Enabling Fastai Multi-GPU/DDP Training in Jupyter

- fastai: to make building high-performing AI application easy
 - Open source, free lessons videos + Jupyter notebooks
- Distributed Data Parallel (DDP):
 - o a multiprocess-based parallelism to speed up training with multiple GPUs/nodes.

"fastai + DDP" cmdline app is trivial [1], but ...

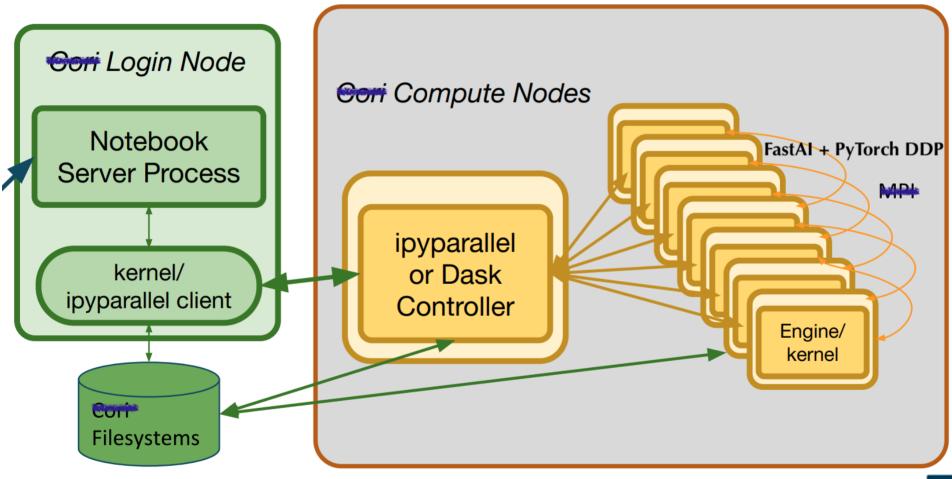
"Distributed training doesn't work in a notebook..."[2]

Ddip tries to bridge this gap.

- [1] See Reproducing DAWNBench winning results in a few lines of code
- [2] FastAI's tutorial on How to launch a distributed training

Ddip - **D**istributed **d**ata "interactive" **p**arallel

An iPython extension to control PyTorch DDP from within Jupyter, uses ipyparallel underneath.







Ddip - **D**istributed **d**ata "interactive" **p**arallel

Usage:

Control DDP and cell execution destination using % and %% magics

- \%load ext Ddip, to load the extension.
- %makedip ..., to start/stop/restart a DDP group, and an app, e.g. fastai v1.
- %%dip {remote, local, everywhere} ..., where to execute the cell.
- <code>%autodip {on,off}</code>, to automatically prepend <code>%%dip</code> to subsequent cells.
- <code>%dipush</code>, and <code>%dipull</code>, to pass objects between the notebook and the DDP namespaces.

Speedup in Training

Notebook	[3-GPUs timing]	[Single-GPU timing]
lesson3-CamVid:	[3:30,4:24,12:00,12:52]	[7:33,9:12,31:50,33:40]
lesson3-planet:	[3:20,3:45,6:15,7:30]	[4:20,5:35,14:35,18:30]
lesson7-superres-imagenet:	[4:17]	[10:50]
lesson7-wgan:	[13:30/epoch] <i>Ouch</i> !	[4:41/epoch]

Limitations

- Works a single host only. Luckily ipyparallel does support cluster of nodes.
- Not all models gain: one model is flat, one has accuracy problem.
- a wgan model manages to achieve linear slow down!! 🗑

Ddip - **D**istributed **d**ata "**i**nteractive" **p**arallel

Fun Lessons learned:

- 1. Python's dynamic nature empowers: patch classes dynamically, toss objects/functions across multiple processes.
- 2. Hooks/callbacks architecture are truly flexible: Jupyter, fastai.
- 3. Multiprocess + multi-GPUs + Jupyter offer interesting complexity and opportunities
 - o data movement, race conditions, proc & mem mgmt.
- 4. Design choices:
 - o user semantics %, %% vs library calls
 - o deadlock solutions single proc or careful synchronization
 - o implicit vs explicit: what to automate, what to display

Looking Forward

- <u>fastai v2</u> is out already.
- <u>nbdev</u> as productivity boost.
- Support cluster of nodes.
- Feedbacks and contribution via github are welcome! (philtrade@winphil.net)

Github Repo: https://github.com/philtrade/Ddip/