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Introduction to Containers

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Overview



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- Why do we want to use containers?
- Containers basics
- Run a pre-made container
- Build and deploy a container
- Containers for complex software



Hands on setup



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1. Download the talk slides

http://home.chpc.utah.edu/~mcuma/chpc/Containers20s.pdf https://tinyurl.com/yd2xtv5d

2. Using FastX or Putty, ssh to any CHPC Linux machine, e.g.

\$ ssh uxxxxxx@frisco.chpc.utah.edu

3. Load the Singularity and modules

\$ module load singularity



Hands on setup for building containers



- Create a GitHub account if you don't have one https://github.com/join
 {Remember your username and password!}
- 2. Go to https://cloud.sylabs.io/home click Remote Builder, then click Sign in to Sylabs and then Sign in with GitHub, using your GitHub account
- 3. Go to https://cloud.sylabs.io/builder
 click on your user name (upper right corner), select Access Tokens, write token name, click Create a New Access Token, and copy it
- 4. In the terminal on frisco, run the following command and paste the token when prompted:
 - singularity remote login



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Why to use containers?



Software dependencies



- Some programs require complex software environments
 - OS type and versions
 - Drivers
 - Compiler type and versions
 - Software dependencies
 - glibc, stdlibc++ versions
 - Other libraries and executables
 - Python/R/MATLAB versions
 - Python/R libraries



Reproducible research



- Research outputs include software and data
- Software reproducibility
 - Software repositories (svn, git)
 - Good but often software has dependencies
- Data reproducibility
 - Data as publication supplementary info, centralized repositories (NCBI), ...
 - Disconnected from the production environment
- Package data AND code AND compute environment in one file



Scalable research



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- Develop a program / pipeline locally, run globally
- Scale to parallel resources
 - Run many times
 - Use local or national HPC resources
- Automate the process
 - Container/software building and deployment
 - Parallel pipeline



Additional bonus

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- Old applications built on old Linux versions can run on newer Linux host, and vice versa
- May be able to run Windows programs on Linux



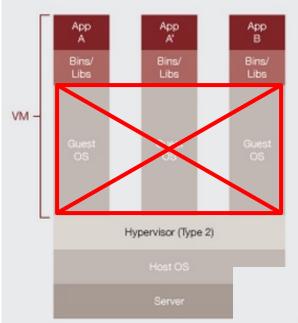
Container basics



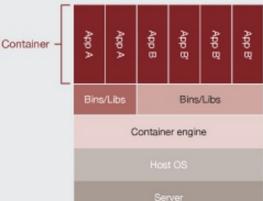
Virtualization basics



- Hardware virtualization
 - Running multiple OSes on the same hardware
 - VMWare, VirtualBox
- OS level virtualization
 - run isolated OS instance (guest) under a server OS (host)
 - Also called containers; user defined software stack (UDSS)
 - Docker, Singularity



Containers are isolated, but share OS and, where appropriate, bins/libraries





Containers



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- Isolate computing environments
 - And allow for regenerating computing environments
- Guest OS running over host OS
 - Guest's OS can be different that host's
 - Low level operations (kernel, network, I/O) run through the host
- From user standpoint guest OS behaves like standard OS



Container solutions



Docker



- Well established
- Has docker hub for container sharing
- Problematic with HPC
- Singularity
 - Designed for HPC, user friendly
 - Support for MPI, GPUs
- Charliecloud; Shifter, udocker
 - Also HPC designed, built on top of Docker
 - Simple but less user friendly





Container solutions - contd.



