PROGRAM ROADMAP

Iskriyana Vasileva

AGENDA

- Intro Round
- The DSR Roadmap
- Get You Ready for Data Science
- How to Set Up a Data Science Project
- An Example of a Data Science Project
- Cheat Sheets
- Some Meetup groups (in Berlin)

INTRO ROUND

INTRO

- About me:
 - A data enthusiast 11 years in the field
 - Did DSR to transition from BI Analyst to Data Scientist
 - https://www.linkedin.com/in/iskriyanavasileva/
- About this class:
 - You can ask questions at any time
 - If you'd like me to change something during the lecture let me know
 - If you think of something after the lecture write to me on LinkedIn or Slack

INTRO

• What about you?

THE DSR ROADMAP

ADMIN

Make sure you have live access to these tools and check them regularly

- Calendar
- Slack (to my message in Slack in #general)

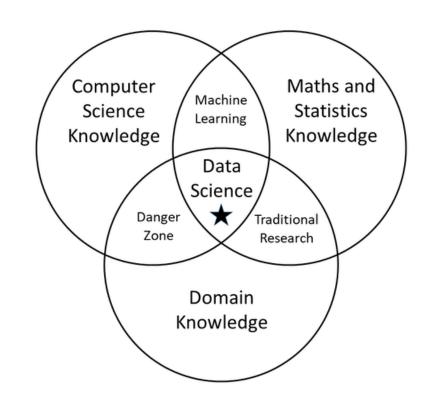
Classes:

- Please, be on time! If not, inform the teacher and your peers on Slack
- The more prepared, the more time for advanced topics in the class
- At the same time keep in mind that the class flow depends on the dynamics of the entire class
- Proactively communicate to the teacher, Arun, Abin or Jose any feedback you have
 - Especially about the speed of the class express it then and there so that the trainer can adapt. The teachers will go by the pace that is required by them. Feedback later won't help you
 - The camp has a certain level of flexibility and is not limited to the timetable or curriculum given
 - The sooner you provide feedback, the faster can the trainers / organisers adjust for e.g. add something to the programme or arrange a QA session
- Attend in person. If you can't due to illness or you have to take care of your child, there is a possibility to participate remotely.
 - Please inform Abin or Arun as soon as possible in order for them to prepare.



THE DSR ROADMAP

- Theoretical & Technical Fundamentals
- Machine Learning Fundamentals
- Mini Competition
- Deep Learning (or the really "cool stuff")
- Practical Data Science
- Soft Skills
- The Final Project



DSR ROADMAP: THEORETICAL & TECHNICAL FUNDAMENTALS

- Python
- Git & Bash
- NumPy
- Pandas
- SQL
- Visualisation
- Statistics, Probability
- Docker & Databases



DSR ROADMAP: THEORETICAL & TECHNICAL FUNDAMENTALS



Purpose – the tools enabling you to work as a data scientist



Tips - do not underestimate them!

Even if you know, use these lecture to refresh your skills & strengthen them.

Ask your trainers for more resources and use the time to learn that.

Prepare questions you encountered during your preparation for the bootcamp but could not find the answer to them. It can be useful for everyone including your teachers.



Useful literature

<u>Data Wrangling with Python</u> (Jacqueline Kazil, Katharine Jarmul)

Python for Data Analysis (Wes Mckinney)

DSR ROADMAP: MACHINE LEARNING FUNDAMENTALS

- DS Fundamentals
- ML fundamentals
- Trees
- Time Series



DSR ROADMAP: MACHINE LEARNING FUNDAMENTALS



Purpose

DS Fundamentals – helps you structure a data science project from a data perspective. You get to do steps such as exploratory data analysis (EDA), data cleaning & preparation (fill in NULL values, oversampling etc.), feature engineering, model development & training, model testing, results delivery

ML Fundamentals – here you go through the "classics" of ML such as linear regression, logistic regression, evaluation metrics of classification etc.

Trees & Time Series – dedicated lecture only for these topics



Tips – absolute must-haves

Some HRs may have questions with ready answers to filter out candidates already during the screening interview

If you get the chance, go through the notebooks in advance & identify questions or potential points you have to optimise

The best way to internalise these concepts is by coding – take a look at projects on Kaggle, towardsdatascience.com and re-do them. Even if you copy code, type it! Speaking from experience – it really does make a difference, as it makes you aware of things you would not notice if only copy-pasteing!



Useful literature

<u>The Elements of Statistical Learning</u> (Jerome H. Friedman, Robert Tibshirani, & Trevor Hastie)

<u>Data Analysis and Data Mining: An Introduction</u> (Adelchi Azzalini & Bruno Scarpa)

DSR ROADMAP: MINI COMPETITION

• 3 days of real data science work





DSR ROADMAP: MINI COMPETITION



Purpose – during the competition you get to experience:

How to work in a team – both technically (repository) & conceptually (task distribution, tackling dependencies, data strategy)

The difference stages of a data science project – data exploration, data cleaning & preparation, feature engineering, model choice, model training, model testing & results delivery

Working on a realistic project



Tips

Enjoy it!

