Supplementary online material for "On the evaluation of BERT-based models for Italian Sentiment Analysis"

Steve Azzolin - NLU 2020/2021

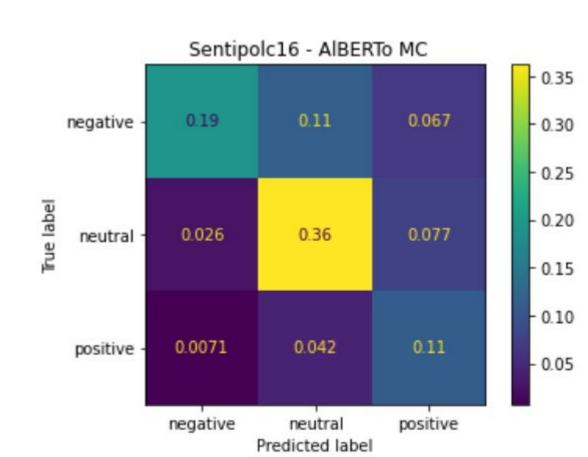
Introduction

- This SOM is aimed at gathering together the detailed results, along with further plots and analysis, presented in the <u>project's report</u>
- For details about the models, datasets, and training/testing procedure check out the report

AIBERTO MC

	precision	recall	f1-score	support
negative	0.85	0.51	0.64	734
neutral	0.70	0.78	0.74	914
positive	0.44	0.69	0.54	316
accuracy			0.67	1964
macro avg	0.66	0.66	0.64	1964
weighted avg	0.71	0.67	0.67	1964

AIBERTo MC



AIBERTO MC

AlBERTo MC's confidence distribution for Sentipolc16 - false negative



AlBERTo MC's confidence distribution for Sentipolc16 - false neutra



AlBERTo MC's confidence distribution for Sentipolc16 - false positiv

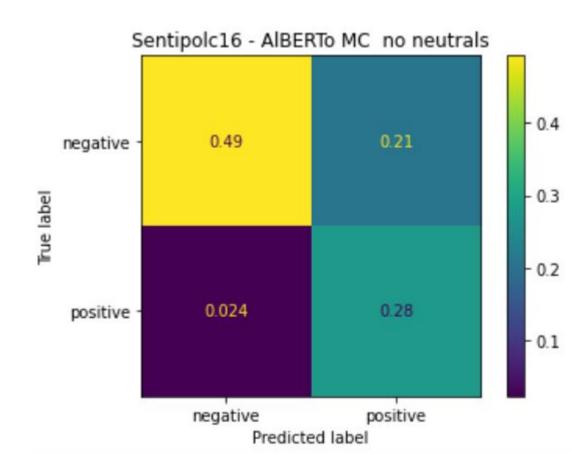


- AIBERTO MC
 - by analyzing the distribution of irony in the predictions errors:
 - 531 samples without irony
 - 125 samples with irony

AIBERTo MC no neutrals

	precision	recall	f1-score	support
negative	0.95	0.70	0.81	734
positive	0.57	0.92	0.71	316
accuracy			0.77	1050
macro avg	0.76	0.81	0.76	1050
weighted avg	0.84	0.77	0.78	1050

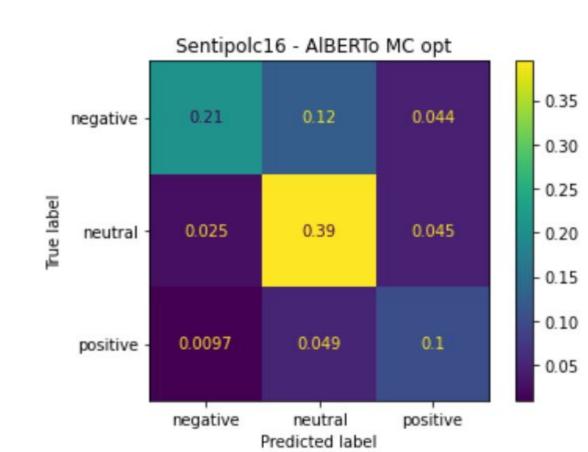
AIBERTo MC no neutrals



AIBERTo MC opt

	precision	recall	f1-score	support
negative	0.85	0.55	0.67	734
neutral	0.70	0.85	0.76	914
positive	0.53	0.63	0.58	316
accuracy			0.70	1964
macro avg	0.69	0.68	0.67	1964
weighted avg	0.73	0.70	0.70	1964