- OS vendor tools
 - RedHat Podman, Buildah, Skopeo new with RHEL 8
- Other Linux based container solutions
 - runC, LXC
- Orchestration tools
 - use containers to spin up servers
 - Kubernetes, Docker Compose



Singularity containers



- Integrate with traditional HPC
 - Same user inside and outside of the container
 - Same file systems (home, scratch), environment
 - Can integrate with existing software (CHPC sys branch)
- Portable and sharable
 - A container is a file
 - It can be built on one OS and run on another
- Only Linux support right now
- Possible security issues due to the use of setUID executables
 - Hacker can exploit potential flaws in setUID programs to gain root
 - https://sylabs.io/guides/3.6/user-guide/security.html





An aside into security



- Containers need privilege escalation to run
 - Give sudo
 - Run root owned daemon process (Docker)
 - Use setUID programs (programs which parts can run in privileged mode)
 (Singularity now, udocker)
 - User namespaces new Linux kernel feature to further isolate users (Charliecloud, limited Singularity, Docker)
 - Linux capability set fine grained privilege isolation (Singularity future)
- In HPC environment
 - setUID if you have some trust in your users, user namepaces if you don't
 (and have newer Linux distribution e.g. CentOS >= 7.4)



Singularity workflow





Interactive Development

sudo singularity build --sandbox tmpdir/ Singularity

sudo singularity build --writable container.img Singularity

BUILD ENVIRONMENT

Build from Recipe

sudo singularity build container.img Singularity

Remote build on Sylabs Cloud

sude singularity build --remote container.img Singularity

Build from Docker

sudo singularity build container.img docker://ubuntu

Container Execution

singularity run container.img singularity shell container.img singularity exec container.img ...

Reproducible Sharing

singularity pull shub://...
singularity pull docker://... *

PRODUCTION ENVIRONMENT

^{*} Docker construction from layers not guaranteed to replicate between pulls



Run a pre-made container



A few pre-requisites



- Building a container requires a root, or sudo
 - You can do that on your own machine
 - You can do that in the cloud (e.g. Sylabs Cloud, Docker Hub).
 - You can't do that at CHPC clusters
 - -> build your containers locally, or on container hubs
- You can run a container as an user
 - You can run your own containers at CHPC
 - You can run CHPC provided containers at CHPC
 - You can run containers obtained on the internet at CHPC



Basic principles



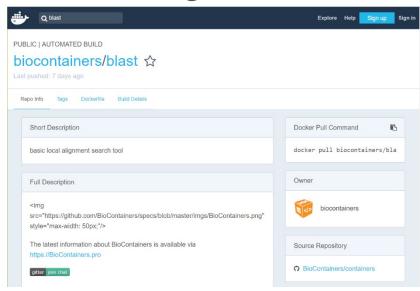
- Containers are run in user space (no root required)
- An appropriate environment module has to be loaded
 - Singularity, udocker, Charliecloud
- User inside of the container
 - Current user
 - If specified, other user, including root
 - Root inside container is contained = can't be root outside
- Containers can't be modified by non-root user
 - One small exception with udocker



Container registries and repositories



- Most containers reside in registries
 - Content delivery and storage systems for container images
- Docker Hub is the most common registry
 - https://hub.docker.com
 - Contains many channels, e.g. Biocontainers (<u>http://biocontainers.pro/</u>)
- There are a few other registries
- Sylabs (Singularity) also has a hub (library)
 - We'll use it to build a container



