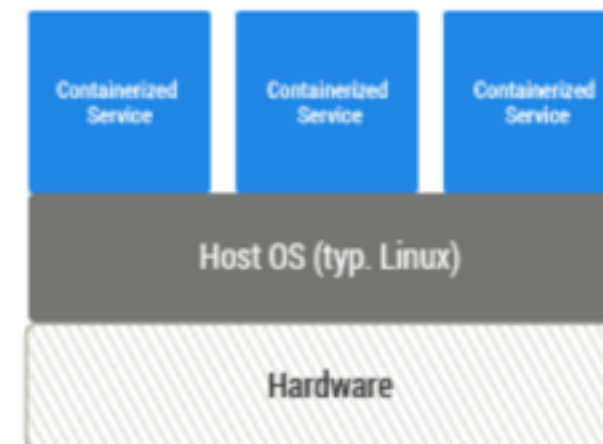
- virtualize the kernel
 - ➔ Hardware virtualisation



- ➔ Flexible
- ➔ slow/resource hungry

container

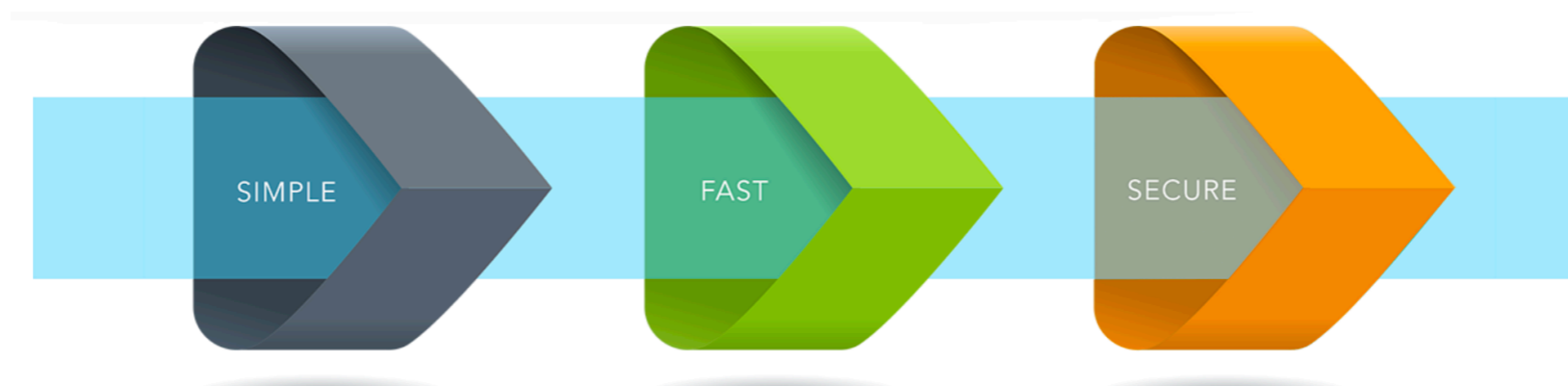
- Reuse the kernel
 - ➔ Software virtualisation



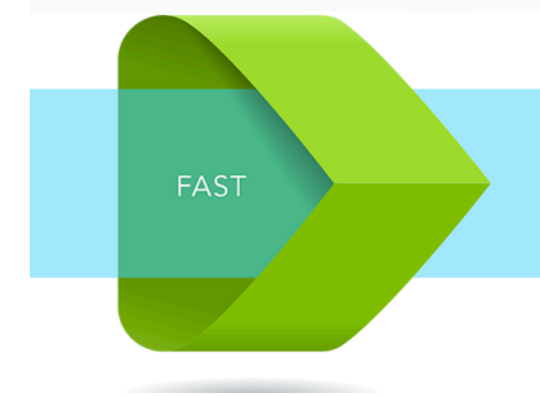
- ➔ Not multi os
- ➔ fast/light
 - ➔ OK for single app
 - ➔ Good for HPC