AIBERTo MC opt



AIBERTo MC opt

AlBERTo MC opt's confidence distribution for Sentipolc16 - false ne



AlBERTo MC opt's confidence distribution for Sentipolc16 - false ne



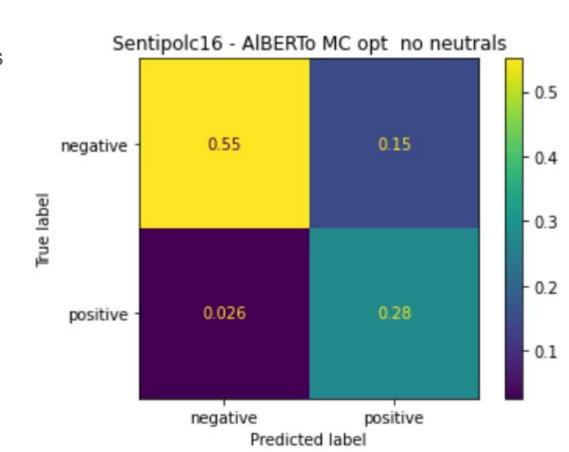
AlBERTo MC opt's confidence distribution for Sentipolc16 - false po



AIBERTo MC opt no neutrals

	precision	recall	f1-score	support
negative	0.96	0.79	0.86	734
positive	0.65	0.91	0.76	316
accuracy			0.83	1050
macro avg	0.80	0.85	0.81	1050
weighted avg	0.86	0.83	0.83	1050

AIBERTo MC opt no neutrals

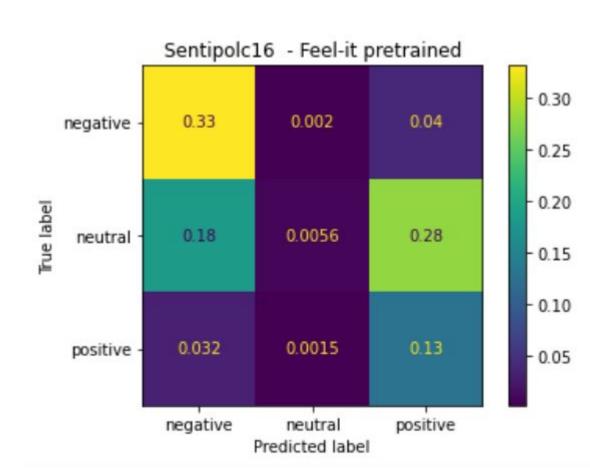


Feel-it

0 18 samples were assigned to the class neutral, of which 11 were correct, out of 914 neutrals

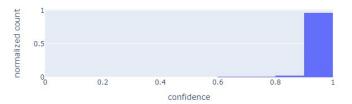
	precision	recall	f1-score	support
negative	0.61	0.89	0.72	734
neutral	0.61	0.01	0.02	914
positive	0.29	0.79	0.42	316
accuracy			0.47	1964
macro avg	0.50	0.56	0.39	1964
weighted avg	0.56	0.47	0.35	1964

Feel-it



Feel-it

Feel-it model pretrained's confidence distribution for Sentipolc16 - false n



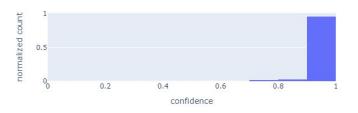
Feel-it model overall confidence distribution



Feel-it model pretrained's confidence distribution for Sentipolc16 - false n



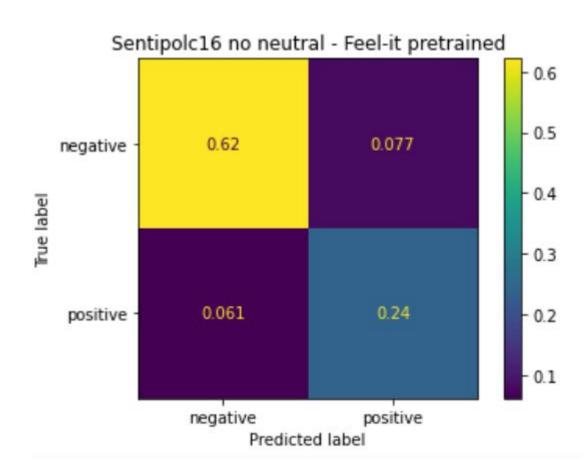
Feel-it model pretrained's confidence distribution for Sentipolc16 - false p



Feel-it no neutrals

	precision	recall	f1-score	support
negative	0.91	0.89	0.90	734
positive	0.76	0.80	0.78	316
accuracy			0.86	1050
macro avg	0.83	0.84	0.84	1050
weighted avg	0.86	0.86	0.86	1050

Feel-it no neutrals



Feel-it no neutrals

Feel-it model pretrained's confidence distribution for Sentipolc16 no neutra



false negatives

Feel-it model pretrained's confidence distribution for Sentipolc16 no neutra

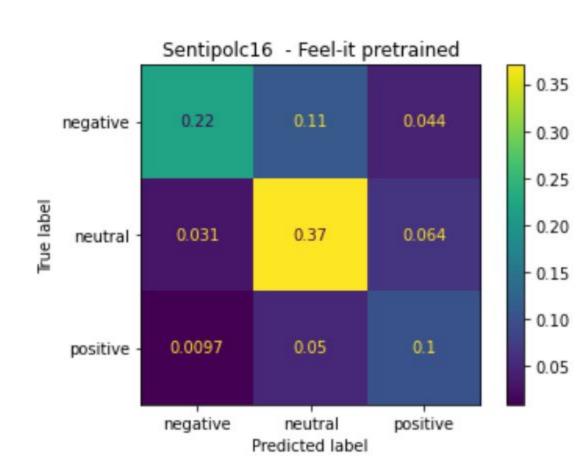


false positives

Feel-it fine tuned on SENTIPOLC16

	precision	recall	f1-score	support
negative	0.82	0.65	0.73	734
neutral	0.71	0.77	0.74	914
positive	0.50	0.62	0.55	316
accuracy			0.70	1964
macro avg	0.68	0.68	0.67	1964
weighted avg	0.72	0.70	0.71	1964

