# USP HPC

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# CONFIGURATION

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High-Performance Computing (HPC) at Universidade de Sao Paulo (USP) comprises two clusters of servers for parallel and distributed computing for scientific research. Use Python libraries to train machine and deep learning models in a single server on GPU and scale up to the full cluster for large datasets.

Common attributes:

- Workload manager (Slurm) that schedules jobs in all servers.
- Shared network file system visible to all servers.
- Limited local storage.
- Login node with no GPU in **lince** cluster.

Cluster **aguia** contains servers for CPU processing while **lince** cluster is for GPU processing. Access to the clusters through **shark**.

Both clusters allow parallel and distributed computing for scientific purposes, for example training of machine learning and deep learning models.

This documentation explains how to:

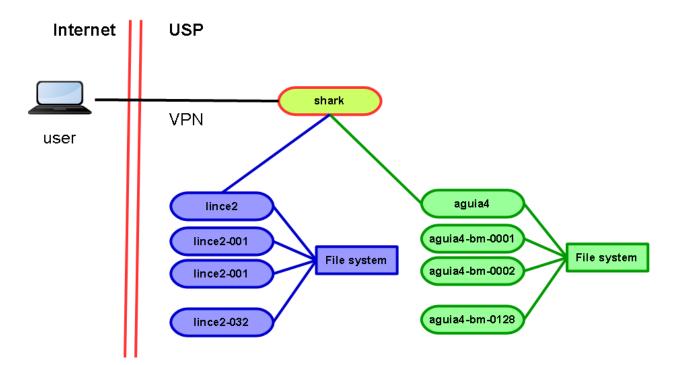
- 1. Setup a development environment for testing and debugging.
- 2. Schedule and manage Slurm jobs.
- 3. Use Python libraries to train machine learning and deep learning models.

This is a quick start guide for new users and may save several hours of searching and testing. Detailed and complete information on each topic is available in the Internet.

CHAPTER

ONE

# **CLUSTER ARCHITECTURE**



#### Cluster aguia:

- 128 servers
- 512GB RAM
- 20 cores
- Intel(R) Xeon(R) CPU E7- 2870 @ 2.40GHz
- 256TB filesystem

#### Cluster lince:

- 32 servers
- 128GB RAM
- 16 cores
- Intel(R) Xeon(R) E5- 2680 @ 2.70GHz
- 2 GPUs NVIDIA Tesla K20m
- 55TB filesystem

# **1.1 Client configuration**

This section shows how to configure a development environment in your computer and how to connect to the servers. The instructions are for Microsoft Windows 10 and minor changes may be required for other operating systems.

Cluster access is done using command line interface (CLI) via SSH. PuTTY is a free terminal for remote access. This section shows how to setup PuTTY to connect and create a tunnel for file transfer and remote code execution.

## 1.1.1 PuTTY Configuration

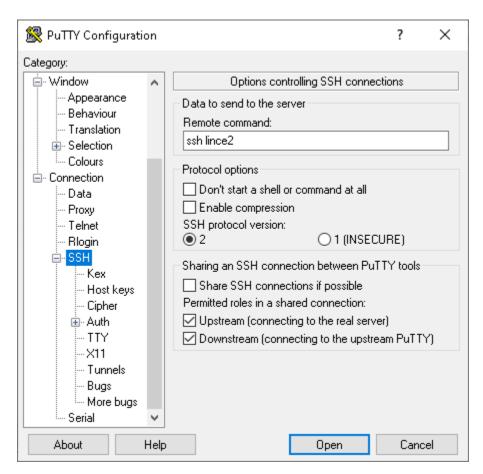
Download PuTTY from the developer's website and install in your computer. After installation, open PuTTY:

🕵 PuTTY Configuration	on		? ×
Category:			
<mark>⊫-</mark> Session	^	Basic options for your PuTTY se	ssion
Logging		Specify the destination you want to conne	ct to
Keyboard		Host Name (or IP address)	Port
Bell		shark.hpc.usp.br	22
Features		Connection type:	
🖻 Window		◯ Raw ◯ Telnet ◯ Rlogin ◉ SSH	l 🔘 Serial
Appearance Behaviour		Load, save or delete a stored session	
Translation		Saved Sessions	
		USP - Lince 2	
Colours		Default Settings	Load
i ⊂ Connection		USP - Aguia 4	2000
- Data - Proxy		USP - Lince 2 USP - Shark	Save
Telnet			Delete
Rlogin			
SSH			
Kex		Close window on exit:	
Host keys Cipher		○ Always ○ Never ● Only on cl	ean exit
	~		
About	Help	Open	Cancel

In the **Connection->Data** menu, insert your user name (USP number). This avoids PuTTY asking for this on each login.

Category: Keyboard  Bell	Data to send	
	Data to send	
Bell		d to the server
Features	Login details	
⊡ · Window	Auto-login username	11568881
Appearance Behaviour	When username is not spec Prompt OUse system	
	Terminal details	
Colours	Terminal-type string	xterm
⊡ Connection <mark>Data</mark>	Terminal speeds	38400,38400
- Proxy - Telnet	Environment variables	
Rlogin	Variable	Add
⊟SSH  Kex	Value	Remove
Host keys Cipher ⊕- Auth		
TTY X11 Tunnels>		
About He		Open Cancel

PuTTY allows to connect directly in **lince** or **aguia** after connecting to **shark**. Just add the command **ssh lince2** in the **Remote command** field.



You may create a tunnel from your computer directly to **aguia** or **lince** for file transfer or to use Jupyter Notebook. Insert a local port and the port number of the server you will access. For instance, the image below assigns local port 2022 to port 22 in **lince2**. Port 22 is use for ssh connection and file transfer via sftp. So, to transfer files just use this command:

\$ sftp -P 2022 user@localhost

🕵 PuTTY Configuratio	on		?	×
Category:				
📮 Window	^	Options controlling SSH port form	varding	
Appearance Behaviour Translation Selection		Port forwarding  Local ports accept connections from o  Remote ports do the same (SSH-2 on)	y)(v	
Colours Connection Data Proxy Telnet Riogin SSH Kex Host keys Cipher			Remo Ad	<b>`</b>
Auth TTY X11 Tunnels Bugs More bugs Serial	▼ Help	Auto     IPv4     O	IPv6 Cano	cel

Port settings suggestion:

Server	Local port	Remote port	Service
lince2	2022	22	SSH and SFTP
lince2	2888	8888	Jupyter Lab and Jupyter Notebook
aguia4	4022	22	SSH and SFTP
aguia4	4088	8888	Jupyter Lab and Jupyter Notebook

## 1.1.2 SSH Configuration

SSH uses login and password for authentication, or a pair of public and private keys. The latter case you can connect directly to the server without entering the password.

Create a pair of public and private keys in your computer to connect to **aguia** and **lince** while the tunnel is open. There's no need to enter the passphrase, just the default values:

```
C:\Users\vivam>ssh-keygen
Generating public/private rsa key pair.
Enter file in which to save the key (C:\Users\vivam/.ssh/id_rsa):
Enter passphrase (empty for no passphrase):
Enter same passphrase again:
Your identification has been saved in C:\Users\vivam/.ssh/id_rsa.
Your public key has been saved in C:\Users\vivam/.ssh/id_rsa.pub.
The key fingerprint is:
```

```
SHA256:jRAhGYfJkD9Zj4ew97SCLImf98m5FiJdhlnKwbK06Jg vivam@DESKTOP-TA0705M
The key's randomart image is:
+---[RSA 2048]----+
| +=o=+* |
| + *00. |
| o * @.+ |
| . 0 . *.+0 |
| oo + * +S.. |
|E.+ = 0 0 |
| . + . 0 |
| . + . 0 |
| . . *. |
+----[SHA256]----+
C:\Users\vivam>
```

The key pair is saved in folder .ssh:

```
C:\Users\vivam>dir .ssh
O volume na unidade C é OS
O Número de Série do Volume é 963B-B7F6
Pasta de C:\Users\vivam\.ssh
03/04/2021 23:06
                   <DIR>
03/04/2021 23:06
                   <DIR>
                                  . .
03/04/2021 23:06
                            1,679 id_rsa
03/04/2021 23:06
                              404 id_rsa.pub
                         2 arquivo(s) 2,083 bytes
                         2 pasta(s) 8,864,555,008 bytes disponíveis
C:\Users\vivam>
```

The next step is to append the public key content to the file ~/.ssh/authorized\_keys in aguia and lince:

C:\Users\vivam\.ssh>cat id\_rsa.pub

ssh-rsa

→AAAAB3NzaC1yc2EAAAADAQABAAABAQDKdaBWyChrn7wsR6+SolgFV8cPxR3hBdPTjGJgI5prPH25vK6XqSvXq8+mDvdX1BI2w9MQK →ELu1n2vTFzJIcmAPY1qk8DsynQYU4CzD5+VVh+sMmVrzLUTTZ+3rC3gWWoMSWqn3IwFNiUsHgQhn6HqIzWhaUVyMF62e3YClfSEnc →qbUyQoflsd5I/9BgMLj1Tcz+b/SXT866aI5JPmIu9yKZH2b1u/

→ZMtFEtydG9UlCxk+Deptlxryi2fIe9wFQuBq1CwZkh0Ikt93SOceksuK6ReW+pJwcocu2MzznCZMAgTiNVvGQAhQxFY7\_ →vivam@DESKTOP-TA0705M

C:\Users\vivam\.ssh>

#### 1.1.3 Test the conection

Open a terminal window and test the connection with SFTP:

```
(base) C:\Users\vivam>sftp -P 2022 11568881@localhost
Connected to 11568881@localhost.
sftp> pwd
Remote working directory: /scratch/11568881
sftp>
```

### 1.1.4 Running remote code

Editing and debugging code in a Linux terminal is not as efficient as in an IDE or in Jupyter. The **PyCharm Professional** edition allows remote execution via SSH and won't be discussed here because it's a paid version. Microsoft **Visual Studio Code** (VS Code) extension **Remote - SSH** also do the job. VS Code requires **OpenSSH**, so we'll install this first.