Containers History

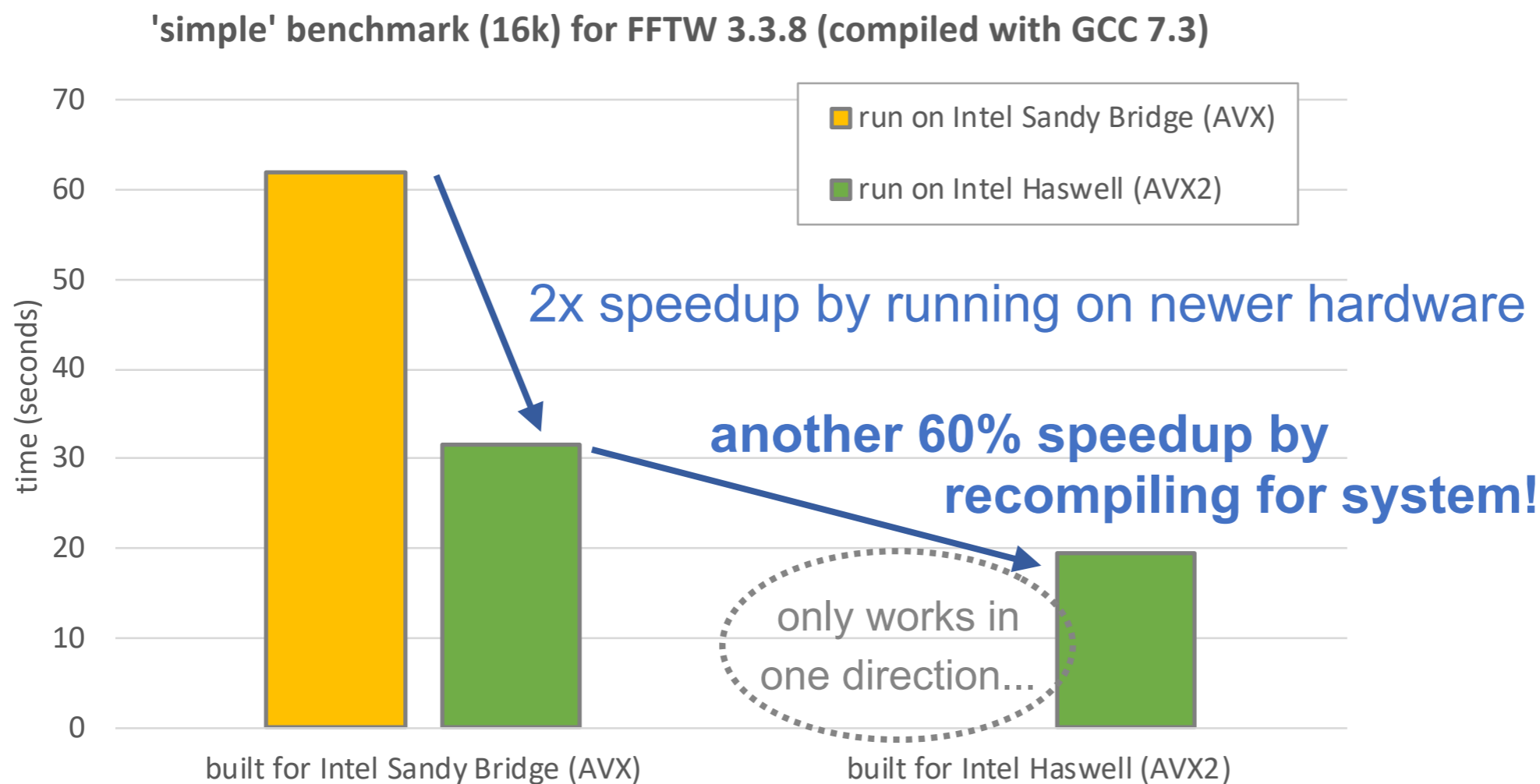
- Are an old idea
 - ➔ Chroot (1979), FreeBSD jails (2000), Solaris containers (2004), LXC (2008)
- Docker (2013)
 - ➔ For/with cloud computing
- Buzz for HPC containers starts ~ 2015
 - ➔ Docker tries to convince HPC structure and failed
- Singularity (2016)
 - ➔ HPC focus



Performance



- They claim “native” performance
 - ➔ understand “small” overhead (couple of percent)
 - ➔ No cpu optimisation



(FFTW 3.3.8 installed in Singularity container)

Plot taken from Kenneth Hoste

Hardware Optimisation

CPU



Need generic compilation

GPU



Special handling to handle GPU
Specific library at run time

MPI



No special handling
But actually needed

No portability here!