 Feel-it fine tuned on SENTIPOLC16



Feel-it fine tuned on SENTIPOLC16

Feel-it model MC fine tuned's confidence distribution for Sentipolc16 - fals NegativeS



Feel-it model MC fine tuned's confidence distribution for Sentipolc16 - fals neutrals



Feel-it model MC fine tuned's confidence distribution for Sentipolc16 - fals positives



Dataset examples (predictions made by AIBERTo MC)

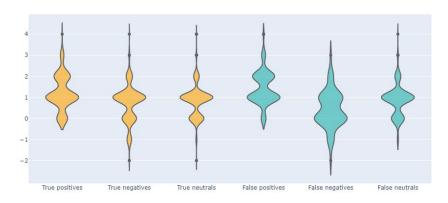
- <user> ci hai illuse \(\otimes\) \(\cdot\) vabb\(\otimes\) oltre ad essere un cantante perfetto sei anche un tatuatore (pred=negative, label=positive)
- ho tutto ciò di cui ho bisogno ora non potrei chiedere di più (pred=negative, label=positive)
- o renzi e i <number> punti per la buona scuola ma servirebbe un ripasso di grammatica <url> <url> (pred=positive, label=negative)
- o contribuire a progettare la buona scuola comunque la si pensi sul governo renzi questa è la piattaforma <url> (pred=neutral, label=neutral)
- o la buona scuola di renzi pillole di riforma <url> (pred=neutral, label=neutral)
- la buona scuola un anno per cambiare la scuola italiana <url> (pred=neutral, label=neutral)
- a scuola torna il gessetto ma è digitale ecco la penna interattiva made in italy <url> anche questa è <hashtag> la buona scuola
 </hashtag> (pred=neutral, label=neutral)
- per chi ancora non lo sapesse è in onda online il <hashtag> renzi show </hashtag> il più grande spettacolo mai visto <hashtag> passo do pop as so </hashtag> <hashtag> scuola </hashtag> la buona scuola </hashtag> (pred=positive, label=negative)
- <hashtag> la buona scuola </hashtag> tutto pienamente condivisibile peccato che rimarranno solo buone intenzioni <url> <url> (pred=positive, label=negative)
- <user> come volevasi dimostrare <hashtag> la buona scuola </hashtag> è una scuola ingiusta! (pred=negative, label=negative)

Dataset examples (predictions made by AIBERTo MC)

- <user> ci hai illuse \(\otimes\) \(\cdot\) vabb\(\otimes\) oltre ad essere un cantante perfetto sei anche un tatuatore (pred=negative, label=positive)
- ho tutto ciò di cui ho bisogno ora non potrei chiedere di più (pred=negative, label=positive)
- o renzi e i <number> punti per la buona scuola ma servirebbe un ripasso di grammatica <url> <url> (pred=positive, label=negative)
- o contribuire a progettare la buona scuola comunque la si pensi sul governo renzi questa è la piattaforma <url> (pred=neutral, label=neutral)
- o la buona scuola di renzi pillole di riforma <url> (pred=neutral, label=neutral)
- la buona scuola un anno per cambiare la scuola italiana <url> (pred=neutral, label=neutral)
- a scuola torna il gessetto ma è digitale ecco la penna interattiva made in italy <url> anche questa è <hashtag> la buona scuola
 </hashtag> (pred=neutral, label=neutral)
- per chi ancora non lo sapesse è in onda online il <hashtag> renzi show </hashtag> il più grande spettacolo mai visto <hashtag> passo do pop as so </hashtag> <hashtag> scuola </hashtag> la buona scuola </hashtag> (pred=positive, label=negative)
- <hashtag> la buona scuola </hashtag> tutto pienamente condivisibile peccato che rimarranno solo buone intenzioni <url> <url> (pred=positive, label=negative)
- <user> come volevasi dimostrare <hashtag> la buona scuola </hashtag> è una scuola ingiusta! (pred=negative, label=negative)

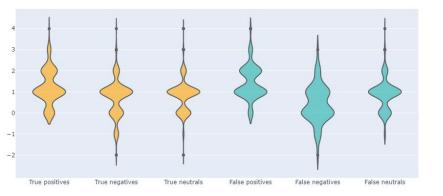
- Further error analysis:
- I computed the number of word that carry sentiment polarity for each sample
 - sentiment score = sum of sentiment polarity for each word (positive=+1, negative=-1)
 - o a word carries sentiment polarity if EvSent predicts either positive/negative for that single word
- Analyze the distribution of such sentiment scores (SENTIPOLC16 only)