If you have the time after that, develop a clean solution on your own. It can be a good template for future reference

DSR ROADMAP: DEEP LEARNING

- Backpropagation
- Deep Learning Basics
- Natural Language Processing (NLP)
- Computer Vision
- Transfer Learning
- Reinforcement Learning



DSR ROADMAP: DEEP LEARNING



Purpose – this is where the real fun starts! Most probably this is why you chose this bootcamp

Backpropagation – central in deep learning – a mathematical technique for quickly calculating derivatives (the gradients).

Deep Learning Basics – shows you the "deep" in deep learning - layers of increasingly meaningful representations. The number of layers define the depth of the model.

Computer Vision

Tensorflow – image classification using convolutional neural networks (CNNs), Transfer Learning with CNNs, Vision Transformer, Self-supervised training with Variational Autoencoders **PyTorch** - image similarity, data pipelining (processing, augmentation, shuffling, batching), training classifiers with FastAI, object detection & image segmentation using Meta's Detectron2

Natural Language Processing (NLP) – deep dive in word embeddings, transfer learning and attention-based models, text generation

Reinforcement Learning - an agent receives information about its environment and learns to choose actions that will maximize some reward. For instance, a neural network that "looks" at a video- game screen and outputs game actions in order to maximize its score can be trained via reinforcement learning.



Tips

If you can, prepare before the lectures. Do an online course in deep learning. For ex. <u>Coursera's Deep Learning</u>

Definitely pay attention in these lectures – for some of you, it can be a lot to take in. Take some time after the lectures to revisit what was done during the day

PyTorch vs. Tensorflow before & PyTorch vs. Tesorflow now

Try to set a GPU on your own (see literature section). If you decide to do a project with deep learning, you will most probably need a GPU.



Useful literature

<u>Deep Learning</u> (Ian Goodfellow, Yoshua Bengio, Aaron Courville) – THE BIBLE of deep learning

Deep Learning with Python (François Chollet)

Set a GPU on AWS

Set a GPU on Google Cloud

DSR ROADMAP: PRACTICAL DATA SCIENCE

- Practical Aspects of Data Science
- Practical Aspects of Machine Learning / MLOps
- Debugging
- Graph Neural Networks
- Test-driven development



DSR ROADMAP: PRACTICAL DATA SCIENCE



Purpose – practical advice, real-life project approach, deployment



Tips

Try not to skip these lectures. They showcase what you have to deal with once you start working as a data scientist..

DSR ROADMAP: SOFT SKILLS

- Communication
- Career Support



DSR ROADMAP: SOFT SKILLS



Purpose – what to expect at interviews, strategy & effective communication. Both teachers are extremely capable & know their stuff.



Tips

Prepare questions for the Career Support Class

Please, do respond on time for the preparation of the communication class. Kevin prepares accordingly

For the communication class, pick a topic / situation that was challenging for you. You will get very useful feedback & actionable advise.



DSR ROADMAP: THE FINAL PROJECT – LAST 3 WEEKS



Purpose

"Probieren geht über Studieren" ("The proof of the pudding is in the eating.") - practice all you have learned so far.

Data science is about doing and showcasing your skills with meaningful projects:

- you found a topic, for which data science offers a solution / optimisation / invention
- you dealt with the issue of finding or creating data
- you delivered some kind of result

DSR ROADMAP: THE FINAL PROJECT - HOW TO START RESEARCH ON FINDING ONE



Disclaimer - no golden formula for this

One way is to pick a topic, that addresses a challenge in an industry, in which you later want to work

- Batch 25 "Sound of failure" reduce industrial downtime by diagnosing the failure of machines using their acoustic footprint;
- Batch 24 "CAN DEEP LEARNING RELIABLY PREDICT THE CONSUMPTION AND GENERATION OF RENEWABLE ENERGY?"

Address an issue that can solve an every-day problem of many

- Batch 25 "Check your pose" an app that detects your pose and provides you with feedback on the proper posture
- Batch 22 "Deep Food" an app that recognises ingredients from your fridge and gives you recipe suggestions

Take a look at existing research and see if you could improve it or it could inspire you to build upon it

• <u>Paperswithcode</u> – it will provide you with trending machine learning research and the code to it

Take a look at business magazines (for e.g. MIT Technology Review, The Economist, Harvard Business Review) and see what are popular data topics

Discuss with ChatGPT or / and BARD



Admin

Project formation process:

- Seek communication as soon as possible
- Brain-storm with each others
- The idea should be yours you are expected to be creative

Provide an abstract (1 page / 1 paragraph) to Arun. Several advantages:

- You will have more out of your project and will save time and nerves;) → if your project idea is similar to a past project, Arun will put you in touch with the respective team
- Gives you exposure to potential employers \rightarrow there is the possibility to reach out to companies, if you'd like to do it in cooperation with one. !Once you have decided to do the project this way, you are committed!
- Better mentor match → Arun has enough time to reach out to mentors

Mentors - common mentoring (usually Mondays & Thursdays) and separate mentors, if a project topic was picked on time





Admin

Where – flexible – in the office or remote

Topic Choice – ideally after your deep learning sessions 3rd till – 5th of March

Presentation Rehearsal – 03.04.2024

- • Test the tech •
- You will receive good feedback and may be some last-minute ideas

Your demo day: **04.04.2024**





Tips

Mentors – they are there to guide you, to discuss your ideas, but not to micro-manage or check your code.

