

- 1. HPC, DL, and Containers at NVIDIA
- 2. We built a new "container runtime"
- 3. We wrote a SLURM plugin for it

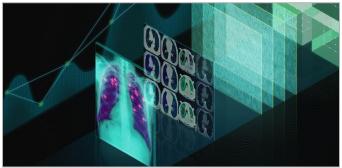
HPC and Deep Learning at NVIDIA

a.k.a. "Data Science"

Our users' workloads aren't typical HPC workloads.

- Many applications don't use MPI at all. Even those that do generally only use it for initial bootstrapping.
- Peer-to-peer GPU access is critical.
- We run continuous integration (CI) on our HPC clusters.







Infrastructure at NVIDIA

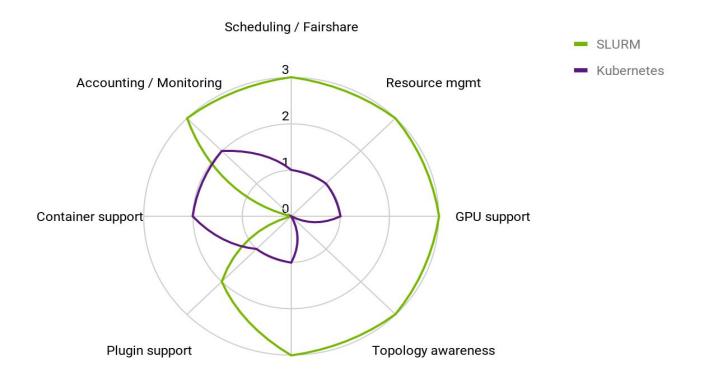
Circe, aka DGX SuperPOD (Top500 #22)

- 96 DGX-2H's
- 1,536 Volta GPUs
- 144TB system memory
- 49TB GPU memory
- 10 Mellanox cx5's in each machine
- Mellanox Infiniband EDR, non-blocking by rail, 2:1 blocking at top level



SLURM vs Kubernetes

or, "HPC" vs "Data Science"



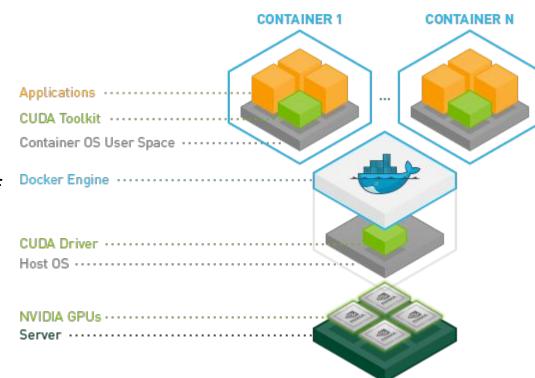
NGC Containers

We built <u>libnvidia-container</u> to make it easy to run CUDA applications inside containers.

We <u>release</u> optimized container images for each of the major DL frameworks every month, and provide them for anyone to use.

We use containers for everything on our HPC clusters - R&D, official benchmarks, etc.

Containers give us portable software stacks without sacrificing performance.











Example

SLURM+Docker+MPI

Excerpts from <u>an actual script</u> used to launch jobs for the MLPerf v0.5 benchmark (208 LOC total)