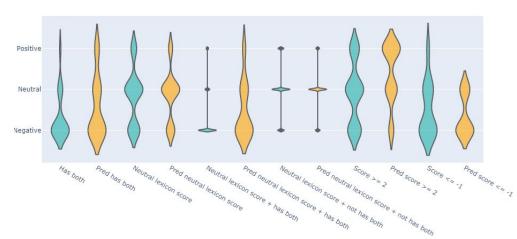


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 - o a word carries sentiment polarity is EvSent predicts either positive/negative
- Analyze the distribution of such sentiment scores (SENTIPOLC16 only)

Distribution of sentiment lexicon's scores and model's predictions



Distribution of sentiment lexicon's scores and model's predictions



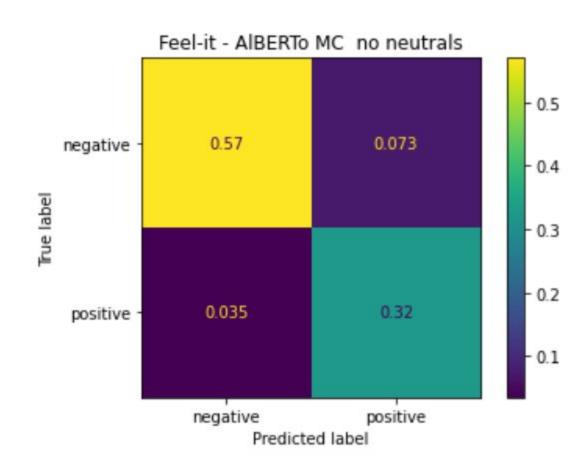
- Subjectivity classification task
 - o the goal was to reproduce the results presented in the AIBERTo paper

Model	Objective F1	Subjective F1	Macro F1
AIBERTo	0.74	0.84	0.79
Our AIBERTo	0.73	0.82	0.78

AIBERTo MC no neutrals

	precision	recall	f1-score	support
negative	0.94	0.89	0.91	1309
positive	0.82	0.90	0.86	728
accuracy			0.89	2037
macro avg	0.88	0.89	0.89	2037
weighted avg	0.90	0.89	0.89	2037

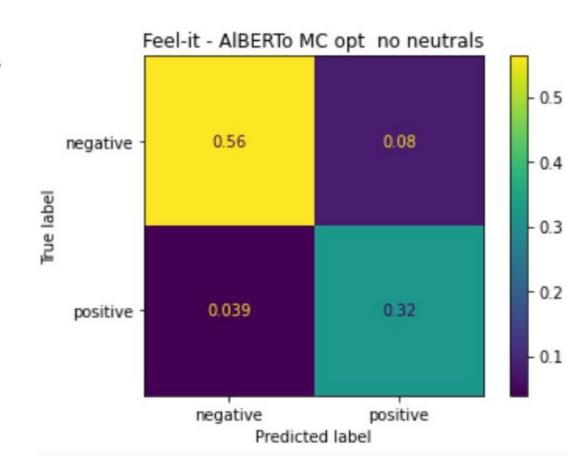
AIBERTo MC no neutrals



• AIBERTo MC opt no neutrals

	precision	recall	f1-score	support
negative	0.93	0.88	0.90	1309
positive	0.80	0.89	0.84	728
accuracy			0.88	2037
macro avg	0.87	0.88	0.87	2037
weighted avg	0.89	0.88	0.88	2037

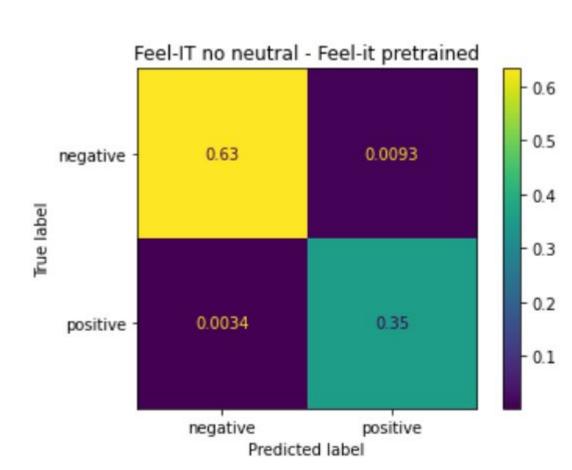
AIBERTo MC opt no neutrals



• Feel-IT model

	precision	recall	f1-score	support
negative	0.99	0.99	0.99	1309
positive	0.97	0.99	0.98	728
accuracy			0.99	2037
macro avg	0.98	0.99	0.99	2037
weighted avg	0.99	0.99	0.99	2037

Feel-IT



Dataset examples (predictions made by AIBERTo MC)