Idea and teams – stick to them. This will help both you and your mentors.

Data availability is crucial – you can either find a good data set, generate it and / or use transfer learning. Either way – make sure you start early enough with gathering the data

The most complex model is not always the best one. Start with simple & quick solutions to test your approach

Your results may not always be what you'd expect them to be. However, the way to them is also interesting. Share this!

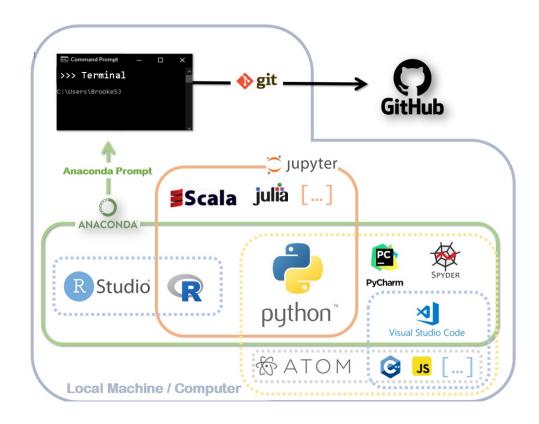
Idea for a presentation structure:

- Why did you choose this project motivation, use cases, background info
- Data used and interesting aspects, challenges and how did you tackle them
- Deep dive into the models used what models did you try, which one is the final one and why, final model performance
- Next steps
- Demo / Recording

If you need a GPU, try to set up one before that

Shell

- A computer program that serves as an interface between the user and the operating system.
 It allows you to access and control various tools and services.
 With the Shell, you can navigate your file system, install and manage packages, run scripts, and interact with other tools like Anaconda, Python, and Git.
- You access it via a <u>terminal emulator</u> ex. for macOS Terminal, iTerms. <u>List of Terminals</u>
- Command-line interface shells use specific scripting language bash / zsh
- Anaconda a Python o distribution platform including some useful applications such as PyCharm, Jupyter Notebook & Lab
- <u>Git</u> a version control tool. "Version control is a system that records changes to a file or set of files over time so that you can recall specific versions later."
- Integrated Development Environment (IDE) <u>PyCharm</u>, <u>Spyder</u>
- <u>Jupyter Lab / Jupyter Notebook</u> Interactive data science environment more visual than IDE, therefore it is used for educational & presentation purposes



Source: https://www.sianbrooke.co.uk/dr-brookes-blog/coding-in-python-managing-packages-with-conda-and-pipg-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packages-with-conda-and-packa

GET YOU READY FOR DS ... ALSO

• Google Colab(oratory)



- Useful:
 - How to Set Up a Data Science Project
 - Terminal for Mac users <u>iTerms</u> (<u>features</u>)
 - <u>Terminal modification</u>, if you'd like it to be more colourful
 - Bash vs. zsh
 - Difference between conda and pip
 - Git in a nutshell
 - Fundamentals of computing & programming

HOW TO SET UP A DATA SCIENCE PROJECT

HOW TO SET UP A DATA SCIENCE PROJECT

Make sure you have Git, Anaconda & PyCharm installed and ideally have a GitHub account.

Let's set a Data Science Project from scratch by following the instructions here: https://github.com/Iskriyana/dsr-teaching-setup



- Maintain a learning structure all of the notebooks can be used for future reference while you are preparing for an interview or when you are working on a future task
- My approach
 - Environment per lecture most of the teachers already have it in their prep instructions
 - Folder / Repo per lecture
 - Notes per lecture
 - Bookmarks per lecture

HOW TO SET UP A DATA SCIENCE PROJECT

Let's now do git clone https://github.com/Iskriyana/dsr-teaching-setup.git

CHEAT SHEETS

CHEAT SHEETS

- Anaconda:
- ohmyzsh:
- More:
 - https://github.com/Iskriyana/dsr-teaching-setup/tree/main/cheatsheets
 - https://github.com/ADGEfficiency/programming-resources/tree/master/cheat-sheets

MEETUPS

MEETUPS IN BERLIN

- Data Science Retreat
- Generative AI on AWS (San Francisco, Global)
- GenAl Gurus Generative Artificial Intelligence
- Berlin DataTalks Club & their slack
- Berlin Machine Learning Group
- meetup.ai
- Deep Learning Würzburg
- PyData
- Google Developer Group
- Berlin Computer Vision Group
- Advanced Machine Studying Group
- Women Who Code Berlin
- PyLadies Berlin
- Women Techmakers Berlin

THANK YOU & HAVE FUN!