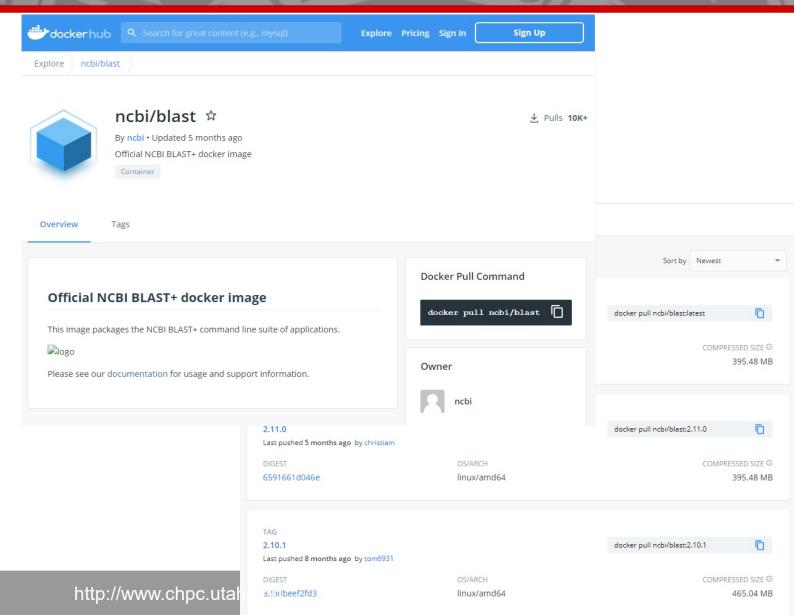




- Google or hub.docker.com search
 - E.g. "blast docker"
- Use singularity (Sylabs library) search

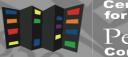
\$ singularity search lammps
Found 4 containers for 'lammps'
library://lammps/default/la
mmps development

Tags: centos7
centos8 fedora30_mingw
fedora32_mingw ubuntu16.04
ubuntu18.04 ubuntu18.04_amd_rocm
ubuntu18.04_amd_rocm_cuda
ubuntu18.04_intel_opencl
ubuntu18.04 nvidia ubuntu20.04





UNIVERSITY Run container with Singularity





- To get a shell in a container singularity shell
- \$ singularity shell docker://ubuntu:latest
- To run a command in a container singularity exec
- \$ singularity exec docker://ubuntu:latest cat /etc/os-release
- To run default command in a container singularity run
- \$ singularity run docker://python
- \$ singularity pull docker://python
- \$./python-latest.sif
- default command is defined with Docker's ENTRYPOINT or CMD or Singularity's runscript
- To inspect a container singularity inspect
- \$ singularity inspect --runscript python-latest.sif





- pull will download the container and create sif file
- build does the same but names sif file and has more options
- run/exec will download if needed and run

```
$ singularity pull docker://ubuntu:latest
   -Singularity pulls the Docker layers to ~/.singularity, but puts sif file to local directory
$ singularity build my_ubuntu.sif docker://ubuntu:latest
$ ls
my_ubuntu.sif ubuntu_latest.sif
$ singularity exec ubuntu_latest.sif /bin/bash
$ singularity shell ubuntu_latest.sif
```

Files in and out of the container



Let's create a Python script

echo 'print("hello world from the outside") ' > myscript.py

- Now run this script using the system's Python python ./myscript.py
- Now run the script in the DockerHub python container singularity exec docker://python python ./myscript.py

...<u>Conclusion</u>: Scripts and data can be kept inside or outside the container. In some instances (e.g., large datasets or scripts that will change frequently) it is easier to containerize the software and keep everything else outside.



Bind mounting and shell



- Map host file systems into the container
- May be needed for non-standard named file systems
- Container has to recognize / uufs and / scratch
 - Singularity mounts common file systems automatically
 - CHPC specific file systems are added in Singularity module

```
$ export SINGULARITY_BINDPATH="/tmp"
```

- \$ singularity shell -B /scratch/local/\$USER/\$SLURM_JOBID:/tmpubuntu python.img
- Specifying shell
- \$ export SINGULARITY_SHELL=/bin/bash
- \$ singularity shell -s /bin/bash ubuntu python.img



Using GPUs



- Need to bring in the Nvidia driver stack
 - --nv runtime flag brings the drivers from the host
 - Still need to have a compatible CUDA installed in the container (older than or the same as the driver)

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- The present NVIDIA Driver at CHPC is 450.51, which is compatible with CUDA 11.0 or lower.
- This means you can build a container by bootstrapping a base NVIDIA CUDA image (11.0 or lower) from: https://hub.docker.com/r/nvidia/cuda/
- On a GPU node, can e.g. execute:

```
singularity exec --nv docker://tensorflow/tensorflow:latest-gpu python -c
"import tensorflow as tf; tf.config.list physical devices()"
```



Using MPI and InfiniBand



- Need to bring the IB stack in the container
 - Some people bring the needed IB libraries from the host
 - For Ubuntu we prefer to install the Ubuntu stack
 - https://github.com/CHPC-UofU/Singularity-ubuntu-mpi