## 1.1.5 Install OpenSSH

The Remote - SSH extension uses OpenSSH; the PuTTY version is not supported.

In Windows 10 settings, open the windows **Applications and Resources**, then click in **Optional Resources** and check wether **OpenSSH Client** is installed. If it isn't, click in **+ Add resource** to install.

Open Settings, then go to Apps and click Apps & features. Under "Apps & features," click the Manage optional features link.

← Settings		- D X
Home	Apps & features	
Find a setting	Installing apps	Change app defaults To choose the default apps that open your files, links, and more, go
Apps	Choose where you can get apps from. Installing only apps fr Store helps protect your PC and keep it running smoothly.	to Default app settings.
E Apps & features	Allow apps from anywhere $\checkmark$	Open Default app settings
🗄 Default apps	Apps & features	Related settings
印, Offline maps	Manage optional features	Programs and Features
Apps for websites	Search, sort, and filter by drive. If you would like to uninstall	
□ Video playback	move an app, select it from the list.	Get help
	Sort by: Name $\checkmark$ Filter by: All drives $\vee$	Make Windows better
		Give us feedback .04 MB /4/2017
		ading 14/2017

Click the Add a feature button, select the OpenSSH Client option and click Install.

<b>←</b>	Settings	
3	Add a feature	
Ę	Malayalam Supplemental Fonts	171 KB
Ę		256 KB
Ę	On and COLI Clinest (Basta)	656 KB
	Beta release of a secure shell (SSH) client, management and access to remote maching	
		Install
¢	OpenSSH Server (Beta)	658 KB
Ę	Pan-European Supplemental Fonts	3.75 MB

## 1.1.6 SSH configuration

Create the ssh\_config file in your Windows user's .ssh folder with this content:

```
(base) C:\Users\vivam\.ssh>cat config
# Read more about SSH config files: https://linux.die.net/man/5/ssh_config
Host lince2
    HostName localhost
    User <YOUR NUSP>
    IdentityFile ~/.ssh/id_rsa
    Port 2022
Host aguia4
    HostName localhost
    User <YOUR NUSP>
    IdentityFile ~/.ssh/id_rsa
    Port 4022
```

User is your USP number (NUSP) used to login into the servers and Port is the SSH tunnel port.

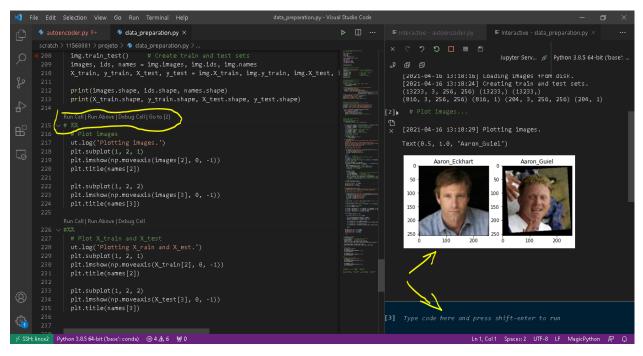
## 1.1.7 VS Code configuration

Install VS Code and the following extensions:

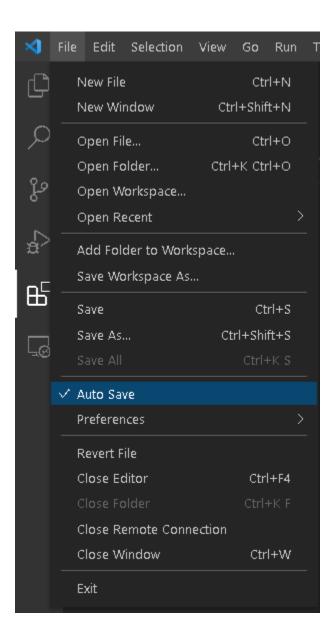
- Remote SSH (Microsoft)
- Remote SSH: Editing Configuration Files (Microsoft)
- Jupyter (Microsoft)
- Python (Microsoft)
- Python Extension Pack (Don Jayamanne)

With the **Jupyter** extension you can edit and execute notebooks in interactive mode, which is handy to make small tests and debugging.

The **Python Extension Pack** allows you to run small chunks of code like in Jupyter. It also shows charts and images in a side bar window. Just insert #%% in a new line to convert the code below in a Jupyter cell, as shown in the image below.



Prevent data loss while editing code enabling Auto Save:



## 1.1.8 Test the connection

See details at https://code.visualstudio.com/docs/remote/ssh-tutorial

## 1.1.9 File transfer with SFTP

SFTP usage:

```
C:\>sftp
usage: sftp [-46aCfpqrv] [-B buffer_size] [-b batchfile] [-c cipher]
        [-D sftp_server_path] [-F ssh_config] [-i identity_file] [-1 limit]
        [-o ssh_option] [-P port] [-R num_requests] [-S program]
        [-s subsystem | sftp_server] destination
```

SFTP commands:

sftp> help Available commands: bve cd path chgrp grp path chmod mode path chown own path df [-hi] [path] →'path' exit get [-afPpRr] remote [local] reget [-fPpRr] remote [local] reput [-fPpRr] [local] remote help lcd path lls [ls-options [path]] lmkdir path ln [-s] oldpath newpath lpwd ls [-1afhlnrSt] [path] lumask umask mkdir path progress put [-afPpRr] local [remote] pwd quit rename oldpath newpath rm path rmdir path symlink oldpath newpath version !command Т ?

Quit sftp Change remote directory to 'path' Change group of file 'path' to 'grp' Change permissions of file 'path' to 'mode' Change owner of file 'path' to 'own' Display statistics for current directory or filesystem containing Quit sftp Download file Resume download file Resume upload file Display this help text Change local directory to 'path' Display local directory listing Create local directory Link remote file (-s for symlink) Print local working directory Display remote directory listing Set local umask to 'umask' Create remote directory Toggle display of progress meter Upload file Display remote working directory Quit sftp Rename remote file Delete remote file Remove remote directory Symlink remote file Show SFTP version Execute 'command' in local shell Escape to local shell Synonym for help

# **1.2 Server configuration**

sftp>

## 1.2.1 Install Miniconda and Python libraries

Python libraries installed in HPC are outdated and you may want to use newer releases. This section shows how to install Miniconda in the user's home directory, without affecting the original installation.

Miniconda installs the most recent release of Python and pip in the user's folder. The libraries installed with pip and conda are also installed in your folder.

All commands shall be executed in the server's Linux terminal.

#### **Check CUDA release**

Before installing the libraries, you need the current CUDA release to choose the right package. Run this command:

\$ nvcc --version nvcc: NVIDIA (R) Cuda compiler driver Copyright (c) 2005-2019 NVIDIA Corporation Built on Wed\_Apr\_24\_19:10:27\_PDT\_2019 Cuda compilation tools, release 10.1, V10.1.168

The output shows the current release is 10.1.

#### **Install Miniconda**

Miniconda is a package management system for Python and provides pip, conda and the most recent Python release with basic libraries. Miniconda requires less disk space than Anaconda and is faster to install. After installing Miniconda, you may install just the libraries that you'll use. Anaconda installs many packages and applications that won't be used.

Select a Miniconda release with the Python version compatible with the libraries that you need, since not all libraries are compatible with the newest release of Python. For example, the latest release of Tensorflow doesn't work with the latest release of Python and CUDA 10.1.

**Warning:** Check Python, CUDA and libraries compatibility before installing Miniconda. Many libraries only work with specific Python and CUDA versions.



Access Miniconda website and copy the link with the installation script that you need. This example uses release 3.8.

Use the wget command to download the script with the link you copied from Miniconda site:

\$ wget https://repo.anaconda.com/miniconda/Miniconda3-latest-Linux-x86\_64.sh
\$ bash Miniconda3-latest-Linux-x86\_64.sh

The installation script asks a few questions, just press ENTER to accept the default values and accept the license terms. When prompted to initialize Miniconda, answer "yes". This creates the default base environment that will be automatically activated when you log into the cluster. All libraries will be installed in this environment.

Do you wish the installer to initialize Miniconda3 by running conda init? [yes|no] [no] >>> yes

Now reload ~/.bashrc to update the environment variables and activate the base environment:

\$ source ~/.bashrc

**Warning:** Make sure to select the right environment before installation and always check Python and libraries after installation.

Install Python libraries for your project. Tensorflow and PyTorch use custom installation which depends on Python and CUDA versions:

```
$ conda install -c conda-forge numpy pandas matplotlib scikit-learn
```

Optionally update the libaries for the most recent version. In this example, Miniconda installed scikit-learn version 0.23 and this command upgrades to 0.24

```
# Update scikit-learn
$ conda upgrade -c conda-forge scikit-learn
```

#### **Install Tensorflow**

From Tensorflow website, select the correct version according to Python and CUDA versions. Since we have Python 3.8 and CUDA 10.1, the best Tensorflow version is 2.3:

\$ pip install tensorflow==2.3

#### **Install PyTorch**

Similarly, check PyTorch website to install the correct version:

```
# Install PyTorch
# 1. Version with GPU to install in lince (CUDA 10.1 - Python 3.8)
$ conda install pytorch torchvision torchaudio cudatoolkit=10.1 -c pytorch
# 2. Version without GPU to install in aguia
$ conda install pytorch torchvision torchaudio cpuonly -c pytorch
```

#### **Install Dask**

Dask is a library for parallel and distributed computing. Dask's schedulers scale to thousand-node clusters and its algorithms have been tested on some of the largest supercomputers in the world. It easily integrates with NumPy, Pandas and scikit-learn:

```
$ conda install dask distributed
```

#### **Install RAPIDS**

The RAPIDS suite of open source software libraries and APIs gives you the ability to execute end-to-end data science and analytics pipelines entirely on GPUs. Use the release selector to get the right installation command:

```
$ conda install -c rapidsai -c nvidia -c conda-forge rapids-blazing=0.19 python=3.8_

→cudatoolkit=10.1
```

#### **1.2.2 Installation tests**

After installing the libraries, run Python and import the libraries to confirm the correct version:

```
$ cat system_info.py
#!/scratch/<YOUR_NUSP>/miniconda3/bin/python3
import sys
import numpy as np
import pandas as pd
import matplotlib as mpl
import sklearn as sk
print('='*20, 'Software version', '='*20)
print("Python:", sys.version.split('\n')[0])
print("NumPy:", np.__version__)
print('Matplotlib:', mpl.__version__)
print('Sklearn:", sk.__version__)
```

**Warning:** Check Tensorflow, PyTorch and RAPIDS on the processing node, since the login server doesn't have access to GPU.