- o daniela è negativa raga tutto apposto (pred=negative, label=positive)
- si cazzo (pred=negative, label=positive)
- o avete imprigionato il mio cuore <hashtag> elisa di rivombrosa </hashtag> (pred=negative, label=positive)
- o per chi volesse approfittare fino a esaurimento scorte (pred=negative, label=positive)
- condoglianze vivissime a <user> per la perdita del suo amato padre cieli blu campione nella vita e nel campo <hashtag> totti
 </hashtag> (pred=positive, label=negative)
- tanto lo so che non uscirà nemmeno mezza foto e io piangerò per anni e anni <hashtag> one direction </hashtag>
 (pred=positive, label=negative)
- o non potrei essere più felice <user> mi sei mancato da morire bentornato a casa (pred=positive, label=positive)

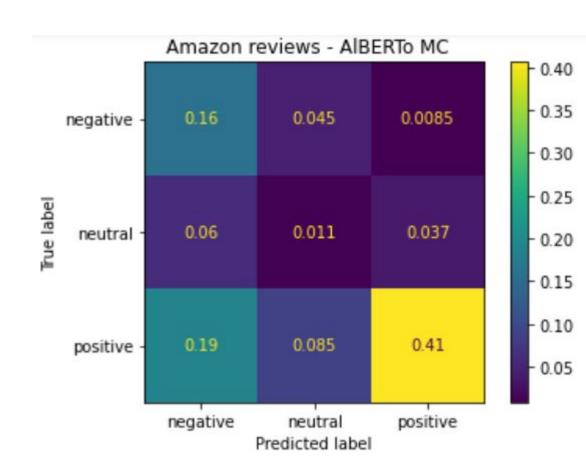
Amazon reviews

AIBERTo MC

	precision	recall	f1-score	support
negative	0.39	0.75	0.51	75
neutral	0.08	0.11	0.09	38
positive	0.90	0.60	0.72	239
accuracy			0.58	352
macro avg	0.46	0.48	0.44	352
weighted avg	0.70	0.58	0.61	352

Amazon reviews

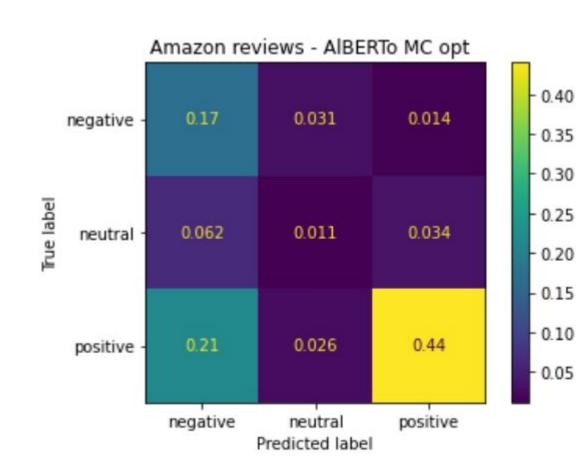
AIBERTo MC



AIBERTo MC opt

	precision	recall	f1-score	support
negative	0.38	0.79	0.51	75
neutral	0.17	0.11	0.13	38
positive	0.90	0.65	0.75	239
accuracy			0.62	352
macro avg	0.48	0.51	0.46	352
weighted avg	0.71	0.62	0.63	352

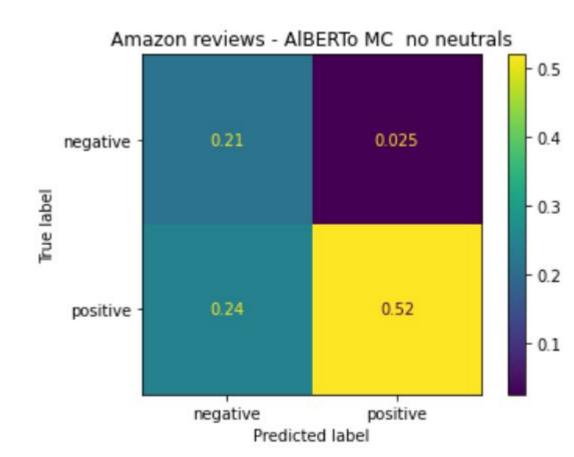
AIBERTo MC opt



AIBERTo MC no neutrals

	precision	recall	f1-score	support
negative	0.47	0.89	0.61	75
positive	0.95	0.68	0.80	239
accuracy			0.73	314
macro avg	0.71	0.79	0.70	314
weighted avg	0.84	0.73	0.75	314