MPI

- Build inside the container with IB, or use CHPC's modules
- Prefer MPICH and derivatives, OpenMPI is very picky with versions
- If using OS stock MPI, then make sure to LD_PRELOAD or LD_LIBRARY_PATH ABI compatible libmpi.so with InfiniBand
- https://github.com/CHPC-UofU/Singularity-meep-mpi



Using Lmod from containers



- Many Linux programs are binary compatible between distros
 - Most installed binaries are (Intel, PGI tools, DDT, ...)
- No need to install these in the container use our NFS mounted software stack through Lmod
 - Need to have separate Lmod installation for Ubuntu due to some files having different location
- In the container
 - Install Lmod dependencies
 - Modify /etc/bash.bashrc to source our Lmod

https://github.com/CHPC-UofU/Singularity-ubuntu-python/blob/master/Singularity



Useful container repositories



- General HPC
 - Nvidia Container Toolkit https://github.com/NVIDIA/nvidia-docker
 - E4S Extreme-scale Scientific Software Stack https://e4s.io
 - 50 programs, incl. GPU, multiple Linux Distros
 - Many other projects
- Interpreted languages
 - R Rocker https://www.rocker-project.org/
 - Python official DockerHub https://hub.docker.com/ /python



Building Singularity containers

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Hands on setup for building containers

- Create a GitHub account if you don't have one https://github.com/join
 {Remember your username and password!}
- 2. Go to https://cloud.sylabs.io/home click Remote Builder, then click Sign in to Sylabs and then Sign in with GitHub, using your GitHub account
- 3. Go to https://cloud.sylabs.io/builder
 click on your user name (upper right corner), select Access Tokens, write token name, click Create a New Access Token, and copy it
- 4. In the terminal on frisco, run the following command and paste the token when prompted:
 - singularity remote login



Recall: container execution



- On any system with Singularity, even without administrative privilege, you can retrieve and use containers:
- Download a container from Docker Hub

```
singularity pull docker://some_image
singularity build mycont.sif docker://some_image
```

Run a container

```
singularity run mycont.sif
```

- Execute a specific program within a container
 - singularity exec mycont.sif python myscript.py
- "Shell" into a container to use or look around

```
singularity shell mycont.sif
```

Inspect an image

```
singularity inspect --runscript mycont.sif
```



When to build own containers



- Complex software dependencies
 - Especially Python and R packages
 - bioBakery intricate dependencies of Python and R which did not build on CentOS
 - SEQLinkage instructions to build on Ubuntu using its packages
- Quick deployment
 - Some Linux distros provide program packages while others don't
 - paraview-python on Ubuntu via apt-get
- Deploying your own code or pipeline
- Modify or add onto an existing container



Container build strategy



- Start with a the basic container (e.g. ubuntu:latest from Docker)
- Shell into the container
 - Install additional needed programs
 - If they have dependencies, install the dependencies google for the OS provided packages first and install with apt-get/yum if possible
 - Put the commands in the %post scriptlet
- Build the container again
 - Now with the additional commands in the %post
 - If something fails, fix it, build container again
- Iterate until all needed programs are installed

Two ways of building containers



- Build a container on a system on which you have administrative privilege (e.g., your laptop, singularity.chpc.utah.edu).
 - Pros: You can interactively develop the container.
 - Cons: Requires many GB of disk space, requires administrative privilege, must keep software up-to-date, container transfer speeds can be slow depending on personal network connection.
- Build a container on Sylabs Cloud
 - Pros: Essentially zero disk space required on your system, doesn't require administrative privilege, no software upgrades needed, easy to retrieve from anywhere, typically faster transfers from Sylabs Cloud to desired endpoint, interactive container development works.
 - Cons: Need to set up access to Sylabs Cloud, slower interactivity in the container development.