- Setup docker flags
- 2. Setup mpirun flags
- 3. Setup SSH
- 4. Start sleep containers
- Launch mpirun in rank0 container

```
#!/bin/bash
## Docker params
export VOLS="-v $DATADIR:/data -v $LOGDIR:/results"
export CONTNAME="mpi_${SLURM_JOB_ID}"
export DOCKEREXEC="nvidia-docker run --rm --net=host --uts=host --ipc=host --ulimit stack=67108864 --ulimit
memlock=-1 --security-opt seccomp=unconfined $IBDEVICES"
MPICMD="mpirun --allow-run-as-root --tag-output --bind-to none -x SLURM_NTASKS_PER_NODE=$SLURM_NTASKS_PER_NODE -x
GPUS=$GPUS -x BATCHSIZE=$BATCHSIZE -x KVSTORE=$KVSTORE -x LR=$LR -x WARMUP_EPOCHS=$WARMUP_EPOCHS -x
EVAL_OFFSET=$EVAL_OFFSET -x DGXSYSTEM=$DGXSYSTEM ./run_and_time.sh"
MASTER_IP='getent hosts \'hostname\' | cut -d ' ' -f1'
export hosts=( `scontrol show hostname |tr "\n" " " )
unique_hosts=( $(echo "${hosts[@]}" | tr ' ' '\n' | sort -u | tr '\n' ' ) )
export MASTER HOST=${hosts[0]}
VARS="-e OMPI_MCA_mca_base_param_files=/dev/shm/mpi/${SLURM_JOB_ID}/mca_params.conf -e GPUS -e BATCHSIZE -e KVSTORE
-e LR -e WARMUP EPOCHS -e EVAL OFFSET -e CONT -e DGXSYSTEM=$DGXSYSTEM -e MASTER HOST -e MASTER IP -e
SLURM JOB NUM NODES -e SLURM NNODES -e SLURM NTASKS PER NODE "
docker pull $CONT
mkdir -p ${HOME}/.ssh/sbatch/${SLURM_JOB_ID}
ssh-keygen -t rsa -b 2048 -n "" -f "${HOME}/.ssh/sbatch/${SLURM_JOB_ID}/sshkey.rsa" -C "mxnet_${SLURM_JOB_ID}_"
echo command=\"/dev/shm/mpi/${SLURM_JOB_ID}/sshentry.sh\",no-port-forwarding,no-agent-forwarding,no-X11-forwarding
$(cat ${HOME}/.ssh/sbatch/${SLURM_JOB_ID}/sshkey.rsa.pub) >> ${HOME}/.ssh/authorized_keys
chmod 600 ~/.ssh/authorized kevs
srun -n $SLURM_JOB_NUM_NODES --ntasks-per-node=1 bash -c "mkdir -p /dev/shm/mpi/${SLURM_JOB_ID}; cp -R ${HOME}/.ssh
/sbatch/${SLURM_JOB_ID} /dev/shm/mpi; chmod 700 /dev/shm/mpi/${SLURM_JOB_ID}"
# Create mpi config file
srun -n $$LURM JOB NUM NODES --ntasks-per-node=1 tee /dev/shm/mpi/${$LURM JOB ID}/mca params.conf <<-EOF</pre>
   plm_rsh_agent = /usr/bin/ssh
   plm rsh args = -i /dev/shm/mpi/${SLURM JOB ID}/sshkey.rsa -oStrictHostKeyChecking=no
-oUserKnownHostsFile=/dev/null -oLogLevel=ERROR -l ${USER}
   orte_default_hostfile = /dev/shm/mpi/${SLURM_JOB_ID}/mpi_hosts
   btl_openib_warn_default_gid_prefix = 0
   mpi_warn_on_fork = 0
   allow_run_as_root = 1
# Create ssh helper script that transfers an ssh into a compute node into the running container on that node
srun -n $$LURM JOB NUM NODES --ntasks-per-node=1 tee /dev/shm/mpi/${$LURM JOB ID}/sshentrv.sh <<-E0F
   echo "::sshentry: entered \$(hostname)"
   [[ -f $CONTNAME ]] && "::worker container not found error" && exit 1
   echo "::sshentry: running \$SSH ORIGINAL COMMAND"
   exec docker exec $CONTNAME /bin/bash -c "\$SSH ORIGINAL COMMAND"
# Create mpi hostlist
for h in ${hosts[@]}; do
  echo "$h slots=${SLURM_NTASKS_PER_NODE}" >> /dev/shm/mpi/${SLURM_JOB_ID}/mpi_hosts
srun -n $SLURM_JOB_NUM_NODES --ntasks-per-node=1 bash -c "cp $(which ssh) /dev/shm/mpi/${SLURM_JOB_ID}/.; chmod 755
/dev/shm/mpi/${SLURM_JOB_ID}/mca_params.conf; chmod 755 /dev/shm/mpi/${SLURM_JOB_ID}/sshentry.sh"
# Launch containers behind srun
srun -n $$LURM JOB NUM NODES --ntasks-per-node=1 $DOCKEREXEC --name $CONTNAME $VOLS $VARS $CONT bash -c 'sleep
infinity' & rv=$?
sleep 30
# Launching app
$(eval echo $SSH) docker exec $VARS $CONTNAME $MPICMD
# Clean up
docker rm -f $CONTNAME
```



Containers at NVIDIA

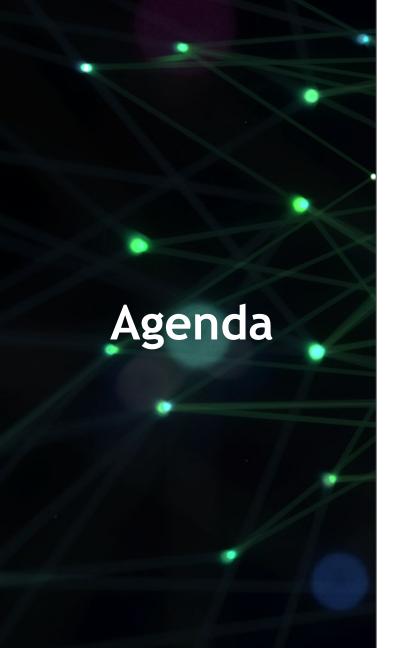
What do we need?