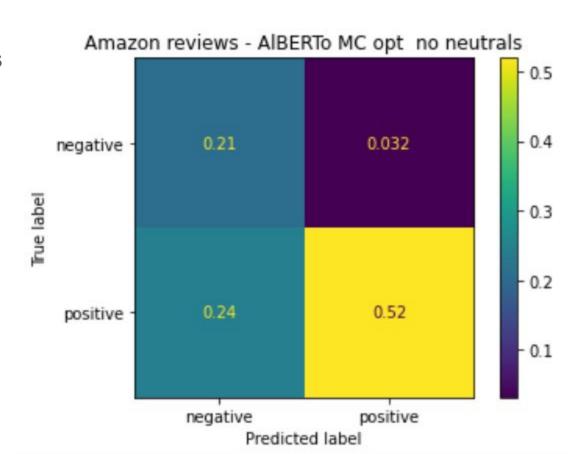
AIBERTo MC no neutrals



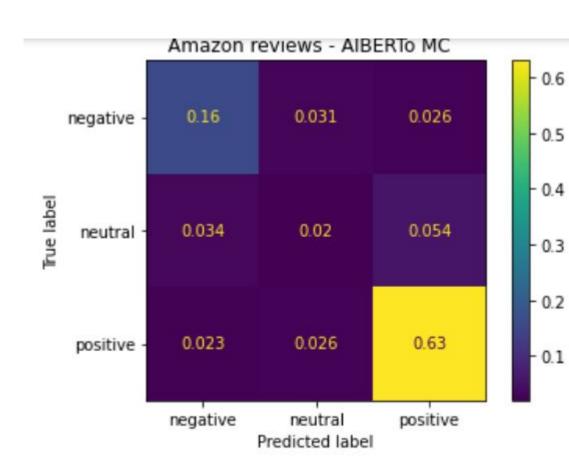
• AIBERTo MC opt no neutrals

	precision	recall	f1-score	support
negative	0.46	0.87	0.60	75
positive	0.94	0.68	0.79	239
accuracy			0.73	314
macro avg	0.70	0.77	0.70	314
weighted avg	0.83	0.73	0.75	314

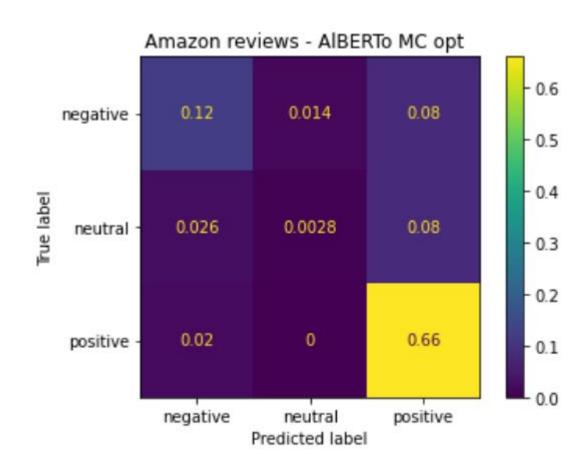
AIBERTo MC opt no neutrals



	precision	recall	f1-score	support
negative	0.73	0.73	0.73	75
neutral	0.26	0.18	0.22	38
positive	0.89	0.93	0.91	239
accuracy			0.81	352
macro avg	0.63	0.62	0.62	352
weighted avg	0.79	0.81	0.80	352



	precision	recall	f1-score	support
negative	0.72	0.56	0.63	75
neutral	0.17	0.03	0.05	38
positive	0.81	0.97	0.88	239
accuracy			0.78	352
macro avg	0.57	0.52	0.52	352
weighted avg	0.72	0.78	0.74	352

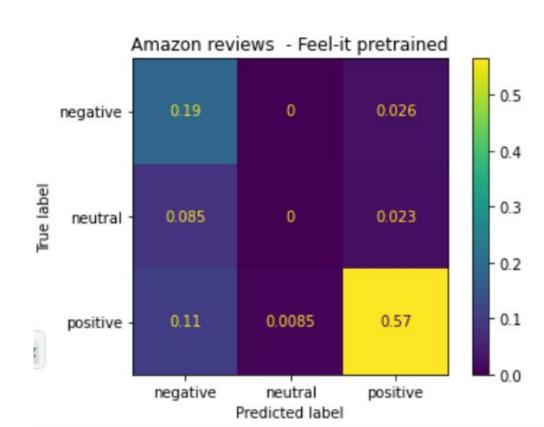


Feel-IT

O 3 samples were assigned to the class neutral, of which 0 were correct, out of 38 neutrals

	precision	recall	f1-score	support
negative	0.50	0.88	0.63	75
neutral	0.00	0.00	0.00	38
positive	0.92	0.83	0.87	239
accuracy			0.75	352
macro avg	0.47	0.57	0.50	352
weighted avg	0.73	0.75	0.73	352

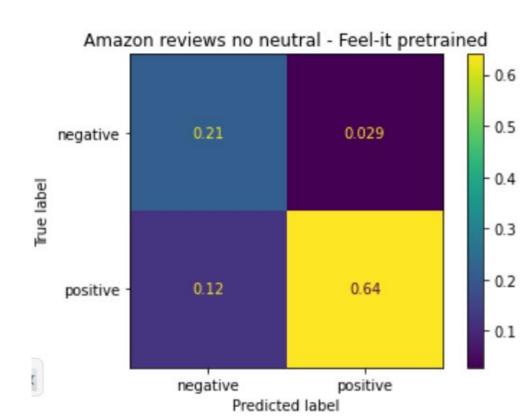
Feel-IT



• Feel-IT no neutrals

	precision	recall	f1-score	support
negative	0.63	0.88	0.74	75
positive	0.96	0.84	0.90	239
accuracy			0.85	314
macro avg	0.80	0.86	0.82	314
weighted avg	0.88	0.85	0.86	314