Install Singularity

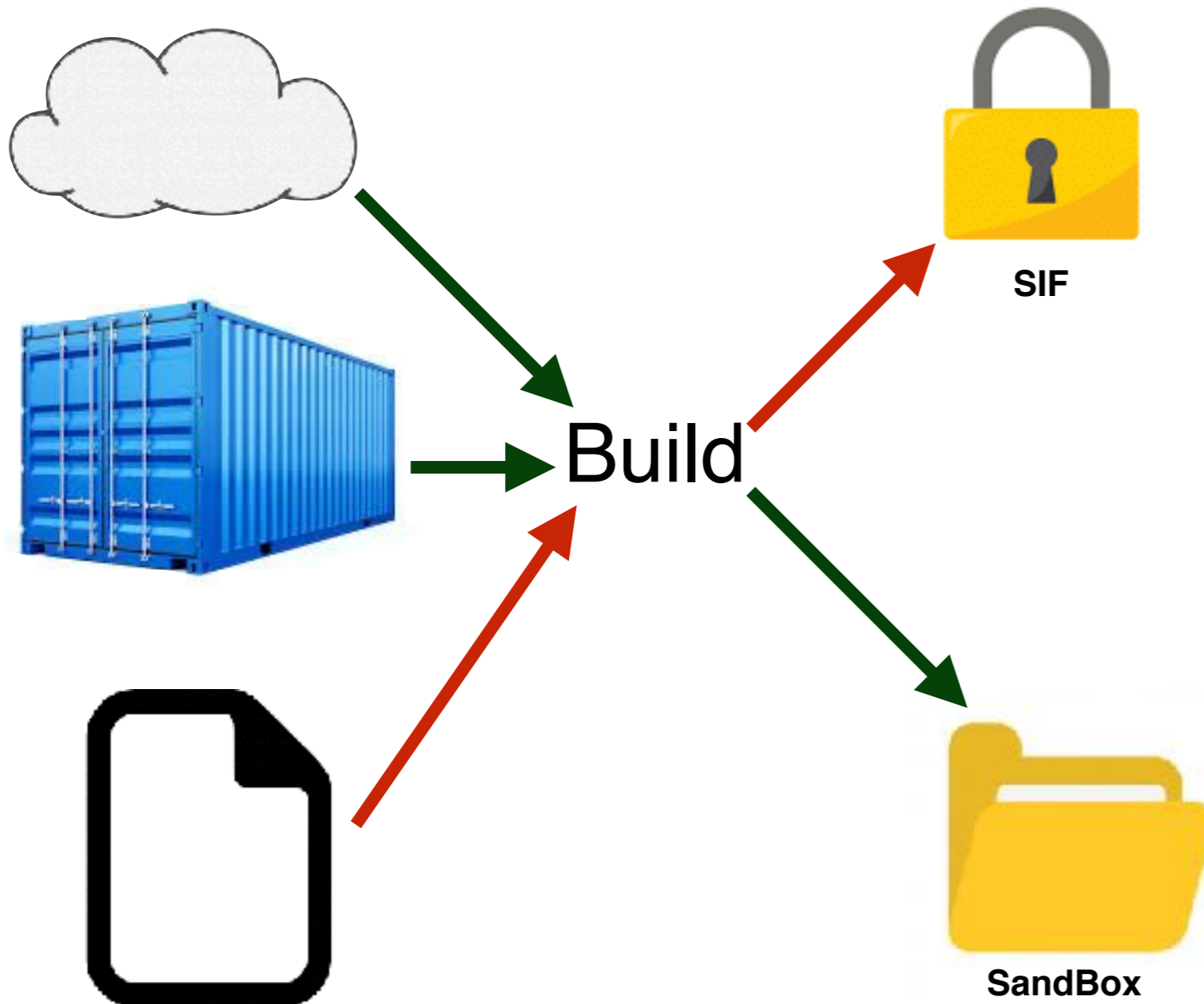
- On linux:
 - ➔ <https://sylabs.io/guides/3.9/user-guide/>
- On Windows or Mac (VM):
 - ➔ <https://sylabs.io/guides/3.9/admin-guide/installation.html#installation-on-windows-or-mac>
- On cluster
 - ➔ Use remote build
 - ➔ You are not allowed to be root on the cluster
 - ➔ (Rootless mode is not activated in CECI cluster)

Workflow

- Build
- Test
- Share
- Run

Building an image

```
$ sudo singularity build lolcow.simg shub://GodLoveD/lolcow
```