Container build process



- Create a writeable container (the only choice in PE)
- \$ singularity build --sandbox mycont.sif ubuntu16.def
 - This creates a container directory called mycont.sif
- If additional installation is needed after the build
 - Shell into the container and do the install manually
- \$ sudo singularity shell -w -s /bin/bash mycont.img
 - Execute what's needed, modify container definition file, repeat
- When done, create a production container
- \$ sudo singularity build ubuntu16.sif ubuntu16.def

Container definition file (a.k.a. recipe)



- Defines how the container is bootstrapped
 - Header defines the core OS to bootstrap
 - Sections scriptlets that perform additional tasks
- Header
 - Docker based (faster installation)

BootStrap: docker

From: ubuntu:latest

Linux distro based

BootStrap: debootstrap

OSVersion: xenial

MirrorURL: http://us.archive.ubuntu.com/ubuntu/

```
Bootstrap:docker
From:ubuntu:latest
%labels
MAINTAINER Andy M
%environment
HELLO_BASE=/code
export HELLO_BASE
%runscript
echo "This is run when you run the image!"
exec /bin/bash /code/hello.sh "$@"
echo "This section is performed after you bootstrap to build the image."
mkdir -p /code
apt-get install -y vim
echo "echo Hello World" >> /code/hello.sh
chmod u+x /code/hello.sh
```



Definition file sections



- %setup Runs on the host
 - Install host based files (e.g. GPU drivers)
- %post Runs in the container
 - Install additional packages, configure, etc
- %runscript Defines what happens when container is run
 - Execution commands
- %test Runs tests after the container is built
 - Basic testing



Definition file sections cont'd



- %environment Definition of environment variables
- %files Files to copy into the container
- %labels Container metadata
- %help What displays during singularity help command

More details at

https://sylabs.io/guides/3.6/user-guide/definition_files.html



Building a container on Sylabs Cloud



- 1. Have a Sylabs Cloud account and its token linked to your CHPC account
- 2. Log in to Frisco: ssh uxxxxxx@frisco1.chpc.utah.edu
- 3. Create a recipe file for your container, name it "Singularity", e.g.

```
$ nano Singularity
Bootstrap: docker
From: alpine:3.9
%post
apk update; apk upgrade; apk add bash
To exit and save type [ctrl-x], then "y", then [enter].
```

4. Initialize Singularity and use -remote option to build

```
$ ml singularity
$ singularity build --remote alpine.sif Singularity
```

- 5. Container will be built in Sylabs Cloud and sif file brought back
- 6. Verify that the container is available by opening shell in it \$\singularity\$ shell alpine.sif



Troubleshooting and Caveats

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Host/container environment conflicts

- Container problems are often linked with how the container "sees" the host system. Common issues:
- The container doesn't have a bind point to a directory you need to read from / write to
- The container will "see" python libraries installed in your home directory (and the same is true for R and other packages). If this happens, set the PYTHONPATH environment variable in your job script so that it points to the container paths first.

```
export PYTHONPATH=<path-to-container-libs>:$PYTHONPATH
```

- or use the --cleanenv option
- To diagnose the issues noted above, as well as others, "shelling in" to the container is a great way to see what's going on inside.
- Also, look in the singularity.conf file for system settings (can't modify).



Pull and build errors



- Failures during container pulls that are attributed (in the error messages) to *tar.gz files are often due to corrupt tar.gz files that are downloaded while the image is being built from layers. Removing the offending tar.gz file will often solve the problem. Look for them in the ~/.singularity directory
- When building ubuntu containers, failures during *%post* stage of container builds from a recipe file can often be remedied by starting the *%post* section with the command "apt-get update". As a best practice, make sure you insert this line at the beginning of the *%post* section in all recipe files for ubuntu containers.