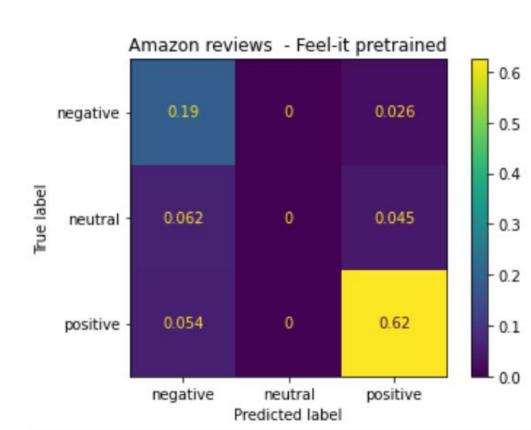
Feel-IT no neutrals



• Feel-IT fine-tuned

	precision	recall	f1-score	support
negative	0.62	0.88	0.73	75
neutral	0.00	0.00	0.00	38
positive	0.90	0.92	0.91	239
accuracy			0.81	352
macro avg	0.50	0.60	0.54	352
weighted avg	0.74	0.81	0.77	352

Feel-IT fine-tuned



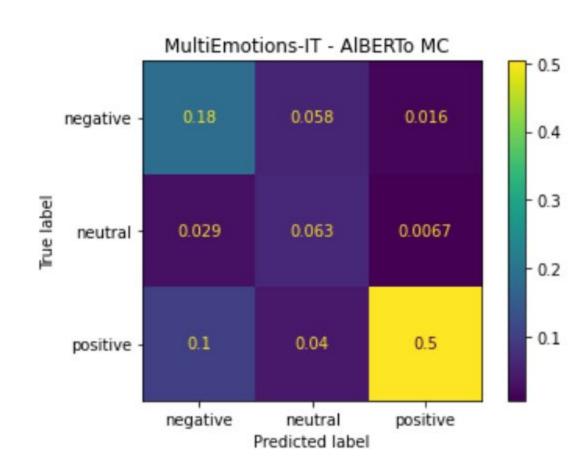
Dataset examples (predictions made by AIBERTo MC)

- mhn ho dovuto restituire il prodotto era un regalo ma non rispecchiava i desideri della persona a cui avrei dovuto regalarlo sarebbe un buon prodotto ma purtroppo il filo è di troppo ingombro (pred=neutral, label=neutral)
- quando si attiva é velocissimo ricarica rapidamente ma talvolta fa contatto e la carica non si attiva (pred=neutral, label=neutral)
- o frullatore difficile da montare in più il boccale perde acqua (pred=negative, label=neutral)
- tablet android <number> il tablet non mi ha soddisfatto la qualità dello schermo è bassa c erano segni di usura sulla schermo probabilmente il tablet era già stato utilizzato dato che all avvio ho trovato app aperte e non la classica configurazione abbastaza veloce nella navigazione d altronde per il costo non potevo aspettarmi di piu non I ho resistito solo perché per I utilizzo che ne faccio io cioè vedere qualche film e per i social mi va bene bene gli accessori prodotto discreto (pred=negative, label=neutral)
- professionale??? premetto che non sono un esperto e che lo uso per il fai da te ho scelto la fascia professionale perché mi avevano detto che la base era come comprare una cinesata detto questo ho notato che il mandrino non serra bene e comunque non è così facile e immediato da sbloccare oltretutto mi sembra leggermente decentrato <number> mm ma per quello che mi serve direi che è sufficiente peccato perché da questa gamma mi aspettavo di più (pred=negative, label=neutral)
- buona! ottimo colore! proprio come tutti i crazy color sono molto più duraturi degli altri che ho provato forse unica pecca è la tonalità molto chiara infatti consiglio di fare al seguito di una decolorazione per il resto non rovina i capelli quindi consiglio (pred=positive, label=neutral)

AIBERTO MC

		precision	recall	f1-score	support
negati	ve	0.59	0.71	0.64	115
neutr	al	0.39	0.64	0.48	44
positi	ve	0.96	0.78	0.86	288
accura	су			0.75	447
macro a	vg	0.64	0.71	0.66	447
weighted a	vg	0.81	0.75	0.77	447