What we need

- High performance
- Unprivileged runtime
- Uses docker image format

What we want

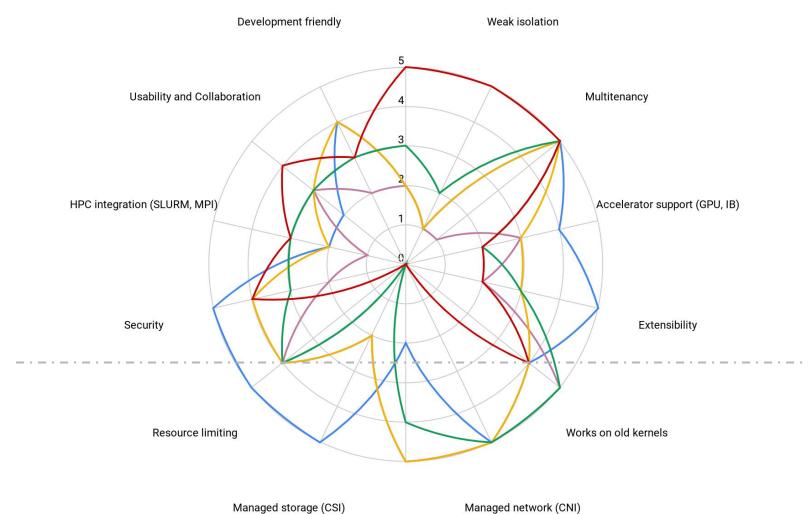
- Preserve SLURM cgroups
- NVIDIA+Mellanox devices are available by default
- MPI between containers is easy
- Can install packages inside containers



- 1. HPC, DL, and Containers at NVIDIA
- 2. We built a new "container runtime"
- 3. We wrote a SLURM plugin for it



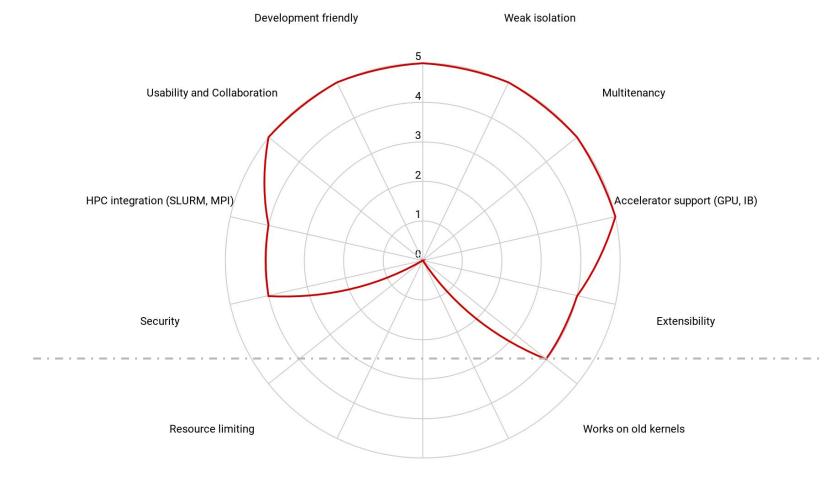
Low overhead



Cloud integration (OCI, CRI)

INVIDIA.





Cloud integration (OCI, CRI)

Managed network (CNI)

Managed storage (CSI)

ENROOT

Summary

Fully unprivileged "chroot" (with optional root-remapping)

Standalone (no daemon, no extra process)

Simple and easy to use (UNIX philosophy, KISS principle)

Little isolation, no overhead

Docker image support (5x pull speedup, shared cache)

Simple image format (single file + UNIX configs)

Composable and extensible (system/user configs, lifecycle hooks)

Advanced features (runfiles, scriptable configs, in-memory containers)

ENROOTBasic usage

```
$ enroot import docker://nvcr.io#nvidia/tensorflow:19.08-py3
$ ls nvidia+tensorflow+19.08-py3.sqsh
$ enroot create --name tensorflow nvidia+tensorflow+19.08-py3.sqsh
$ ls -d ${XDG_DATA_PATH}/enroot/tensorflow
$ enroot start tensorflow nvidia-smi -L
$ enroot start --root --rw tensorflow apt update && apt install ...
$ enroot bundle --output tensorflow.run nvidia+tensorflow+19.05-py3.sqsh
$ ./tensorflow.run python -c 'import tensorflow as tf; print(tf.__version__)'
```

