Applying Machine Learning Techniques to the Classification of Classical Orchestral Music

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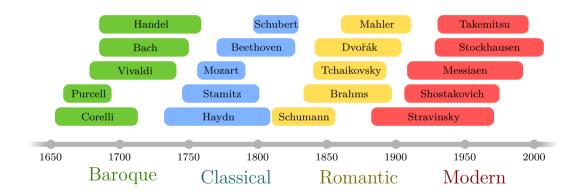


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Timeline of compositional periods

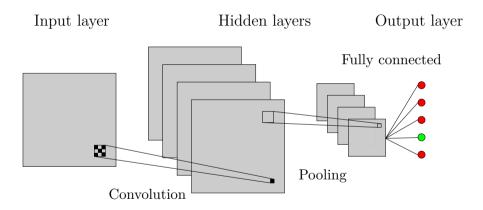


Corpus contents

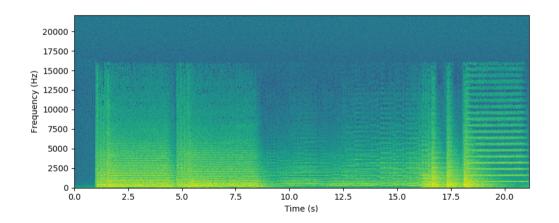
- ▶ 12 composers representing 4 periods
- ▶ 800 15-second samples per composer
- ▶ 40 hours of audio source files

Baroque	Classical	Romantic	Modern			
Corelli	Haydn	Brahms	Stravinsky			
Vivaldi	Mozart	Tchaikovsky	Shostakovich			
Bach	Beethoven	Mahler	Messiaen			

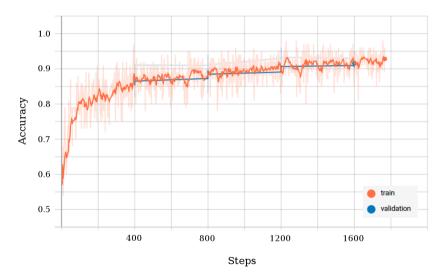
Convolutional neural network (CNN)



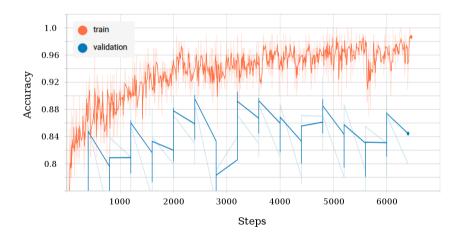
Spectrogram feature



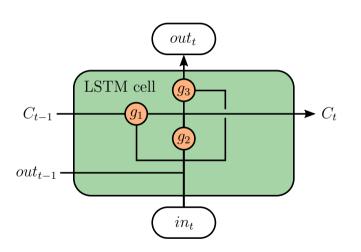
CNN accuracy on MS dataset



CNN accuracy with downsampling (16 kHz)



Long short-term memory network (LSTM)



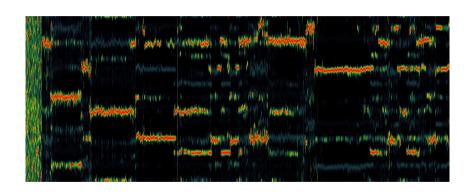
C = cell state

 $g_1 =$ forget gate

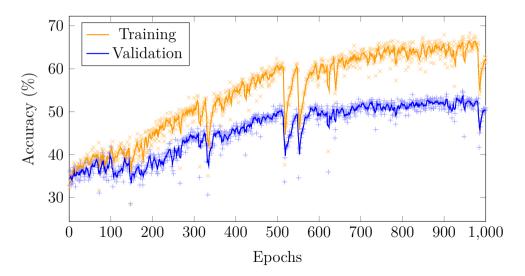
 $g_2 = \text{input gate}$

 $g_3 = \text{output gate}$

HPCP feature



LSTM accuracy on BCRM dataset

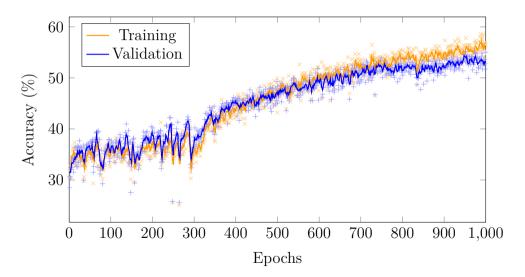


Musical transposition





LSTM accuracy with transpositions

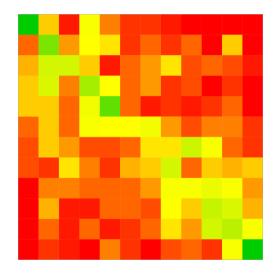


Confusion matrix for composer classification

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(n	= 960)	Cor	Viv	Bac	Hay	Moz	Bee	Bra	Tch	Mah	Str	Sho	Mes
Actual value	Cor	50	8	1	11	5	2	2	1	0	0	0	0
	Viv	4	31	6	10	9	2	4	2	4	0	8	0
	Bac	7	17	17	8	1	4	6	9	3	4	3	1
	Hay	8	16	5	${\bf 24}$	10	4	6	2	3	0	2	0
	Moz	8	8	4	12	35	4	1	1	1	2	4	0
	Bee	4	8	4	11	10	10	12	6	3	5	5	2
	Bra	3	8	6	3	3	4	9	9	18	11	4	2
	Tch	3	2	9	5	2	7	8	17	4	8	7	8
	Mah	0	5	5	4	4	4	6	11	11	13	11	6
	Str	0	7	1	1	4	4	3	10	8	19	16	7
	Sho	0	4	1	4	1	2	4	9	6	17	21	11
	Mes	0	2	1	0	5	2	0	3	4	2	11	50
		87	116	60	93	89	49	61	80	65	81	92	87

Confusion matrix as colour scale



Conclusions

- ► A large, regular corpus of samples was assembled
- ► CNN with spectrograms results in timbre-driven approach
- ▶ RNN with HPCP results in timbre-invariant approach
- ► Transposition is useful as a method to improve training
- ▶ Test accuracy of 55% for period classification
- ► Test accuracy of 31% for composer classification

Future work

- ▶ Resolve performance issues of CNN approach
- ▶ Improve RNN configuration and hyperparameter tuning
- ▶ Combine approaches to create CRNN