Lince login node doesn't provide GPU access, so you need to connect to a processing node to check Tensorflow, PyTorch and RAPIDS:

\$ ssh lince2-001

Once connected in lince2-001, connect to a processing node and make sure that Tensorflow and PyTorch recognize the GPU:

```
$ python
Python 3.8.5 (default, Sep 4 2020, 07:30:14)
[GCC 7.3.0] :: Anaconda, Inc. on linux
Type "help", "copyright", "credits" or "license" for more information.
```

#### **Check Tensorflow installation**

Import Tensorflow:

Check Tensorflow version:

>>> tf.\_\_version\_\_ '2.3.0'

Check if Tensorflow can list both GPUs:

```
>>> tf.config.list_physical_devices()
2021-05-06 10:09:19.154886: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcuda.so.1
2021-05-06 10:09:19.167369: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1716]
\rightarrow Found device 0 with properties:
pciBusID: 0000:05:00.0 name: Tesla K20m computeCapability: 3.5
coreClock: 0.7055GHz coreCount: 13 deviceMemorySize: 4.63GiB deviceMemoryBandwidth: 193.
\rightarrow 71GiB/s
2021-05-06 10:09:19.168426: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1716].
\rightarrow Found device 1 with properties:
pciBusID: 0000:83:00.0 name: Tesla K20m computeCapability: 3.5
coreClock: 0.7055GHz coreCount: 13 deviceMemorySize: 4.63GiB deviceMemoryBandwidth: 193.
⊶71GiB/s
2021-05-06 10:09:19.168477: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcudart.so.10.1
2021-05-06 10:09:19.173624: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcublas.so.10
2021-05-06 10:09:19.176772: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcufft.so.10
2021-05-06 10:09:19.177907: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcurand.so.10
2021-05-06 10:09:19.181156: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcusolver.so.10
2021-05-06 10:09:19.183197: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcusparse.so.10
2021-05-06 10:09:19.188812: I tensorflow/stream_executor/platform/default/dso_loader.
→cc:48] Successfully opened dynamic library libcudnn.so.7
2021-05-06 10:09:19.192994: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1858]
\rightarrow Adding visible gpu devices: 0, 1
[PhysicalDevice(name='/physical_device:CPU:0', device_type='CPU'), PhysicalDevice(name='/
→physical_device:XLA_CPU:0', device_type='XLA_CPU'), PhysicalDevice(name='/physical_
→device:XLA_GPU:0', device_type='XLA_GPU'), PhysicalDevice(name='/physical_device:XLA_
→GPU:1', device_type='XLA_GPU'), PhysicalDevice(name='/physical_device:GPU:0', device_
→type='GPU'), PhysicalDevice(name='/physical_device:GPU:1', device_type='GPU')]
```

#### **Check PyTorch installation**

Import PyTorch:

>>> import torch

Check PyTorch version:

```
>>> torch.__version__
'1.7.0'
>>>
```

Check the number of GPUs available:

```
>>> torch.cuda.device_count()
2
```

Check GPU name:

```
>>> torch.cuda.get_device_name(torch.cuda.current_device())
'Tesla K20m'
```

#### **Check RAPIDS installation**

RAPIDS automatically detects the GPU when you import a library:

```
>>> import cudf
/scratch/11568881/miniconda3/lib/python3.8/site-packages/cudf/utils/gpu_utils.py:92:_
→UserWarning: You will need a GPU with NVIDIA Pascal™ or newer architecture
Detected GPU 0: Tesla K20m
Detected Compute Capability: 3.5
warnings.warn(
```

#### 1.2.3 System information

You may need the hardware information to choose the right software release. The following commands show the main hardware devices and the Linux release. The commands may be executed directly in the Linux terminal, or you may save in a script and run in SLURM job. Note that PyTorch provides a custom version for each CUDA version:

```
echo SLURM: File containing allocated hostnames
echo $SLURM_JOB_NODELIST
              # File containing allocated hostnames
echo SLURM: Total number of cores for job
# Total number of cores for job
echo $SLURM_NTASKS
echo SLURM: GPU devide ID that assigned to the job to use
echo $CUDA_VISIBLE_DEVICES
echo Hostname
hostname
echo Memory Info \langle (GB \rangle):
free -g
echo CPU Info:
lscpu
echo Disk space
df -h
echo GPU 1
nvidia-smi
echo GPU 2
lshw -C display
echo CUDA Version
nvcc --version
echo Linux version
```

```
cat /etc/os-release
echo PATH
echo $PATH
echo Python
which python
which python3
echo Conda
which conda
conda --version
echo Pip
which pip
pip --version
echo Python Library Versions
python system_info.py
```

# **1.3 Install Google Drive**

Since data in the server are deleted periodically, keeping an external backup makes the recover easy. Storing in Google Drive is handy since the USP account has unlimited storage. This section shows how to access Google Drive in lince with **gdrive**.

**Caution:** Anyone with access to **gdrive** may access your files in Google Drive. If you have sensitive information in your USP account, create another Google account just to store HPC backups.

According to the developer, gdrive is no longer maintained although it's still possible to connect and sync folders with Google Drive.

Steps:

- 1. Create Google credentials
- 2. Download GDrive
- 3. Edit configuration
- 4. Code compilation

5. Access GDrive

First you need to create a credential in Google to give permission for an application access GDrive. When you do this, you'll receive an ID and a key. This step is done only once. Follow the instructions in this site .

## 1.3.1 Download GDrive

Run all Linux commands in the server. The GDrive code was written in go and may be downloaded from GitHub with this command:

```
$ go get github.com/prasmussen/gdrive
```

## **1.3.2 Edit configuration**

The code will be downloaded to the folder ~/go/src/github.com/prasmussen/gdrive. Go to this folder, open the file handlers\_drive.go with a text editor of your choice and update the following lines with the credentials you got from the previous step:

```
const ClientId = "367116221053-7n0v**.apps.googleusercontent.com"
const ClientSecret = "1qsNodXN*****jUjmvho0"
```

### 1.3.3 Code compilation

Now, compile the code in this folder with the following command. No message should appear after running it:

```
$ go build
```

The gdrive file is created in this folder. Change permission to make it executable:

```
$ chmod 755 gdrive
```

## 1.3.4 Access GDrive

Run the gdrive list command to start the authentication process:

```
$ ./gdrive list
Authentication needed
Go to the following url in your browser:
https://accounts.google.com/o/oauth2/auth?access_type=offl...
Enter verification code:
```

Copy and paste the link in your browser to allow access. After inserting the verification code, the root folder in your Google Drive is listed in terminal. Then, move the gdrive file to folder ~/.local/bin:

```
$ mkdir ~/.local/bin
$ mv ~/go/src/github.com/prasmussen/gdrive/gdrive ~/.local/bin
```

The complete list of options in gdrive is available at the developer's website .

### 1.3.5 Folder synchronization

gdrive creates a fileId for each file and folder stored in drive. Use this fileId to sync a folder. In this example, the fileId is 0B3X9GlR6Embn0Ed6cEh6bU9XZWM and the folder \_release/bin is being synced.

Create directory on drive:

\$ gdrive mkdir drive-bin Directory 0B3X9GlR6Embn0Ed6cEh6bU9XZWM created

```
Sync to drive:
```

```
$ gdrive sync upload _release/bin 0B3X9G1R6Embn0Ed6cEh6bU9XZWM
Starting sync...
Collecting local and remote file information...
Found 32 local files and 0 remote files
6 remote directories are missing
[0001/0006] Creating directory drive-bin/bsd
[0002/0006] Creating directory drive-bin/linux
[0003/0006] Creating directory drive-bin/osx
[0004/0006] Creating directory drive-bin/plan9
[0005/0006] Creating directory drive-bin/solaris
[0006/0006] Creating directory drive-bin/windows
26 remote files are missing
[0001/0026] Uploading bsd/gdrive-dragonfly-x64 -> drive-bin/bsd/gdrive-dragonfly-x64
[0002/0026] Uploading bsd/gdrive-freebsd-386 -> drive-bin/bsd/gdrive-freebsd-386
[0003/0026] Uploading bsd/gdrive-freebsd-arm -> drive-bin/bsd/gdrive-freebsd-arm
[0004/0026] Uploading bsd/gdrive-freebsd-x64 -> drive-bin/bsd/gdrive-freebsd-x64
[0005/0026] Uploading bsd/gdrive-netbsd-386 -> drive-bin/bsd/gdrive-netbsd-386
[0006/0026] Uploading bsd/gdrive-netbsd-arm -> drive-bin/bsd/gdrive-netbsd-arm
[0007/0026] Uploading bsd/gdrive-netbsd-x64 -> drive-bin/bsd/gdrive-netbsd-x64
[0008/0026] Uploading bsd/gdrive-openbsd-386 -> drive-bin/bsd/gdrive-openbsd-386
[0009/0026] Uploading bsd/gdrive-openbsd-arm -> drive-bin/bsd/gdrive-openbsd-arm
[0010/0026] Uploading bsd/gdrive-openbsd-x64 -> drive-bin/bsd/gdrive-openbsd-x64
[0011/0026] Uploading linux/gdrive-linux-386 -> drive-bin/linux/gdrive-linux-386
[0012/0026] Uploading linux/gdrive-linux-arm -> drive-bin/linux/gdrive-linux-arm
[0013/0026] Uploading linux/gdrive-linux-arm64 -> drive-bin/linux/gdrive-linux-arm64
[0014/0026] Uploading linux/gdrive-linux-mips64 -> drive-bin/linux/gdrive-linux-mips64
[0015/0026] Uploading linux/gdrive-linux-mips64le -> drive-bin/linux/gdrive-linux-
→mips64le
[0016/0026] Uploading linux/gdrive-linux-ppc64 -> drive-bin/linux/gdrive-linux-ppc64
[0017/0026] Uploading linux/gdrive-linux-ppc64le -> drive-bin/linux/gdrive-linux-ppc64le
[0018/0026] Uploading linux/gdrive-linux-x64 -> drive-bin/linux/gdrive-linux-x64
[0019/0026] Uploading osx/gdrive-osx-386 -> drive-bin/osx/gdrive-osx-386
[0020/0026] Uploading osx/gdrive-osx-arm -> drive-bin/osx/gdrive-osx-arm
[0021/0026] Uploading osx/gdrive-osx-x64 -> drive-bin/osx/gdrive-osx-x64
[0022/0026] Uploading plan9/gdrive-plan9-386 -> drive-bin/plan9/gdrive-plan9-386
[0023/0026] Uploading plan9/gdrive-plan9-x64 -> drive-bin/plan9/gdrive-plan9-x64
[0024/0026] Uploading solaris/gdrive-solaris-x64 -> drive-bin/solaris/gdrive-solaris-x64
[0025/0026] Uploading windows/gdrive-windows-386.exe -> drive-bin/windows/gdrive-windows-
→386.exe
[0026/0026] Uploading windows/gdrive-windows-x64.exe -> drive-bin/windows/gdrive-windows-
 x64.exe
```