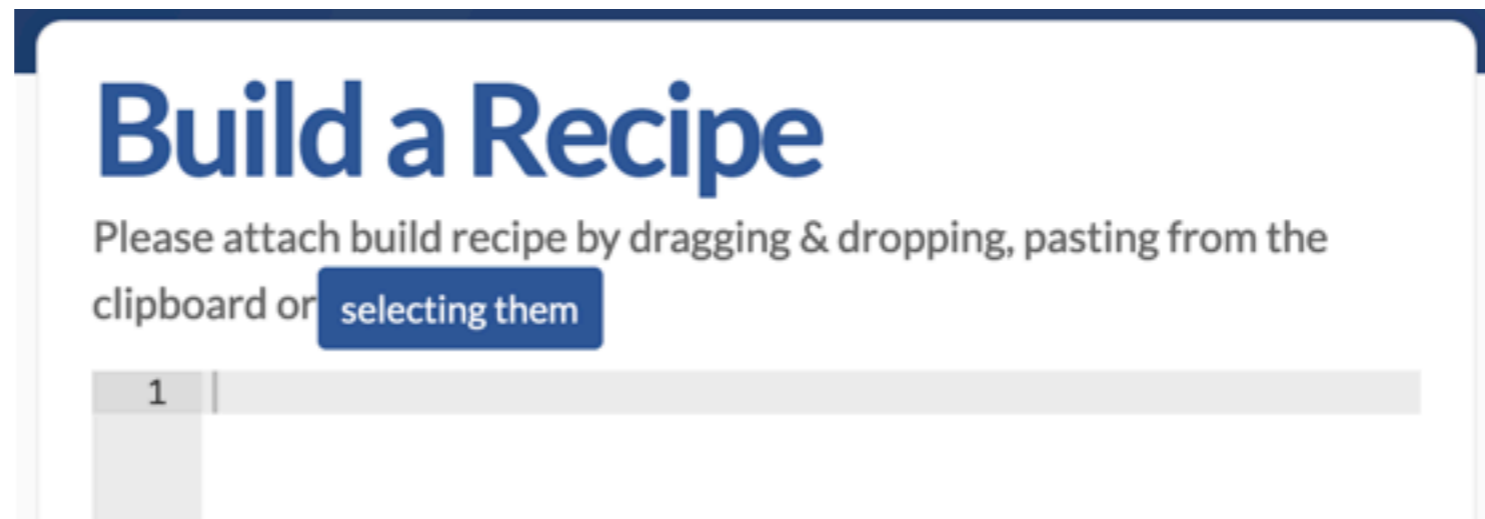
- Singularity Integrity File
 - ➔ Read-only (signed)
 - ➔ default
- Sandbox --sandbox
 - ➔ Full directory
 - ➔ Writable
 - ➔ Can break reproducibility

➔ Root privileges is always required

Remote build

- <https://cloud.sylabs.io/home>
 - ➔ Allow remote build (No need to be root on your machine)
 - ➔ You can do everything from the CECI clusters
 - ◆ No file transfer

Online



From laptop/cluster

```
[singularity]$ singularity build --remote test_remote.sif shub://Godlove
INFO: Remote "default" added.
INFO: Authenticating with remote: default
INFO: API Key Verified!
INFO: Remote "default" now in use.
INFO: Starting build...
      87.57 MiB / 87.57 MiB 100.00% 49.16 MiB/s 1sm01s
INFO: Creating SIF file...
INFO: Build complete: /tmp/image-968903817
```