Overlays



- Overlays are additional images that are "laid" on top of existing images, enabling the user to modify a container environment without modifying the actual container. Useful because:
- Overlay images enable users to modify a container environment even if they don't have root access (though changes disappear after session)
- Root users can permanently modify overlay images without modifying the underlying image.
- Overlays are a likely way to customize images for different HPC environments without changing the underlying images.
- More on overlays:
 https://www.sylabs.io/guides/3.6/user-guide/persistent overlays.html



Moving containers



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- You've built your container on your laptop. It is 3 Gigabytes. Now you want to move it to CHPC to take advantage of the HPC resources. What's the best way?
- Containers are files, so you can transfer them to CHPC just as you would a file:
- Command line utilities (scp, sftp)
- Globus or rclone (recommended)
 https://www.chpc.utah.edu/documentation/software/globus.php
- For more on data transfers to/from CHPC:
 https://www.chpc.utah.edu/documentation/data services.php



Containers for complex software

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Example - bioBakery







- Install VirtualBox, Vagrant, and bioBakery from an archive
 - Great for a desktop, but, not for an HPC cluster
- Further below they mention Google Cloud
- So we download the bioBakery archive, unpack it and look inside
 - Great, there is google_cloud/build_biobakery.sh script
 - In that file, Ubuntu 16.04 is mentioned



Building bioBakery container



Build base Ubuntu 16.04 container



- sudo shell into the container
 - Start executing the lines of the build_biobakery.sh script, one after another
 - Some dependencies pop up, install them
 - Another caveat Linuxbrew requires to be installed as non-root
 - Do some web searching and figure how to add a new user and run Linuxbrew as this user
 - In the end, add the correct paths to the container environment
- \$ echo "export PATH=/usr/local/bin:\$PATH" >> /environment



Building bioBakery container

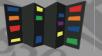




- Once everything installs in the container
 - Run the bioBakery tests
 - Add %test section that run the bioBakery tests
 - Build the container again, now it will run the tests (will take a few hours)
- Create a module file or an alias to start the container
- See it all at

https://github.com/CHPC-UofU/Singularity-bioBakery

Y Current bioBakery - DockerHub



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- No need to do this now as bioBakery is on DockerHub
- https://hub.docker.com/u/biobakery
- singularity pull biobakery/workflows
- Container has been uploaded, no Dockerfile
- Better alternative is to link DockerHub with GitHub for automated container builds
 - E.g. rocker, https://hub.docker.com/u/rocker
 - https://docs.docker.com/docker-hub/builds/link-source/



Resources



- http://sylabs.io
- http://cloud.sylabs.io
- https://www.chpc.utah.edu/documentation/software/container
 s.php

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https://github.com/CHPC-UofU



Questions?



Extra slides



Windows in a container?



Windows and HPC



- What, Windows?
 - There are programs that researchers use that only run on Windows

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- E.g. data processing that comes with an instrument
- Our current approach
 - Tell them to run on our only Windows server
 - Gets oversubscribed quickly
 - Build a specific VM
 - Resource intensive for us, not high performing
- What if we could run Windows programs on our Linux clusters

Wine



- Windows compatibility layer on Linux
 - https://www.winehq.org/
 - Not an emulator translates Windows system calls to Linux, provides alternative Windows system libraries,...
 - Actively developed, under CodeWeavers company umbrella
 - Windows ABI completely in user space
 - Most Linux distros come with some version of Wine
 - Generally better to use recent Linux distros for more recent Wine version (https://www.winehq.org/download)



Winetricks



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- While Wine provides the basic Windows support, Winetrics is a set of scripts that install additional Windows libraries
 - Like library dependencies in Linux
 - winetricks list to list available libraries
 - Most commonly used libraries are DirectX, .NET, VB or C runtimes



Wine and Singularity



- Poached out of http://dolmades.org/
- Basic Singularity container
 - Recent Ubuntu or Fedora
 - Some winetricks work better on Fedora than Ubuntu, and vice versa
 - Include Wine repo from winehq to get the latest Wine version
 - Some experimentation is needed but if the Windows program is not complicated, chances of success are there



%post section



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Install Wine and Winetricks

```
dpkg --add-architecture i386
apt update
apt -y install wget less vim software-properties-common
python3-software-properties apt-transport-https winbind
wget https://dl.winehq.org/wine-builds/Release.key
apt-key add Release.key
apt-add-repository https://dl.winehq.org/wine-builds/ubuntu/
apt update
apt install -y winehq-stable winetricks
```