Sync finished in 1m18.891946279s

Add new local file:

\$ echo "google drive binaries" > \_release/bin/readme.txt

Sync again:

\$ gdrive sync upload \_release/bin 0B3X9GlR6EmbnOEd6cEh6bU9XZWM
Starting sync...
Collecting local and remote file information...
Found 33 local files and 32 remote files
1 remote files are missing
[0001/0001] Uploading readme.txt -> drive-bin/readme.txt

Modify local file:

Sync finished in 2.201339535s

\$ echo "for all platforms" >> \_release/bin/readme.txt

Sync again:

```
$ gdrive sync upload _release/bin 0B3X9G1R6EmbnOEd6cEh6bU9XZWM
Starting sync...
Collecting local and remote file information...
Found 33 local files and 33 remote files
1 local files has changed
[0001/0001] Updating readme.txt -> drive-bin/readme.txt
Sync finished in 1.890244258s
```

#### 1.3.6 List of options

Use the command gdrive help to list the available options:

```
$ gdrive help
gdrive usage:
gdrive [global] list [options]
                                                                List files
gdrive [global] download [options] <fileId>
                                                                Download file or directory
gdrive [global] download query [options] <query>
                                                                Download all files and
→ directories matching query
gdrive [global] upload [options] <path>
                                                                Upload file or directory
gdrive [global] upload - [options] <name>
                                                                Upload file from stdin
gdrive [global] update [options] <fileId> <path>
                                                                Update file, this creates
\hookrightarrowa new revision of the file
gdrive [global] info [options] <fileId>
                                                                Show file info
gdrive [global] mkdir [options] <name>
                                                                Create directory
gdrive [global] share [options] <fileId>
                                                                Share file or directory
gdrive [global] share list <fileId>
                                                                List files permissions
gdrive [global] share revoke <fileId> <permissionId>
                                                                Revoke permission
```

```
gdrive [global] delete [options] <fileId>
                                                                 Delete file or directory
gdrive [global] sync list [options]
                                                                 List all syncable
\rightarrow directories on drive
gdrive [global] sync content [options] <fileId>
                                                                 List content of syncable
\rightarrow directory
gdrive [global] sync download [options] <fileId> <path>
                                                                 Sync drive directory to
→local directory
gdrive [global] sync upload [options] <path> <fileId>
                                                                 Sync local directory to
→drive
gdrive [global] changes [options]
                                                                 List file changes
gdrive [global] revision list [options] <fileId>
                                                                 List file revisions
gdrive [global] revision download [options] <fileId> <revId>
                                                                 Download revision
gdrive [global] revision delete <fileId> <revId>
                                                                 Delete file revision
gdrive [global] import [options] <path>
                                                                 Upload and convert file
\rightarrowto a google document, see 'about import' for available conversions
gdrive [global] export [options] <fileId>
                                                                 Export a google document
gdrive [global] about [options]
                                                                 Google drive metadata,
⇔quota usage
gdrive [global] about import
                                                                  Show supported import
\rightarrow formats
gdrive [global] about export
                                                                  Show supported export
\rightarrow formats
gdrive version
                                                                 Print application version
gdrive help
                                                                 Print help
gdrive help <command>
                                                                 Print command help
gdrive help <command> <subcommand>
                                                                 Print subcommand help
```

## 1.3.7 Schedule daily backup

Schedule daily backup of your folder with crontab. Use this template:

```
$ crontab -e
# Crontab - Crontab template to automate virtual world
# Template from https://gist.github.com/bretonics/9a48a3b9ef32d93d15f45c3f007550b4
# Andrés Bretón ~ http://andresbreton.com, dev@andresbreton.com
#
# ========
            _____
#
 .---- minute (0 - 59)
    .---- hour (0 - 23)
#
# | | .----- day of month (1 - 31)
# | | | .----- month (1 - 12) OR jan, feb, mar, apr ...
    | | .---- day of week (0 - 6) (Sunday=0 or 7) OR sun,mon,tue,wed,thu,fri,sat
# |
# |
   | | | + command
         * * CMD
# *
   *
      *
# ====
#
# Set Path
PATH=/bin:/usr/bin:/usr/local/bin:/scratch/<USER_ID>
# Backup of work folder daily at 02:00 AM
# (change NUSP, folder name and fileId)
```

```
00 02 * * * /scratch/<Seu NUSP>/.local/bin/gdrive sync upload _release/bin_
→OB3X9GlR6EmbnOEd6cEh6bU9XZWM > backup.log 2>&1
```

## 1.4 Code development

The job scheduled in HPC goes to the last position in a queue that may take several days to start execution. For this reason, HPC is not suited for testing and debugging. This sections shows how to create a test environment and schedule a job.

#### 1.4.1 Test and debug

The GPU is disabled in the login node of **lince**, and this node is used mainly for job schedule. A feasible alternative is to test and debug in Google Colab or Kaggle before submitting to SLURM.

An easy way to distinguish between debug and production modes is the use of and environment variable, for example DEBUG\_MODE. In debug mode, the code loads a subset of the dataset and runs for a few epochs, since the goal is just make sure the code is error free. Then, in production mode the code processes the entire dataset and full epochs. In production mode you may also want to test several model architectures. The examples in this section show how to test an autoencoder with different number of layers.

Insert this piece of code in the first cell of Google Colab. The second line enables debug mode, and the third and fourth lines are the model configuration.:

```
import os
os.environ['DEBUG_MODE'] = 'true'
os.environ['AE_ARCH'] = '1_2_4_6_8_10_12'  # Number of filters in each layer
os.environ['AE_KERNEL'] = '5_5_3_3_3_3'  # Filter size in each layer
```

You may want to test in VS Code before sending the script to SLURM. This can be done by setting the debug mode as default when you login, and just disable in the schedule script.

Enable debug mode in **lince** inserting this code in your ~/.bashrc file:

```
export DEBUG_MODE=TRUE  #
export AE_ARCH=1_2_4_6_8_10_12  # Number of filters in each autoencoder layer
export AE_KERNEL=5_5_3_3_3_3  # Filter size in each layer
```

Read the debug mode in the Python script body:

```
# Debug mode is lightweight components to be able to run in Google Colab
debug_mode = os.getenv('DEBUG_MODE').title() in ['True', '1']
```

Set 5 epochs in debug mode and 5000 otherwise:

num\_epochs = 5 \* debug\_mode or 5000

## 1.4.2 Google Colab setup

In the first cell of Colab, insert this code to mount GDrive in Colab:

```
# Mount Google Drive
from google.colab import drive
drive.mount("/content/drive")
```

Now you have access to the scripts in lince saved in Drive. Example of code to copy scripts from GDrive to Colab:

```
import os
os.system('cp /content/drive/MyDrive/<FOLDER>/*.py .')
```

Copy trained models from folder model/<MODEL\_NAME> to Drive:

```
import os, glob

def save_models_GDrive():
    # Create folder to save models
    for fdir in glob.glob('model/*'):
        gdir = '/content/drive/MyDrive/lince-colab/' + fdir.split('/')[1]
        if not os.path.exists(gdir):
            os.system('mkdir {}'.format(gdir))

# Copy trained models do Google Drive
for model in glob.glob('model/*/*'):
        fdir = model.split('/')[1]
        fname = model.split('/')[2]
        cmd = 'cp model/{}/{} /content/drive/MyDrive/lince-colab/{}/{}/{}'.format(fdir,__
...,fname, fdir, fname)
        print(cmd)
        os.system(cmd)
```

# 1.5 Tensorflow configuration

Reduce training time with proper Tensorflow and system configuration. This section covers the following topics:

- 1. Install Tensorflow optimized for performance
- 2. Save the model
- 3. Data format
- 4. OpenMP parameters
- 5. CPU optimization
- 6. GPU optimization
- 7. Compiler optimization
- 8. Distributed computing

## 1.5.1 Tensorflow installation

Intel created a Tensorflow version optimized for CPU. Use this installation if you won't use GPU:

```
$ conda install tensorflow -c intel
$ pip install intel-tensorflow==2.4.0
```

Read full instructions at Intel website.

## 1.5.2 Save the model

It's possible to create checkpoints to save the model during training after each epoch, then resume the training from the last checkpoint. This is useful if the training time is larger than the scheduled time, or to prevent hardware failure or broken connection. Saving the model after training for later use is also possible.

Follow the instructions in this tutorial to save the model.