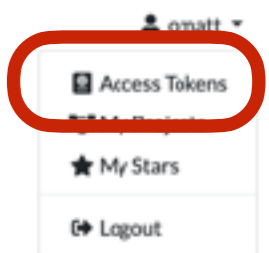
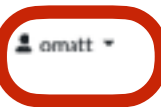
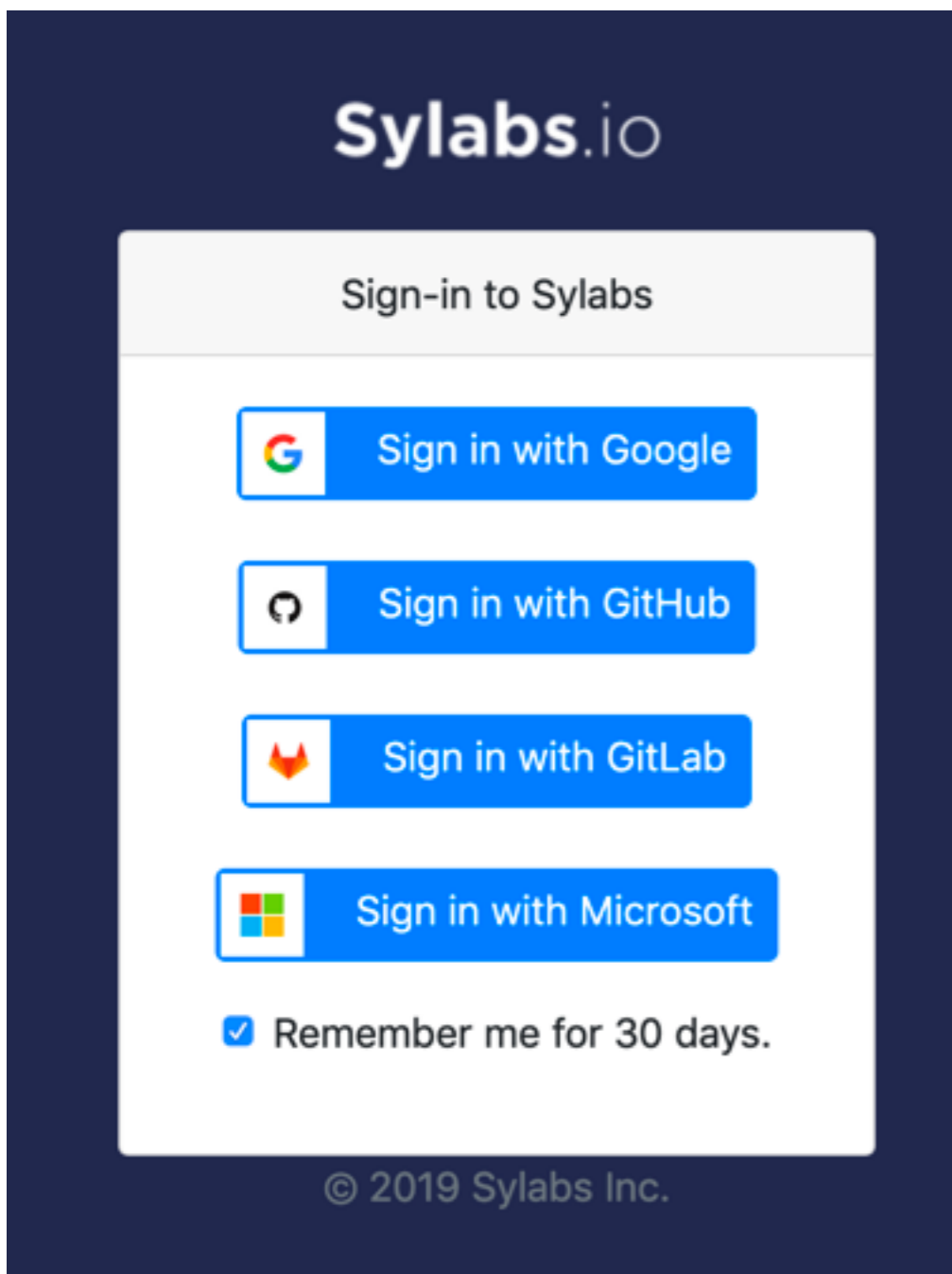
Remote build : Setup

- <https://cloud.sylabs.io/home>
 - ➔ Create an account



Remote build : Setup

- <https://cloud.sylabs.io/home>
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Remote build : Setup

- <https://cloud.sylabs.io/home>
 - ➔ Create an account
 - ➔ Run on the cluster/your machine:
 - ◆ singularity remote login

```
[macversion]$ singularity remote login
INFO:   Authenticating with default remote.
Generate an API Key at https://cloud.sylabs.io/auth/tokens, and paste here:
API Key:
INFO:   API Key Verified!
```

```
[macversion]$ singularity build --remote --sandbox hellocow library://sylabsed/examples/lolcow
INFO:   Remote "default" added.
INFO:   Authenticating with remote: default
INFO:   API Key Verified!
INFO:   Remote "default" now in use.
INFO:   Starting build...
INFO:   Downloading library image
INFO:   Creating SIF file...
INFO:   Build complete: /tmp/image-469591973
WARNING: Skipping container verifying
79.89 MiB / 79.89 MiB 100.00% 78.39 MiB/s 1s
```

➔ `export SINGULARITY_REMOTE=True`

Testing and Modifying image (sandbox)

```
vagrant@vagrant:~$ sudo singularity shell --writable hellocow/  
Singularity: Invoking an interactive shell within container...  
  
Singularity hellocow:~> |
```

- You can check that it has its own os:

```
Singularity hellocow:~> cat /etc/os-release  
NAME="Ubuntu"  
VERSION="16.04.3 LTS (Xenial Xerus)"  
ID=ubuntu  
ID_LIKE=debian  
PRETTY_NAME="Ubuntu 16.04.3 LTS"  
VERSION_ID="16.04"  
HOME_URL="http://www.ubuntu.com/"  
SUPPORT_URL="http://help.ubuntu.com/"  
BUG_REPORT_URL="http://bugs.launchpad.net/ubuntu/"  
VERSION_CODENAME=xenial  
UBUNTU_CODENAME=xenial  
Singularity hellocow:~> |
```