ENROOT

Improved Linux utils

enroot-unshare : like unshare(1), creates new namespaces

enroot-mount : like mount(8), mounts filesystems

enroot-switchroot : like switch_root(8), changes rootfs

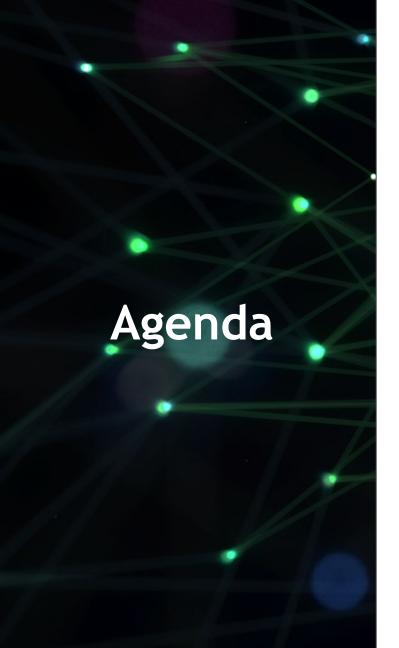
enroot-aufs2ovlfs : converts AUFS whiteouts to OverlayFS

enroot-mksquashovlfs : like mksquashfs(1) on top of OverlayFS

ENROOT

"Container" from scratch

```
$ curl https://cdimage.ubuntu.com/[...]/ubuntu-base-16.04-core-amd64.tar.gz | tar -C ubuntu -xz
$ enroot-unshare bash
$ cat << EOF | enroot-mount --root ubuntu -</pre>
                      none bind, rprivate
  ubuntu
                      none rbind
        /proc
  /proc
                      none rbind
  /dev
          /dev
                      none rbind
  /sys
             /sys
EOF
$ exec enroot-switchroot ubuntu bash
```



- 1. HPC, DL, and Containers at NVIDIA
- 2. We built a new "container runtime"
- 3. We wrote a SLURM plugin for it



Pyxis

Pyxis

Internals

(enroot import)

(enroot create)

(enroot start)

- slurm_spank_init()
 - a. Add flags to srun
- slurm_spank_user_init() runs for each JOBSTEP
 - a. Download a container image from a registry
 - b. Unpack the image to a new container rootfs
 - c. Start up a new "container" process
 - d. Copy environment variables
 - e. Save namespaces for later
- 3. slurm_spank_task_init() runs for each TASK
 - a. setns(CLONE_NEWUSER) # join user namespace
 - b. setns(CLONE_NEWNS) # join mounts namespace
 - c. chdir()
 - d. Setup PMIx, if active



Examples

Pyxis, MPI workload

```
srun -N4 --ntasks-per-node=1 --mpi=pmix \
    --container-image "${docker_image}" \
    --container-mounts "/raid/datasets/imagenet:/data,/scratch:/scratch" \
    caffe train --solver "/scratch/snikolaev/rn50/solver_idl_4k_mpi.prototxt" --gpu=all
```

Examples

Pyxis, MPI workload

```
srun -N4 --ntasks-per-node=1 --mpi=pmix \
    --container-image "${docker_image}" \
    --container-mounts "/raid/datasets/imagenet:/data,/scratch:/scratch" \
    caffe train --solver "/scratch/snikolaev/rn50/solver_idl_4k_mpi.prototxt" --gpu=all
```

- 1. No need to pass through environment variables (Pyxis inherits them all)
- 2. No need for any of these docker args: --rm --net=host --uts=host --ipc=host --pid=host
- 3. No need to configure mpirun (SLURM handles it)
- No need to setup SSH (PMIx doesn't use it)

What Could Be Next

Allow pyxis to use a squashfile directly

Add pyxis flags to sbatch/salloc

Add backends for different "container runtimes"



- We built a new container tool
 - a. Unprivileged
 - b. Lightweight, without excessive isolation
 - Flexible plugins, including support for NVIDIA and Mellanox devices
- 2. We integrated it with SLURM
 - a. Tasks seamlessly land inside containers
 - b. MPI just works between containerized tasks

http://github.com/nvidia/enroot

http://github.com/nvidia/pyxis

Thanks to our coauthors: Felix Abecassis, Julie Bernauer, Louis Capps, Michael Knox





Pyxis

Enabling PMI2 and PMIx

PMI2 just works because we don't close any open file descriptors (\$PMI_FD is still valid).

For PMIx:

- 1. Mount \$PMIX_SERVER_TMPDIR inside the container
- 2. Make some MCA parameters available inside the container via envoars:

```
PMIX_MCA_ptl=PMIX_PTL_MODULE
PMIX_MCA_psec=PMIX_SECURITY_MODE
PMIX_MCA_gds=PMIX_GDS_MODULE
```