## 1.5.3 Data format

Tensorflow stores and processes image arrays with the channel in the last dimension (channel last), also known as NHWC. The format used by Intel is channel last, or NCHW. The meaning of each letter is:

- N: Batch size, indicating number of images in a batch.
- C: Channel, indicating number of channels in an image.
- W: Width, indicating number of pixels in horizontal dimension of an image.
- H: Height, indicating number of pixels in vertical dimension of an image.

When training on Intel CPU only, force Tensorflow to use channel first with this code:

```
import tensorflow as tf
# force channels-first ordering
keras.backend.set_image_data_format('channels_first')
```

## 1.5.4 OpenMP settings

OpenMP implements parallel computing among different processors. Intel recommends the use these environment variables to configure OpenMP. For convenience, save them in your ~/.bashrc file or setup in Python.

#### • OMP\_NUM\_THREADS

- Maximum number of threads to use for OpenMP parallel regions if no other value is specified in the
  application.
- Recommend: start with the number of physical cores/socket on the test system, and try increasing and decreasing
- KMP\_BLOCKTIME
  - Time, in milliseconds, that a thread should wait, after completing the execution of a parallel region, before sleeping.
  - Recommend: start with 1 and try increasing
- KMP\_AFFINITY

- Restricts execution of certain threads to a subset of the physical processing units in a multiprocessor computer. Only valid if Hyperthreading is enabled.
- Recommend: granularity=fine,verbose,compact,1,0

#### • KMP\_SETTINGS

- Enables (TRUE) or disables (FALSE) printing of OpenMP run-time library environment variables during execution
- Recommend: Start with TRUE to ensure settings are being utilized, then use as needed

Python example:

```
import os
os.environ["OMP_NUM_THREADS"] = "8" # Number of physical cores
os.environ["KMP_AFFINITY"] = "granularity=fine,compact,1,0"
os.environ["KMP_BLOCKTIME"] = "0" #(or 1)
os.environ["KMP_SETTINGS"] = "TRUE"
```

### 1.5.5 CPU optimization

Set the number of CPU cores that Tensorflow can use with these parameters:

- intra\_op\_parallelism\_threads
  - Number of threads used within an individual op for parallelism
  - Recommend: start with the number of cores/socket on the test system, and try increasing and decreasing
- inter\_op\_parallelism\_threads
  - Number of threads used for parallelism between independent operations.
  - Recommend: start with the number of physical cores on the test system, and try increasing and decreasing
- device\_count
  - Maximum number of devices (CPUs in this case) to use
  - Recommend: start with the number of cores/socket on the test system, and try increasing and decreasing
- allow\_soft\_placement
  - Set to True/enabled to facilitate operations to be placed on CPU instead of GPU

Example:

```
import tensorflow as tf
tf.config.threading.set_inter_op_parallelism_threads(8)  # Use 8 physical cores
tf.config.threading.set_intra_op_parallelism_threads(8)  # Use 8 physical cores
tf.config.set_soft_device_placement(True)
```

Reference: https://software.intel.com/content/www/us/en/develop/articles/guide-to-tensorflow-runtime-optimizations-for-cpu. html

#### 1.5.6 GPU optimization

Insert this code in Google Colab to make sure GPU is enabled:

```
import tensorflow as tf
# Show available devices: CPU and GPU
print(tf.config.list_physical_devices())
# Check that we are using a GPU, if not switch runtimes
# using Runtime > Change Runtime Type > GPU
assert len(tf.config.list_physical_devices('GPU')) > 0
```

### 1.5.7 Compiler optimization

XLA (Accelerated Linear Algebra) is a domain-specific compiler for linear algebra that can accelerate TensorFlow models with potentially no source code changes. Enable XLA in Python or save the environment variable in `` ~/.bashrc``:

```
import os
os.environ['TF_XLA_FLAGS'] = '--tf_xla_enable_xla_devices'
```

### 1.5.8 Pipeline optimization

Data input pipeline used during training may impact performance. An efficient pipeline reads data from disk for the next batch while the GPU processes the current batch.

See how to achieve better performance with the tf.data API to build an optimized data pipeline.

#### 1.5.9 Distributed computing

Tensorflow can distribute computing in more than one GPU in the same computer or in several servers.

This example shows how to enable distributed computing in one or more GPUs or use the default strategy if no GPU is found:

```
import tensorflow as tf
# Distributed training: GPU settings
if tf.config.list_physical_devices('GPU'):
   strategy = tf.distribute.MirroredStrategy()
else: # use default strategy
   strategy = tf.distribute.get_strategy()
```

Then use the **strategy** to create the model, optimizer and compile the model:

```
with strategy.scope():
    optimizer = tf.keras.optimizers.SGD()
    model = tf.keras.Sequential([tf.keras.layers.Dense(1, input_shape=(1,))])
    model.compile(loss='mse', optimizer=optimizer)
```

See distributed training with TensorFlow for complete explanation about distributed computing.

## 1.6 Working with modules

Modules are a convenient way to manage environment variables for applications use. Unless you use the default installation of Anaconda available in HPC, you'll need to create custom modules. This section briefly explains how to work with modules and provides a custom module for Miniconda. See the references<sup>1</sup> to learn more about modules.

Environment modules set environment variables with specific values for each application. Run **module avail** to list all modules available:

```
$ module avail
  ------/opt/ohpc/pub/
→moduledeps/gnu7-openmpi3 -----
____
               imb/2018.1
                        netcdf-cxx/4.3.0
 adios/1.13.1
                                         phdf5/1.10.2
                                                       py2-
→scipy/1.1.0 scalasca/2.3.1
                        superlu_dist/5.3.0
                        netcdf-fortran/4.4.4
 boost/1.67.0 (D) mfem/3.3.2
                                         pnetcdf/1.9.0
                                                       py3-
                        tau/2.27.1
→mpi4py/3.0.0 scorep/4.0
              mpiP/3.4.1 netcdf/4.6.1
 fftw/3.3.7
                                         ptscotch/6.0.4
                                                       ру3-
→scipy/1.1.0 sionlib/1.7.1
                        trilinos/12.12.1
 hypre/2.14.0
            mumps/5.1.2
                         petsc/3.9.1
                                          py2-mpi4py/3.0.0
→scalapack/2.0.2
              slepc/3.9.1
      /opt/ohpc/pub/
→moduledeps/gnu7 -----
 R/3.5.0 hdf5/1.10.2
                   mpich/3.2.1 openblas/0.2.20
                                          openmpi3/3.1.0 (L)
                                                         py2-
            superlu/5.2.1
\rightarrownumpy/1.14.3
 gsl/2.4
         metis/5.1.0 ocr/1.0.1 openmpi/1.10.7 pdtoolkit/3.25
                                                         py3-
\rightarrow numpy/1.14.3
       ------/opt/ohpc/pub/
→modulefiles -----
 EasyBuild/3.8.1
                   clustershell/1.8
                                 gnu7/7.3.0 (L)
                                              intel/19.0.4.243
   papi/5.6.0
               singularity/3.1.0
             (L) cmake/3.13.4
 autotools
                                 gnu8/8.3.0
                                             llvm5/5.0.1
                                                           ш
   pmix/2.2.2
              valgrind/3.14.0
\hookrightarrow
 charliecloud/0.9.7
                   gnu/5.4.0
                                hwloc/2.0.3
                                              ohpc
                                                         (L)
   prun/1.3 (L)
    ----- /apps/
→modulefiles -----
 Anaconda/2-2019.03
                   Gromacs/5.1.4-cuda-mpi
                                     Gromacs/2019.3-cuda (D)
                                                       amber/
<u></u>→19-cpu
                    lammps/7Aug19
                              mkl/2019.4.243
         canal/1.5
                   Gromacs/5.1.4-cuda
 Anaconda/3-2019.03 (D)
                                    Gromacs/2019.3-mpi
                                                       amber/
⊶19-gpu
         curves/3.0
                   lammps/290ct20 (D)
                                   ox/8.02-0-gnu
 Gromacs/4.0.7
                   Gromacs/5.1.4-mpi
                                     NAMD/2.13-CUDA
                                                       amber/
→20-gpu (D) dssp
                   magma/2.5.1
                                   pgi/19.10
 Gromacs/4.6.7
                   Gromacs/2018.3-cuda
                                     amber/18
                                                       boost/
\rightarrow 1_71_0
      g_mmpbsa
                   megacc/10.2.5
                                   relion/3.1
----- /opt/
→modulefiles -----
```

(continues on next page)

<sup>1</sup> References:

```
cuda/8.0 cuda/10.0 cuda/10.1 (L,D)
Where:
D: Default Module
L: Module is loaded
Use "module spider" to find all possible modules.
Use "module keyword key1 key2 ..." to search for all possible modules matching any of_
→the "keys".
```

Notice that default modules have a (D) besides the name and loaded modules come with a (L). You can load a module with module load:

\$ module load Anaconda/3-2019.03

Clean all loaded modules with module purge:

\$ module purge

Run module show to list the commands executed in the module:

#### 1.6.1 Create custom module

You can create custom modules to modify the environment variables. The custom module presented here is a copy of **lince**'s Anaconda/3-2019 module modified for Miniconda.

Custom modules are saved in the modulefiles folder. The folder structure is modulefiles/<app\_name>/ <version>, where <app\_name> is the application name and <version> is the module version. Actually, it may be any name but we use this convention for simplicity.

\$ mkdir -p ~/modulefiles/Miniconda/

Now, use a text editor such as vim or nano to create the file 1.0 with the following content.:

```
$ cd ~/modulefiles/Miniconda
# use a text editor to create the module file called 1.0 (which is the version)
```

Where YOUR\_NUSP is your user id.

#### 1.6.2 Add the module path to MODULEPATH

Now that the module file has been created, one just needs to add the following line to your ~/.bashrc file so that it will be found:

module use --append /scratch/<USER\_ID>/modulefiles/

The next time you log in you will be able to run module avail or module load on the new module.