- If running without sudo
 - ➔ Can not become root in the image
- Running shell breaks reproducibility

Testing and Modifying image (II)

```
vagrant@vagrant:~$ sudo singularity exec -w hellocow/ apt-get install inetutils-ping
Reading package lists... Done
Building dependency tree
Reading state information... Done
The following NEW packages will be installed:
 inetutils-ping
0 upgraded, 1 newly installed, 0 to remove and 32 not upgraded.
Need to get 59.8 kB of archives.
```

- Test:

```
vagrant@vagrant:~$ sudo singularity exec -w hellocow/ ping yahoo.fr
PING yahoo.fr (124.108.115.101): 56 data bytes
64 bytes from 124.108.115.101: icmp_seq=0 ttl=63 time=280.565 ms
^C--- yahoo.fr ping statistics ---
2 packets transmitted, 1 packets received, 50% packet loss
round-trip min/avg/max/stddev = 280.565/280.565/280.565/0.000 ms
```

- Allow to create an image step by step and keep a script with all modification
 - ➔ What if we want something more powerful

Recipe file

```
Bootstrap: library
```

```
From: ubuntu:18.04
```

```
%runscript
```

```
    echo "Container was created $NOW"
```

```
    echo "Arguments received: $*"
```

```
    exec echo "$@"
```

```
%post
```

```
    apt-get update && apt-get install -y netcat
```

```
    NOW=`date`
```

Recipe file

```
Bootstrap: library  
From: ubuntu:18.04
```

Based on

```
%runscript
```

```
  echo "Container was created $NOW"  
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  echo "Container was created $NOW"  
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What to do

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%post  
  apt-get update && apt-get install -y netcat  
  NOW=`date`
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Recipe file

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apt-get update && apt-get install -y netcat  
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How to install

Recipe file

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Bootstrap: library  
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What to do

```
%post  
apt-get update && apt-get install -y netcat  
NOW=`date`
```

How to install

```
[vagrant@localhost singularity]$ sudo singularity build test.sing centos.def
```

Recipe file

```
Bootstrap: library
From: ubuntu:18.04

%setup
    touch /file1
    touch ${SINGULARITY_ROOTFS}/file2

%files
    /file1
    /file1 /opt

%environment
    export LISTEN_PORT=12345
    export LC_ALL=C

%post
    apt-get update && apt-get install -y netcat
    NOW=`date`
    echo "export NOW=\"${NOW}\"" >> $SINGULARITY_ENVIRONMENT

%runscript
    echo "Container was created $NOW"
    echo "Arguments received: $*"
    exec echo "$@"

%labels
    Author d@sylabs.io
    Version v0.0.1

%help
    This is a demo container used to illustrate a def file that uses all
    supported sections.
```

Also %test %startscript + support for app

Recipe file

Bootstrap: library
From: ubuntu:18.04

How to start (previous container/...)

```
%setup
  touch /file1
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Files copy into the container

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export LISTEN_PORT=12345  
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```

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```
apt-get update && apt-get install -y netcat  
NOW=`date`  
echo "export NOW=\"${NOW}\"" >> $SINGULARITY_ENVIRONMENT
```

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echo "Container was created $NOW"  
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Define environment variables

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Installation of software within the container

%runscript

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echo "Container was created $NOW"  
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```

Command run via “singularity run”

%labels

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Version v0.0.1
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%help

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Command run via “singularity run”

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Information about the container

%help

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Information about the container

%help

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This is a demo container used to illustrate a def file that uses all  
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```

Help about the container

Also %test %startscript + support for app

Recover recipe file

```
vagrant@vagrant:~$ singularity inspect --deffile lolcow_latest.sif
```

```
BootStrap: library
```

```
From: ubuntu:latest
```

```
%post
```

```
    apt-get -y update
```

```
    apt-get -y install fortune cowsay lolcat
```

```
%environment
```

```
    export LC_ALL=C
```

```
    export PATH=/usr/games:$PATH
```

```
%runscript
```

```
    fortune | cowsay | lolcat
```

Run with image

```
vagrant@vagrant:~/tuto2$ singularity exec hello cowsay 'I am a cow'
-----
< I am a cow >
-----
      \   ^__^
       (oo)\_____
          (__)\       )\/\
              ||----w |
              ||     ||
```

- Shell/piping works as normal

```
vagrant@vagrant:~/tuto2$ singularity exec hello cowsay 'I am a cow' > content
vagrant@vagrant:~/tuto2$ ls
content  GodLoveD-lolcow-master-latest.simg  hello  output  Singularity  Singularity~
vagrant@vagrant:~/tuto2$ cat content
-----
< I am a cow >
-----
      \   ^__^
       (oo)\_____
          (__)\       )\/\
              ||----w |
              ||     ||
```

- As said before filesystem is the one of the host