User space



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- User application
 - Done in %runscript section
 - First container launch creates WINEPREFIX (Windows file space), then installs the needed applications, and tars the whole WINEPREFIX for future use
 - Subsequent container launch untars WINEPREFIX and launches program



%runscript section



```
TEMPDIR="$ (mktemp -d)"
APPDIR="$HOME/WINE/Topofusion"
PROFILEDIR="$HOME/WINE/PROFILES/${USER}@${HOSTNAME}"
export WINEPREFIX="$TEMPDIR/wineprefix"
export WINEARCH="win32"
if [ -f "$APPDIR/wineprefix.tgz" ]; then
    echo "Found existing wineprefix - restoring it..."
    mkdir -p "$WINEPREFIX"; cd "$WINEPREFIX"; tar xzf "$APPDIR/wineprefix.tgz"
else
  wineboot --init
  echo "Installing TopoFusion and its dependencies ..."
  winetricks dlls directx9 vb6run
  wget http://topofusion.com/TopoFusion-Demo-Pro-5.43.exe
fi
wine ./TopoFusion-Demo-Pro-5.43.exe
```



Examples



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- IDL 6.4 runtime + PeakSelector
 - IDL runtime under Linux crashes due to IDL bug
 - Windows runtime works fine, older IDL (ca. 2010)
 - https://github.com/CHPC-UofU/Singularity-ubuntu-wine-peakselector
- Topofusion
 - My favorite GPS mapping program, e.g.
 http://home.chpc.utah.edu/~mcuma/summer16/madison/wed/
 - Needs DirectX and VB runtime
 - https://github.com/CHPC-UofU/Singularity-ubuntu-wine-topofusion



Caveats (failed examples)



- Very new application (Win10 like)
 - Installer was not functional under Wine
- Complex scientific application
 - NET did not install on Ubuntu, worked on Fedora
 - Microsoft SQL did not install show stopper
- Wine application compatibility
 - https://appdb.winehq.org/
 - Notice a lot of games



Outlook



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- Success rate 2 out of 4 is not that great
 - Still worth trying, the chances are there
 - Singularity makes it easier to experiment
- It would be nice to have a HPC support for Windows so that
 - We would not need to have specialized Win machines
 - We would not have to build special purpose VMs
- May still need to look into the direction of reconfigurable HPC clusters like Bridges or Jetstream



Prepare your computer for Singularity containers

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Linux



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- We need to run Linux to build/run Singularity
 - If you already run Linux, make sure you have a root
 - On Windows and Mac, we need to install Linux first
- Install Linux in a VM
 - Windows GIT Bash, Virtual Box and Vagrant
 - http://singularity.lbl.gov/install-windows
 - Mac Homebrew with Virtual Box and Vagrant
 - http://singularity.lbl.gov/install-mac





- Windows GIT Bash, VirtualBox, Vagrant
 - GIT Bash provides a bash terminal on Windows
 - VirtualBox provides VM virtualization
 - Vagrant automates VM setup
- Mac VirtualBox and Vagrant
 - Already have a terminal
 - Use Homebrew to install VirtualBox and Vagrant



Windows/Mac Set up VM



- Start GIT Bash or Mac terminal and there
 - Create directory where the VM will live

```
$ cd <somewhere sensible>
```

- \$ mkdir singularity
- \$ cd singularity
 - Initialize and download the Vagrant Box
- \$ vagrant init singularityware/singularity
- \$ vagrant up

http://singularity.lbl.gov/install-windows

http://singularity.lbl.gov/install-mac





- SSH to the spun up VM
- \$ vagrant ssh
- Now we are in the VM

```
vagrant@vagrant:~$ which singularity
/usr/local/bin/singularity
vagrant@vagrant:~$ singularity --version
2.4-dist
```



Install Singularity



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 In Ubuntu VM, or standalone Linux, follow <u>https://www.sylabs.io/guides/3.0/user-guide/quick_start.html#quick-installation-steps</u> to install Singularity

\$