You also need to add these lines in your SLURM schedule script to load the environment variables:

```
module use --append /scratch/<USER_ID>/modulefiles/
module load Miniconda/1.0
```

#### 1.6.3 Module usage

Just run module to list all available options:

```
$ module
Modules based on Lua: Version 7.8.15 2019-01-16 12:46 -06:00
       by Robert McLay mclay@tacc.utexas.edu
module [options] sub-command [args ...]
Help sub-commands:
_____
                                  prints this message
 help
 help
                     module [...] print help message from module(s)
Loading/Unloading sub-commands:
                     module [...] load module(s)
 load | add
 try-load | try-add module [...]
                                  Add module(s), do not complain if not found
 del | unload
                     module [...] Remove module(s), do not complain if not found
```

```
unload m1 and load m2
 swap | sw | switch m1 m2
                                   unload all modules
 purge
                                   reload aliases from current list of modules.
 refresh
                                   reload all currently loaded modules.
 update
Listing / Searching sub-commands:
_____
                                   List loaded modules
 list
                                   List loaded modules that match the pattern
 list
                     s1 s2 ...
 avail | av
                                   List available modules
 avail | av
                                   List available modules that contain "string".
                     string
 spider
                                   List all possible modules
 spider
                     module
                                   List all possible version of that module file
 spider
                                   List all module that contain the "string".
                     string
                     name/version Detailed information about that version of the
 spider
\rightarrow module.
 whatis
                     module
                                   Print whatis information about module
 keyword | key
                     string
                                   Search all name and whatis that contain "string".
Searching with Lmod:
 All searching (spider, list, avail, keyword) support regular expressions:
                     '^p'
 -r spider
                                   Finds all the modules that start with `p' or `P'
 -r spider
                                   Finds all modules that have "mpi" in their name.
                     mpi
 -r spider
                     'mpi$
                                   Finds all modules that end with "mpi" in their name.
Handling a collection of modules:
_____
                                   Save the current list of modules to a user defined
 save | s
\rightarrow "default" collection.
 save | s
                     name
                                   Save the current list of modules to "name".
\rightarrow collection.
 reset
                                   The same as "restore system"
                                   Restore modules from the user's "default" or system.
 restore | r
⊶default.
                                   Restore modules from "name" collection.
 restore | r
                     name
 restore
                                   Restore module state to system defaults.
                     system
                                   List of saved collections.
 savelist
 describe | mcc
                                   Describe the contents of a module collection.
                     name
                                   Disable a collection.
 disable
                     name
Deprecated commands:
------
 getdefault
                     [name]
                                   load name collection of modules or user's "default"
\rightarrow if no name given.
                                                                       ===> Use "restore
\rightarrow" instead <====
 setdefault
                                   Save current list of modules to name if given,
                     [name]
⇔otherwise save as the default list for you the
                                                                       user.
```

```
===> Use "save"
\rightarrow instead. <====
Miscellaneous sub-commands:
_____
                            return true if module is loaded
 is-loaded
                modulefile
 is-avail
                modulefile
                            return true if module can be loaded
 show
               modulefile
                            show the commands in the module file.
                            Prepend or Append path to MODULEPATH.
 use [-a]
                path
                 path
                            remove path from MODULEPATH.
 unuse
 tablelist
                            output list of active modules as a lua table.
Important Environment Variables:
-----
                            If defined to be "YES" then Lmod prints properties
 LMOD_COLORIZE
\rightarrow and warning in color.
         _____
_____
Lmod Web Sites
 Documentation:
               http://lmod.readthedocs.org
 Github:
               https://github.com/TACC/Lmod
 Sourceforge:
               https://lmod.sf.net
 TACC Homepage:
               https://www.tacc.utexas.edu/research-development/tacc-projects/lmod
 To report a bug please read http://lmod.readthedocs.io/en/latest/075_bug_reporting.html
      _____
    _____
```

https://researchcomputing.princeton.edu/support/knowledge-base/modules

https://researchcomputing.princeton.edu/support/knowledge-base/custom-modules

# 1.7 Slurm

Slurm Workload Manager is an open source, fault-tolerant, and highly scalable cluster management and job scheduling system for large and small Linux clusters. It is used by many of the world's supercomputers and computer clusters.

Slurm manages the amount of resources allocated to each job. The number of nodes, CPU cores, memory, GPUs and period are examples of resources one can allocate to a particular job. This is ideal for distributed computing among several nodes.

Machine learning and deep learning models can be trained in HPC with Tensorflow, PyTorch, Dask or other distributed computing library.

Read the official Quick Start User Guide for an overview of the architecture, commands and examples.

Princeton Research Computing also provides a good introduction to Slurm.

# 1.7.1 Commands

This introductory video shows some useful commands.

https://youtu.be/U42qlYkzP9k

Here's a list of some commonly used user commands. See Slurm man pages for a complete list of commands or download the command summary PDF. Note that all Slurm commands start with 's'.

Command	Description
sbatch <slurm_script></slurm_script>	Submit a job script for later execution.
scancel <jobid></jobid>	Cancel a pending or running job or job step
srun	Parallel job launcher (Slurm analog of mpirun)
squeue	Show all jobs in the queue
squeue -u <username></username>	Show jobs in the queue for a specific user
squeuestart	Report the expected start time for pending jobs
squeue -j <jobid></jobid>	Show the nodes allocated to a running job
scontrol show config	View default parameter settings
sinfo	Show cluster status

## 1.7.2 Job schedule

Submit a script to the queue with sbatch <script>:

```
$ sbatch script.sh
```

The options of sbatch command may be inserted into the script following the #SBATCH directive:

```
$ cat script.sh
#!/bin/bash -v
#SBATCH --partition=GPUSP4
                                # partition name. lince = 'GPUSP4', aguia = 'SP2'
#SBATCH --job-name=tr-ae
                                # job name
                                # number of nodes allocated for this job
#SBATCH --nodes=1
#SBATCH --ntasks=2
                                # total number of tasks / mpi processes
#SBATCH --cpus-per-task=8
                                # number OpenMP Threads per process
                                # total run time limit ([[D]D-]HH:MM:SS)
#SBATCH --time=08:00:00
#SBATCH --gres=gpu:tesla:2
                                # number of GPUs
# Get email notification when job begins, finishes or fails
#SBATCH --mail-type=ALL
                                # type of notification: BEGIN, END, FAIL, ALL
                                # e-mail address
#SBATCH --mail-user=your@mail
# OpenMP settings used for parallel processing.
# Check your library documentation for custom configuration (Tensorflow, PyTorch, Dask,
\rightarrowetc)
# Reference: https://www.openmp.org/spec-html/5.0/openmpch6.html#openmpse50.html
export OMP_NUM_THREADS=1
export MKL_NUM_THREADS=1
export OMP_PLACES=threads
export OMP_PROC_BIND=spread
# Slurm controller sets these variables in the environment of the batch script
# More variables at https://slurm.schedmd.com/sbatch.html#lbAK
echo $SLURM_JOB_ID
                                # ID of job allocation
```

```
echo $SLURM_SUBMIT_DIR  # The directory from which sbatch was invoked
echo $SLURM_JOB_NODELIST  # List of nodes allocated to the job
echo $SLURM_NTASKS  # Total number of cores for job
# Load modules. Use "module avail" to list available modules.
# This example loads a custom module.
module use --append /scratch/11568881/modulefiles/
module load Miniconda/1.0
# Run the application.
echo [`date '+%Y-%m-%d %H:%M:%S'`] Running $AE_ARCH
srun <train_model.py>
```

UiT The Arctic University of Norway provides additional job script examples.

# 1.8 GPU Usage

Each **lince** server has 2 NVIDIA Tesla GPUs installed. This cluster should be used to run GPU jobs; if you don't need GPU then use **aguia** instead.

You may check the GPU usage with the nvidia-smi command in any server except the login server which is used only for job scheduling.

Example of GPU using 67MiB of memory usage, 74% and 0% utilization on GPU 0 and 1 respectively and process ID 29150:

```
$ nvidia-smi
Sun May 2 16:54:50 2021
+-----+
| NVIDIA-SMI 418.67 Driver Version: 418.67 CUDA Version: 10.1
                                    |-----+
| GPU Name Persistence-M| Bus-Id Disp.A | Volatile Uncorr. ECC |
| Fan Temp Perf Pwr:Usage/Cap| Memory-Usage | GPU-Util Compute M. |
0 Tesla K20m 0ff | 00000000:05:00.0 0ff |
                                   0
| N/A 68C P0 106W / 225W | 78MiB / 4743MiB |
                           74% Default |
1 Tesla K20m
         Off | 00000000:83:00.0 Off |
                                   0 |
| N/A 30C P8 16W / 225W | 0MiB / 4743MiB | 0% Default |
                 _____
  -----+--
+------
| Processes:
                               GPU Memory |
     PID Type Process name
GPU
                               Usage
                                    C ...gramas/intel/gromacs-5.1.4-cuda/bin/gmx 67MiB |
  0
    29150
 -----+
```

Message "No running processes found" on idle GPUs:

\$ nvidia-smi Sun May 2 16:55:18 2021

				Driver	Version:	418.	67	CUI	DA Versio	on: 10.1	
GPU Fan	Name Temp	Perf	Persis Pwr:Us	stence-M  sage/Cap	Bus-Id	Memo	Disp.A ry-Usage		Volatile GPU-Util	Uncorr. EC Compute M	C   .
0 N/A	Tesla 36C	K20m P8	25W	Off   / 225W	0000000 11M	0:05: iB /	00.0 Off 4743MiB		0%		0   t
1 N/A	Tesla 28C	K20m P8	16W	Off   / 225W	0000000 0M	0:83: iB /	00.0 Off 4743MiB		0%		0   t
Proc GPU	esses:	PID	Туре	Process	name					GPU Memor Usage	
No	running	g proc	esses :	found							==

Example of error message:

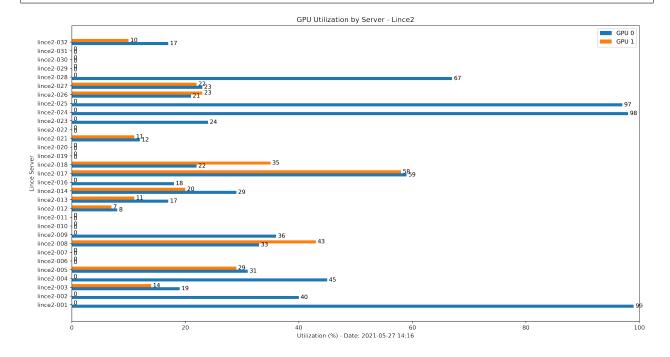
\$ nvidia-smi
Unable to determine the device handle for GPU 0000:05:00.0: GPU is lost. Reboot the
→system to recover this GPU

# 1.8.1 Check all servers

A more practical way to check the GPU usage in all servers is using a script. The gpu\_mon.py script connects to each server and checks the GPU status. Then, it prints a list of servers with idle and falty GPUs, creates a bar plot and sends an e-mail with GPU usage:

```
$ python gpu_mon.py
Number of servers: 32
Two GPUs in use: 13 servers.
-----
lince2-003
lince2-005
lince2-008
lince2-012
lince2-013
lince2-014
lince2-017
lince2-018
lince2-020
lince2-021
lince2-026
lince2-027
lince2-032
```

One GPUs in use: 10 servers. ----lince2-001 lince2-002 lince2-004 lince2-009 lince2-011 lince2-016 lince2-023 lince2-024 lince2-025 lince2-028 No GPUs in use: 8 servers. ----lince2-006 lince2-007 lince2-010 lince2-019 lince2-022 lince2-029 lince2-030 lince2-031 Faulty GPUs: 0 servers. \_\_\_\_\_ Connection failure: 1 servers. \_\_\_\_\_ lince2-015



gpu\_mon script:

```
#!/scratch/11568881/miniconda3/bin/python
#%%
.....
This module collects GPU utilization on all servers in lince cluster. This is useful to.
\rightarrow help
identify possible improvements in job speed and free resources for other users.
Ideally GPU utilizatin should be high for the most part of the time.
Process:
1. Connect to all servers via SSH and collect GPU usage.
2. Create a data frame with server and both GPUs usage.
3. Create a horizontal bar chart of GPU usage by server.
4. Send a summary and plot by e-mail.
import os, re, datetime
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import smtplib, mimetypes
from email.message import EmailMessage
def message(msg, servers):
        """Format server status message."""
        text = ' n'
        text += msg + str(len(servers)) + " servers.\n"
        text += "-"*30 + "\n"
        for server in servers:
                text += server + '\n'
        return text
def gpustatus(result_fname, summary_fname):
        """Connect to each server and collect GPU information.
Result is saved in a log file.
.....
                       # GPU utilization
        gpu = \{\}
                      # Servers with 0 GPUs in use
        no_gpu = []
        one_gpu = [] # Servers with 1 GPU in use
        two_gpu = []
                      # Servers with 2 GPUs in use
        gpudown = []
                      # Servers with faulty GPUs
        no_route = [] # Servers with connection failure
        servers = []
                       # List of servers
        df = pd.DataFrame(columns = ['Server', 'GPU 0', 'GPU 1'])
        for n in range(1, 33):
                # Connect to each server in the cluster and send commands
                server_name = 'lince2-' + ("000" + str(n))[-3:]
                servers.append(server_name)
                cmd = 'ssh {} "hostname;nvidia-smi"'.format(server_name)
                pipe = os.popen(cmd, 'r')
                print("Processing server:", server_name)
```

```
for row in pipe.read().split('\n'):
                       #lince2-001.hpc.usp.br
                       server_re = re.search(r'(lince\d-(\d+))\.hpc', row)
                       #| 0 Tesla K20m
                                                  Off | 00000000:05:00.0 Off |
                                                                                       ш.
             0 /
gpuId_re = re.search(r' | s+(d) + Tesla', row)
                       #| N/A 62C P0 104W / 225W | 78MiB / 4743MiB |
                                                                                     73
∽%
        Default |
                       utilization_re = re.search(r'B \|\s+(\d+)%\s+', row)
                       # Read server name
                       if server_re:
                               server = server_re.group(1)
                       # Read GPU error message
                       elif "Unable to determine the device handle for GPU" in row:
                               gpudown.append(server)
                       # Read GPU ID: 0 or 1
                       elif gpuId_re:
                               gpuId = int(gpuId_re.group(1))  # GPU 0 or 1
                       # Read GPU utilization
                       elif utilization_re:
                               gpu[gpuId] = int(utilization_re.group(1))
                               if gpuId:
                                       df.loc[len(df) + 1] = server, gpu[0], gpu[1]
                                       # Identify number of GPUs in use
                                       if not (gpu[0] or gpu[1]):
                                               no_gpu.append(server) # 0 GPUs in use
                                       elif gpu[0] and gpu[1]:
                                               two_gpu.append(server) # 1 GPU in use
                                       else:
                                               one_gpu.append(server) # 2 GPUs in use
               pipe.close()
       # Connection failure
       checked_servers = two_gpu + one_gpu + no_gpu + gpudown
       for server in servers:
               if not server in checked_servers:
                       no_route.append(server)
       checked_servers += no_route
       # Summary of GPU usage
       n = len(checked_servers)
       summary = "Number of servers: {} \n".format(str(n))
       summary += message("Two GPUs in use: ", two_gpu)
       summary += message("One GPUs in use: ", one_gpu)
       summary += message("No GPUs in use: ", no_gpu)
       summary += message("Faulty GPUs: ", gpudown)
       summary += message("Connection failure: ", no_route)
       print(summary)
       # Save data frame and summary
       df.to_csv(result_fname)
```

```
with open(summary_fname, 'w') as f:
                f.write(summary)
        return
def create_plot(result, plot):
        """Create plot of GPU usage per server."""
        df = pd.read_csv(result)
        # Create plot
        x = np.arange(len(df['Server'])) # the label locations
        width = 0.35 # the width of the bars
        fig, ax = plt.subplots(figsize=(15,8))
        rects1 = ax.barh(x - width/2, df['GPU 0'], width, label='GPU 0')
       rects2 = ax.barh(x + width/2, df['GPU 1'], width, label='GPU 1')
        # Add some text for labels, title and custom x-axis tick labels, etc.
       now = datetime.datetime.now()
        dt = now.strftime("%Y-%m-%d %H:%M")
        ax.set_title('GPU Utilization by Server - Lince2')
        ax.set_xlabel('Utilization (%) - Date: {}'.format(dt))
        ax.set_xlim(0, 100)
        ax.set_ylabel('Lince Server')
        ax.set_yticks(x)
        ax.set_yticklabels(df['Server'])
        ax.legend()
        ax.bar_label(rects1, padding=3)
        ax.bar_label(rects2, padding=3)
        fig.tight_layout()
        # Save and show plot
       plt.savefig(plot, dpi=300, bbox_inches='tight')
       plt.show()
       return
def send_email(receiver, message, plot_fname):
   """Send email with summary of GPU usage and plot."""
   # Create message and set text content
   sender = 'no-reply@lince2.hpc.usp.br'
  msg = EmailMessage()
  msg['Subject'] = 'Lince: GPUs Status'
  msg['From'] = sender
  msg['To'] = receiver
   # Message content
  body = """*** Automatic e-mail, do not reply. ***
Status of lince servers.
```

```
See attached plot.
.....
  body += message
  msg.set_content(body)
   # Attach plot
  with open(plot_fname, 'rb') as fp:
          file_data = fp.read()
          maintype, _, subtype = (mimetypes.guess_type(plot_fname)[0] or 'application/
→octet-stream').partition("/")
          msg.add_attachment(file_data, maintype=maintype, subtype=subtype,__

→filename=plot_fname)

   # Send e-mail
  with smtplib.SMTP('localhost') as server:
          server.sendmail(sender, receiver, msg.as_string())
          print("Successfully sent email")
if __name__ == '__main__':
       now = datetime.datetime.now()
        dt = now.strftime("%Y%m%d_%H%M")
        plot_fname = 'plot/gpu_status_{}.png'.format(dt)
        result_fname = 'gpu.csv'
        summary_fname = 'summary.txt'
        # 1. Execute GPU checks
        gpustatus(result_fname, summary_fname)
        # 2. Create plot
        create_plot(result_fname, plot_fname)
        # 3. Send result by e-mail
        receiver = 'your@email.com'
        with open(summary_fname, 'r') as f:
                rows = f.readlines()
                msq = ''
                for row in rows:
                        msg += row
        send_email(receiver, msg, plot_fname)
        # 4. Delete files
        for fname in [plot_fname, result_fname, summary_fname]:
                os.unlink(fname)
```

# **1.9 Useful Linux Commands**

## 1.9.1 Manual pages

The man command provides an online reference manual of any command. For example, use this command to see reference of 1s:

\$ man ls

## 1.9.2 Linux processes

The top command shows CPU and memory usage, running processes and other information. It provides a dynamic view of the sytem usage:

\$ top									
top - 14:32:01	up 5	46 d	ays, 5 m	nin, 6	users,	10	oad av	verage	e: 0.40, 0.33, 0.27
Tasks: 351 tota	1,	1 r	unning,	331 sle	eping,	17	′stop	oped,	2 zombie
%Cpu(s): 0.2 u	s,	0.2	sy, 0.0	) ni, 97	.0 id,	2.	6 wa,	, 0.0	0 hi, 0.1 si, 0.0 st
KiB Mem : 13182	566+	tota	1, 2305	5124 fre	e, 7829	9865	56 use	ed, 51	1221880 buff/cache
KiB Swap:	0	tota	1,	0 fre	e,		0 use	ed. 49	9155016 avail Mem
PID USER	PR	NI	VIRT	RES	SHR	S	%CPU	%MEM	TIME+ COMMAND
6763 ganglia	20	0	406312	131972	1376	S	2.7	0.1	17495:02 gmond
6695 ganglia	20	0	632268	15936	396	S	1.8	0.0	21331:43 gmetad
30101 11568881	20	0	162268	2568	1612	R	1.4	0.0	0:00.07 top
11222 mysql	20	0	54.8g	49.1g	4480	S	0.9	39.0	1790:49 mysqld
1 root		20	0 193	3924 6	028	1728	3 S	0.0	0.0 295:43.67 systemd
2 root		20	0	0	0	0	) S	0.0	0.0 0:13.83 kthreadd
3 root		20	0	0	0	0	) S	0.0	0.0 402:24.01 ksoftirqd/0
8 root		rt	0	0	0	0	) S	0.0	0.0 0:25.18 migration/0
9 root		20	0	0	0	0	) S	0.0	0.0 0:00.00 rcu_bh
10 root	20	0	0	0	0	S	0.0	0.0	544:55.47 rcu_sched
11 root	0	-20	0	0	0	S	0.0	0.0	0:00.00 lru-add-drain
12 root	rt	0	0	0	0	S	0.0	0.0	3:27.55 watchdog/0
13 root	rt	0	0	0	0	S	0.0	0.0	3:18.02 watchdog/1
14 root	rt	0	0	0	0	S	0.0	0.0	1:22.39 migration/1
15 root	20	0	0	0	0	S	0.0	0.0	370:18.79 ksoftirqd/1

# 1.9.3 Running in background

Connection may drop for several reasons, including computer hibernation. When this occurs, Linux terminates all processes running in the disconnected terminal and you have to run them again. The simplest way to keep the process running is sending to background by adding & to the command:

\$ sleep 60 &

A message appears when the process ends:

[1]+ Done

sleep 60

To send a running process to the background, suspend execution with  $\langle CTRL \rangle + z$  and execute bg to send to background:

\$ sleep 60	
^Z	
[1]+ Stopped	sleep 60
\$ bg	
[1]+ sleep 60 &	

Bring back to foreground with fg.

#### 1.9.4 screen

The screen command opens a virtual terminal that keeps running even when the main terminal is disconnected. Another real terminal can connect to it, which makes it useful when installing packages.

Steps to use screen:

- 1. Open a virtual terminal with the screen command.
- 2. Run any command or script in this terminal.
- 3. While the command is running, disconnect the terminal with  $\langle CTRL \rangle$  + a and  $\langle CTRL \rangle$  + d.
- 4. Run screen -1s to list all virtual terminals.
- 5. Reconnect with screen -r.

Common options:

- <CTRL> + a c Create a new window (with shell)
- <CTRL> + a " List all window
- <CTRL> + a 0 Switch to window 0 (by number)
- <CTRL> + a A Rename the current window
- <CTRL> + a S Split current region horizontally into two regions
- <CTRL> + a | Split current region vertically into two regions
- <CTRL> + a tab Switch the input focus to the next region
- <CTRL> + a <CTRL> + a Toggle between the current and previous region
- <CTRL> + a Q Close all regions but the current one
- <CTRL> + a X Close the current region

# 1.10 Resources for Researchers

## 1.10.1 Systematic literature review

Parsifal is an online tool designed to support researchers to perform systematic literature reviews within the context of Software Engineering. Geographically distributed researchers can work together within a shared workspace, designing the protocol and conducting the research.

As well as providing a way to document the whole process, the tool will help you remind what is important during a systematic literature review. During the planning phase, Parsifal will help you with the objectives, PICOC, research

questions, search string, keywords and synonyms, selecting the sources, the inclusion and exclusion criterias. Will also provide mechanisms to build a quality assessment checklist and data extraction forms.

During the conducting phase, you will be able to import bibtex files and select the studies, find duplicates among all the different sources, execute the quality assessment and extract data from the papers.

# 1.10.2 Advanced Information Research Skills (AIRS)

Advanced Information Research Skills (AIRS) is a coursework for Higher Degree Research (HDR) students enrolled in a Doctor of Philosophy (PhD) or Master of Philosophy (MPhil) at Queensland University of Technology (QUT), Australia. The curriculum content is openly accessible, creative commons licensed and available for use by all.

The curriculum includes:

- · formulating a good research question
- · advanced search strategies
- sourcing and evaluating quality literature
- · bibliographic and data management
- note-taking strategies
- · citation analysis and research impact
- collaboration tools
- · authorship and academic integrity
- publishing and pathways.

https://youtu.be/Z1mBTHw3xVo

## 1.10.3 Researcher Academy

Researcher Academy provides free access to countless e-learning resources designed to support researchers on every step of their research journey. Browse our extensive module catalogue to uncover a world of knowledge, and earn certificates and rewards as you progress.

#### **RESEARCH PREPARATION**

- Funding
- · Research data management
- · Research collaborations

#### WRITING FOR RESEARCH

- · Fundamentals of manuscript preparation
- · Writing skills
- · Technical writing skills
- Book writing

#### PUBLICATION PROCESS

- · Fundamentals of publishing
- Finding the right journal

- Ethics
- Open science
- How to publish in premium journals
- Publishing in the Chemical Sciences

#### NAVIGATING PEER REVIEW

- Certified Peer Reviewer Course
- Fundamentals of peer review
- Becoming a peer reviewer
- Going through peer review

#### COMMUNICATING YOUR RESEARCH

- Social impact
- Ensuring visibility
- Inclusion and Diversity for Researchers

# 1.10.4 Reference managers

Reference managers help collect, organize and share references and create citations in various formats. Mendeley and Zotero are free reference managers.

#### Mendeley

Mendeley simplifies your workflow, so you can focus on achieving your goals.

#### Zotero

Zotero is a free, easy-to-use tool to help you collect, organize, cite, and share research.

# 1.10.5 Datasets

#### Mendeley

Mendeley Data is a secure cloud-based repository where you can store your data, ensuring it is easy to share, access and cite, wherever you are.

Search 28.1 million datasets from domain-specific and cross-domain repositories.

#### **OpenML**

The Open Machine Learning is a public repository for machine learning data and experiments, that allows everybody to upload open datasets. It integrates with scikit-learn.

https://youtu.be/1N3qATxXrpE

Example:

```
from sklearn import ensemble
from openml import tasks, flows, Runs
task = tasks.get_task(3954)
clf = ensemble.RandomForestClassifier()
flow = flows.sklearn_to_flow(clf)
run = runs.run_flow_on_task(task, flow)
result = run.publish()
```

Key features:

- Query and download OpenML datasets and use them however you like
- Build any sklearn estimator or pipeline and convert to OpenML flows
- Run any flow on any task and save the experiment as run objects
- Upload your runs for collaboration or publishing
- Query, download and reuse all shared runs

#### **Tensorflow Datasets**

Tensorflow Datasets (TFDS) provides a collection of ready-to-use datasets for use with TensorFlow, Jax, and other Machine Learning frameworks.

https://www.tensorflow.org/datasets/catalog/overview

https://youtu.be/-nTe44WT0ZI

#### **Google Research**

Google periodically releases data of interest to researchers in a wide range of computer science disciplines.

https://research.google/tools/datasets/

#### Google dataset search

Google provides a search engine for datasets. Discover datasets hosted in thousands repositories.

https://datasetsearch.research.google.com/

### **PyTorch**

Torch Audio: https://pytorch.org/audio/stable/datasets.html Torchvision: https://pytorch.org/vision/stable/datasets.html Torch text: https://pytorch.org/text/stable/datasets.html

# 1.11 Getting Support

Before getting support, check the FAQ page.

If you need support for shark, aguia or lince, access the support website and click in Usuário:





← Agente de suporte



STI - Superintendência de Tecnologia da Informação CeTI-SP - Centro de Tecnologia da Informação de São Paulo

Then log into sistema USP and click "Chamados->Novo Chamado"

Atendi	mento STI
Selecione o fuso	horário de sua preferé
Chamados FA	Q
Novo Chamado	
Meus Charnados	Criar novo Ticket. (
Procurar	.00124 Lince: Fa

Under "Serviço:" select "Internuvem->HPC (Águia e Lince)"

# Atendimento STI Selecione o fuso horário de sua preferência e confirme ao clicar no botão salvar. Chamados FAQ

<ul> <li>Ambiente de Desktop Virtual</li> </ul>	at the second sec	*sem classificação
<ul> <li>Aplicativos Móveis (celular)         <ul> <li>Aplicativos videoaula e videoconferencia (Google Meet, Teams, Conferencia/Web)</li> <li>Áudio e Vídeo</li> <li>E-mail                  Envio de MSG - Comunicador STI                  Gravar reunião no Conferência/Web                  Incubadora de Sites                  Infraestrutura elétrica do IDC-CeTI-SP</li> <li>Internuvem                  Hospedagem de Site                  HPC (Águia e Lince)                  Máquina Virtual (VM)                        Repositório GIT</li>                  Licenças de Software</ul></li>                  Microinformática                  Moodle (edisciplinas, cursoextensao)                  OTRS-DRH                  Portal de Serviços Computacionais </ul>	<b>*</b> Assunto:	Ambiente de Desktop Virtual
Aplicativos videoaula e videoconferencia (Google Meet, Teams, ConferenciaWeb)  Adudio e Vídeo  E-mail Envio de MSG - Comunicador STI Gravar reunião no ConferênciaWeb Incubadora de Sites Infraestrutura elétrica do IDC-CeTI-SP  Internuvem Hospedagem de Site HPC (Águia e Lince) Máquina Virtual (VM) Repositório GIT Licenças de Software Microinformática Moodle (edisciplinas, cursoextensao) OTRS-DRH Portal de Serviços Computacionais	• Texto:	Aplicativos Google (Drive, Classroom, Youtube, Agenda)
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		Pró-Aluno

# 1.12 About

This is the unofficial guide to High-Performance Computing clusters at Universidade de Sao Paulo. I created this document while configuring the environment to train a machine learning model during my master's degree research. It's quick start guide to help new users setup the development environment, schedule jobs and train ML/DL models fast. For detailed information on each topic, I suggest searching the Internet.

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# 1.13 License

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