```
vagrant@vagrant:~/tuto2$ singularity exec hello /bin/touch cowsay_now
vagrant@vagrant:~/tuto2$ ls
content  cowsay_now  GodLoveD-lolcow-master-latest.simg  hello  output  Singularity  Singularity~
vagrant@vagrant:~/tuto2$
```

Run with image

- Image are executable! (not --sandbox)
 - ➔ ./lolcow.simg
 - ➔ Run the “%runscript” part of the definition file!
 - ◆ Behave as an app
 - Think of putting help/...

```
%runscript
    python /usr/local/bin/helloworld.py $@

%post
    echo "Hello from inside the container"
    apt-get update
    apt-get -y install python
    #          apt-get clean

%files
    helloworld.py /usr/local/bin
```

More on filesystem

- Special directory automatically mounted:
 - ➔ \$HOME, /tmp, /proc, /sys, /dev
- You can create different mount point
 - ➔ Allow you to specify the path to data/output (specific to system)

```
vagrant@vagrant:~/tuto2$ singularity run --bind /vagrant:/mnt ./hello.simg -i cowcay_now -o /mnt/cowcay_now
This is what happens when you run the container...
vagrant@vagrant:~/tuto2$
```

- ➔ File is now written in /vagrant of the VM
- Also possible via environment variable:
 - ➔ export SINGULARITY_BINDPATH=/vagrant:/mnt

Share

- You can store/distribute your singularity image via the singularity cloud
 - ➔ You can also provide your definition file directly online (easier)
- You need to **sign** your local container first: **Singularity sign container.sif**

```
vagrant@vagrant:~$ singularity sign hello.sif
WARNING: Authentication token file not found : Only pulls of public images will succeed
Signing image: hello.sif
No OpenPGP signing keys found, autogenerate? [Y/n] Y
Enter your name (e.g., John Doe) : Olivier Mattelaer
Enter your email address (e.g., john.doe@example.com) : olivier.mattelaer@uclouvain.be
Enter optional comment (e.g., development keys) :
Generating Entity and OpenPGP Key Pair... Done
Enter encryption passphrase :
Upload public key DCA006B1B8DC4D31DC6BB442FD9DFD89E3EEC81C to https://keys.sylabs.io? [Y/n] Y
INFO: Access token is expired or missing. To update or obtain a token:
  1) Go to : https://cloud.sylabs.io/
  2) Click "Sign in to Sylabs" and follow the sign in steps
  3) Click on your login id (same and updated button as the Sign in one)
  4) Select "Access Tokens" from the drop down menu
  5) Click the "Manage my API tokens" button from the "Account Management" page
  6) Click "Create"
  7) Click "Copy token to Clipboard" from the "New API Token" page
  8) Paste the token string to the waiting prompt below and then press "Enter"

WARNING: this may overwrite a previous token if ~/.singularity/sylabs-token exists

Paste Token HERE: 
```

```
Uploaded key successfully!
Enter key passphrase:
Signature created and applied to hello.sif
```

Share

- You can store/distribute your singularity image via the singularity cloud
 - ➔ You can also provide your definition file directly online (easier)
- You need to **sign** your local container first: **Singularity sign container.sif**
- Then you can push it to the cloud: **Singularity push container.sif LOCATION**
 - ➔ **LOCATION** should be **library://LOGIN/COLLECTIONS/FILES**

```
vagrant@vagrant:~$ singularity push hello.sif library://omatt/test/hello.sif
INFO:   Now uploading hello.sif to the library
 81.91 MiB / 81.91 MiB [=====] 100.00% 2.15 MiB/s 38s
INFO:   Setting tag latest
```

- You can now download/run it:
 - Singularity pull library://omatt/test/hello.sif
 - Singularity run library://omatt/test/hello.sif

```
vagrant@vagrant:~$ singularity run library://omatt/test/hello.sif
INFO:   Downloading library image
 81.91 MiB / 81.91 MiB [=====] 100.00% 801.39 KiB/s 1m44s

-----
/ You will be awarded the Nobel Peace \
\ Prize... posthumously.             /
-----

