Practical Session 1: Hyper-parameters and training basics with PyTorch

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This first Practical Session aims at giving you some understanding about the various hyper-parameters that need to be tuned when training a deep learning model. This implies the conception of the model architecture as well as the specifics of the training process. Each problem has its particularities, and needs a tailored model to solve it.

The exercise is split into 2 problems, each presented as a Jupyter notebook. For each of them, your task will be to gradually experiment with the various accessible hyper-parameters to create a model that can solve this problem with good accuracy and reasonable computing resources.

You can do this work in groups composed of up to 3 persons. Each group will have to submit a written report (.pdf) of 2 pages containing the following:

- For each problem, a paragraph including the architecture details of the best model you managed to conceive, and the training process used to train it, as well as its numerical performance;
- A global discussion (for all problems together) including:
 - Your analysis of the trade-offs between the performance of the final model, the time it takes to train it, and the time needed to tune all the hyper-parameters;
 - For each relevant kind of parameters (the various architectural choices, the optimiser configuration, the training process details, etc...), a paragraph explaining what you found about how it impacts the training process and the performance of the model.

^{*}based on materials conceived with Victor Berger & Wenzhuo Liu

This homework is to be sent within 2 weeks, i.e. before February 7th. Do not wait for the last moment to start, as hyper-parameter tuning is time-demanding. Playing with hyper-parameters might seem a bit tiresome but it is a necessary step to gain experience with them, understand them and be at ease later for the training of bigger networks.

More information:

- The report (in pdf format) will have to be submitted on a website that will be announced on the course webpage as well as on the Discord forum (do not forget to join it!). Please aim at 2 pages as asked (not 1 nor 5!).
- A forum is opened (on Discord), for students to help each other on technical points and to ask questions to teachers and TAs (link received when registering to the course).
- Possible environments to consider are proposed on the course webpage (local installation vs. remote free computing server). Note that all exercises will be conceived so that your laptop's CPU is sufficient (no GPU card needed).
- On the course webpage you will also find a document entitled Tips and tricks to train neural networks, containing general advise for neural network training. It might help to read it again each time you encounter an issue.