



Hardware Accelerated Scientific Computing with Python

Recep Erol

COSMOS Friday Meeting April 16, 2021





Agenda

- Research Progress
- Tech Stack and Tools
- Future Needs





Research Progress

- YouTube Video Categorization with
 - Moviebarcode
 - Topic Modeling
 - Data Fusion
 - t-SNE
 - Opinion-Mining





Research Progress - Moviebarcode

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	erolrecep link typo fix		4db6da6 11 hours ago 🕚 87 commits	Generate moviebarcodes from a video		
	images	README.md images are added	20 days ago	image-processing feature-extraction		
	src src	Eventbarcode commit for API	20 days ago	🛱 Readme		
	test	test folder is added for later implementation	last month			
	🗅 .gitignore	.gitignore for user-based files/folders	Releases			
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	requirements.txt	working on evenbarcode				
	b video2eventbarcode.py	eventbarcode code is updated with commar	nd-line arguments 20 days ago	Packages		
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- Single moviebarcode
- Multi-thread moviebarcode
- Multi-process moviebarcode
- GPU-based moviebarcode (in progress)





Research Progress - Eventbarcode

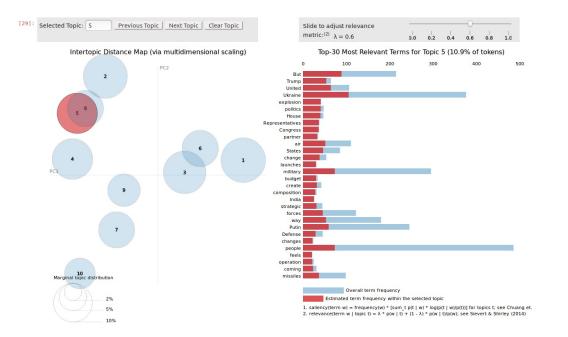


- First-frame (0.3 0.45 seconds)
- Dominant Colors (1.2 2 seconds)
- Short-clip (Future Plan)
- Single-thread eventbarcode
- Multi-process eventbarcode (in progress)
- GPU-based eventbarcode (future plan)





Research Progress – Text Processing

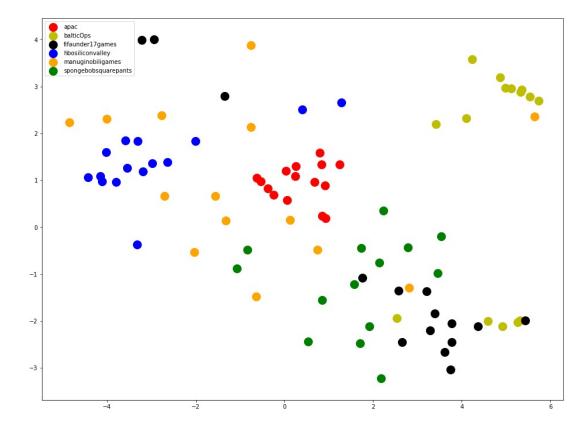


- Text2Vec for feature extraction
- Topic modeling
- Language models (such as BERT)
- Opinion scores
 - Emotion
 - Toxicity





Research Progress – Unsupervised Visualization



• t-SNE

• UMAP (Future Plan)





Research Progress – Speech Recognition

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	YouTube Transcri	ber					
					Languages		
	Installation		 Python 100.0% 				
	This repository includes couple of	otions for transcription;					
	YouTube video transcriber						
	A video transcriber						
	Record your voice and transcr Transcribe while appelying	iber afterwards					
	Transcribe while speaking	nstall couple different softwares/libraries.					

• SoX

- DeepSpeech
- Wav2letter++ (future plan)
- Nemo (future plan)



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Research Progress – Opinion Mining

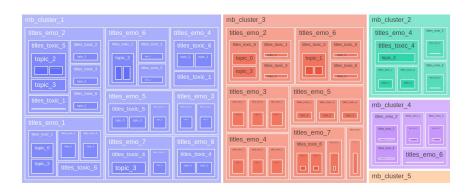
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		Tha	nks.							

- EmoNet
 - Training needed
 - Labeled data
- Audio-based opinion-mining (future plan)
- Visual content-based opinion mining (future plan)





Research Progress – Video Characterization



- Plotly based treemap visualization
- Building web tool for YouTube Video Characterization

Data

APAC BalticOps CanadaElections2019-Influential CanadaElections2019-Suspicious

Dimensions

Movie Barcode

Topic Modeling Toxicity Features Emotion Features Network Clusters Video Categorization Organic/Inorganic Analysis Topic Diversity & Periodicity

Visualization

2D Cluster Results 3D Cluster Results T-SNE Hierarchical Clust. Dendo. Network Communities Treemap Topic Modeling Results

mb_cluster_1		mb_cluster_5	mb_cluster_3	mb_cluster_4		
titles_emo_1	titles_emo_2	titles_emo_1 titles_toxic_3 titles_toxic_2 titles_toxic_2	titles_emo_2	titles_emo_1 titles_toxic_6	titles_emo_6	titles_emo_3
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Tech Stack and Tools - Current

- Python & C++
- NumPy, Scikit-Learn, TensorFlow, and Keras
- OpenCV
- CUDA, CUDA-C
- SoX Sound Exchange

- CPU Programming
- Parallel Computing
- Distributed Computing
- Shared Memory Programming (OpenMP & MPI)
- GPU Programming
- Computer Vision Programming





Tech Stack and Tools - Future

- CPython
- Numba (or PyCUDA)
- Faiss
- CUDA cuDNN
- JAX





Tech Stack and Tools - Future Numba

Build for Scientific Computing

Just in Time (JIT) Compiler

LLVM Compiler Support

CUDA and cuDNN Support

C and Fortran Codebase

NumPy code -> Hardware Code -> Machine Code

from numba import jit
import random

```
@jit(nopython=True)
def monte_carlo_pi(nsamples):
    acc = 0
    for i in range(nsamples):
        x = random.random()
        y = random.random()
        if (x ** 2 + y ** 2) < 1.0:
            acc += 1
    return 4.0 * acc / nsamples</pre>
```





Tech Stack and Tools - Future

- AutoGrad (Deprecated)
- JIT
- XLA
- JAX
- Hardware Acceleration on GPU and TPU







Tech Stack and Tools - Future

- Python optimized AVX instruction Sets
- Built-in CPU acceleration for NumPy, Scikit-Learn, and visualization libraries

Intel[®] Distribution for Python*

Develop fast, performant Python code with this set of essential computational packages including NumPy, SciPy, scikit-learn*, and more.





Future Needs

- New coders are needed for computer vision & GPU programming
- Tool development engineers are needed:
 - Computer vision programming (OpenCV & Python)
 - Machine learning algorithm programmer (TensorFlow & CUDA)





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