  \  ^__^
   (oo)\_____
      (__)\       )\/\
         ||----w |
         ||     ||
```

- Singularity is available on
 - ➔ Lemaitre3
 - ➔ dragon2
 - ➔ Hercules2
 - ➔ Nic5



MPI

https://support.ceci-hpc.be/doc/_contents/UsingSoftwareAndLibraries/Singularity/index.html

- MPI support requires

- ➔ That you install the same slurm version as the one on our cluster
- ➔ That you have the same version of mpi on the machine



- So you need **matching** pieces
 - ✓ We provide a starting container
 - ➔ Correct version of slurm
 - ➔ For each openmpi version
- You can use such container as base for your work

<https://sylabs.io/guides/3.6/user-guide/mpi.html?highlight=mpi>

MPI on lemaitre3

- Copy your source code

```
[singularity]$ scp lemaitre3:/CECI/soft/src/singularity/test.cc .  
test.cc 100% 695 443.9KB/s 00:00
```

- Create your container (based on the one provided)

```
ootStrap: library  
From: omatt/default/mpi:3.1.1  
  
%runscript  
  /usr/bin/mytest-mpi  
  
%files  
  test.cc /opt/test-mpi.c  
  
%post  
  echo "Hello from inside the container"  
  mpicc -o /usr/bin/mytest-mpi /opt/test-mpi.c
```

From is the image created for the CECI

- Copy your container on lm3 and run it

```
[omatt@lm3-m001 omatt]$ srun -n 4 -p debug,batch bash -c "singularity run -B \${LOCALSCRATCH}/:/localscratch ./test.sif"  
"br/>srun: job 68320768 queued and waiting for resources  
srun: job 68320768 has been allocated resources  
Hello world from processor lm3-w001.cluster, rank 0 out of 4 processors  
Hello world from processor lm3-w001.cluster, rank 1 out of 4 processors  
Hello world from processor lm3-w001.cluster, rank 2 out of 4 processors  
Hello world from processor lm3-w001.cluster, rank 3 out of 4 processors  
[omatt@lm3-m001 omatt]$
```

Note the binding path.

MPI bind method

- I failed to have it working on lemaitre3...
- Idea:
 - ➔ Compile your executable on the host
 - ➔ Move the binary within the singularity file
 - ◆ And nothing else
 - ➔ Link the host library on the flight

```
Bootstrap: docker
From: ubuntu:18.04

%files
    /tmp/mpitest /opt/mpitest

%environment
    export PATH="$MPI_DIR/bin:$PATH"
    export LD_LIBRARY_PATH="$MPI_DIR/lib:$LD_LIBRARY_PATH"
```

```
$ export MPI_DIR="<PATH/TO/HOST/MPI/DIRECTORY>"
$ mpirun -n <NUMBER_OF_RANKS> singularity exec --bind "$MPI_DIR" <PATH/TO/MY/IMAGE> </PATH/TO/E
```

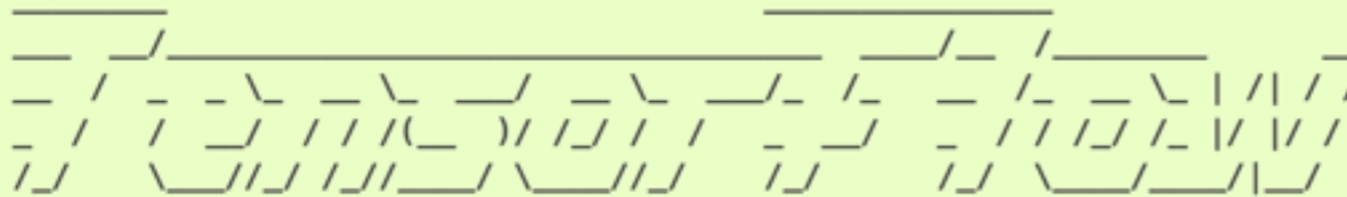
GPU

- Let's take a image with require some gpu

```
$ singularity pull docker://tensorflow/tensorflow:latest-gpu
...
INFO:   Creating SIF file...
INFO:   Build complete: tensorflow_latest-gpu.sif
```

- To link to the GPU, you need to add `--nv`

```
$ singularity run --nv tensorflow_latest-gpu.sif
```



```
You are running this container as user with ID 1000 and group 1000,
which should map to the ID and group for your user on the Docker host. Great!
```

```
Singularity>
```

Hands-on Session

- Follow the tutorial at the following page:
 - ➔ <https://github.com/oliviermattelaer/Singularity-Tutorial>

Conclusion

- Singularity
 - ➔ Nice way to share code with colleague
 - ➔ Portability and reproducibility
- Few command to learn
 - ➔ But not that complicated!
- Need to be root on machine
 - ➔ Ok that's annoying...
 - ✦ Virtual machine option quite practical
 - ➔ Remote building exists for recipe files