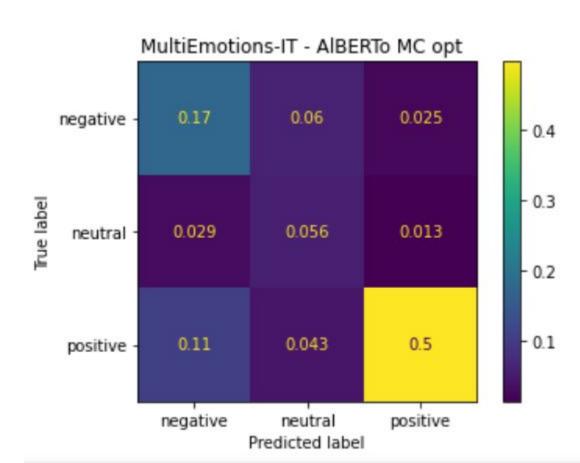
AIBERTo MC



AIBERTo MC opt

	precision	recall	f1-score	support
negative	0.56	0.67	0.61	115
neutral	0.35	0.57	0.43	44
positive	0.93	0.77	0.84	288
accuracy			0.72	447
macro avg	0.61	0.67	0.63	447
weighted avg	0.78	0.72	0.74	447

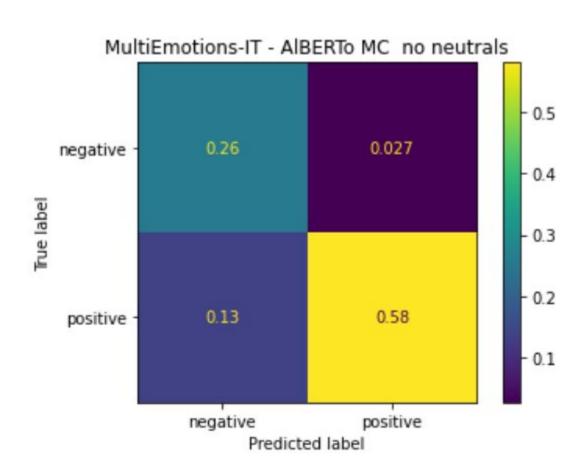
AIBERTo MC opt



AIBERTo MC no neutrals

	precision	recall	f1-score	support
negative	0.66	0.90	0.76	115
positive	0.96	0.81	0.88	288
accuracy			0.84	403
macro avg	0.81	0.86	0.82	403
weighted avg	0.87	0.84	0.84	403

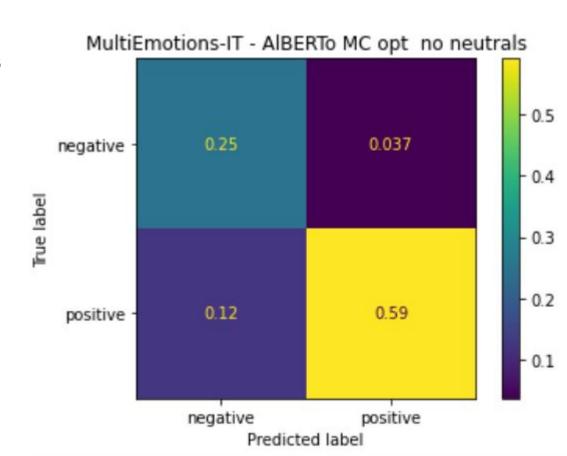
AIBERTo MC no neutrals



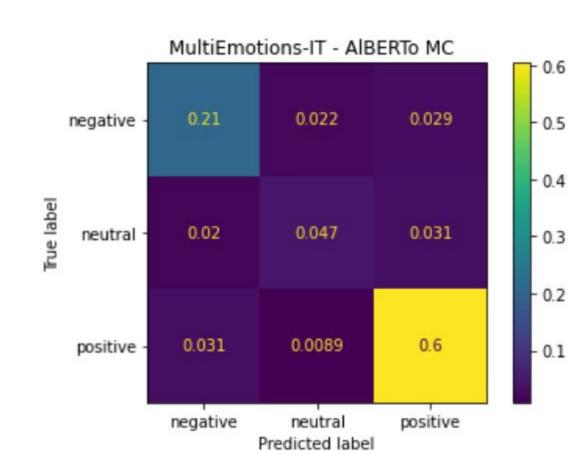
• AIBERTo MC opt no neutrals

	precision	recall	f1-score	support
negative	0.67	0.87	0.75	115
positive	0.94	0.83	0.88	288
accuracy			0.84	403
macro avg	0.80	0.85	0.82	403
weighted avg	0.86	0.84	0.84	403

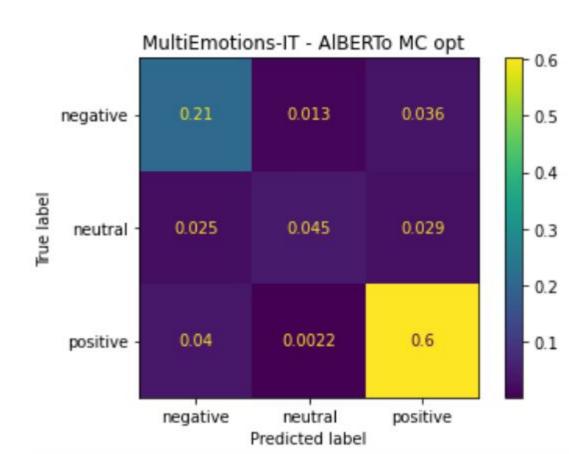
AIBERTo MC opt no neutrals



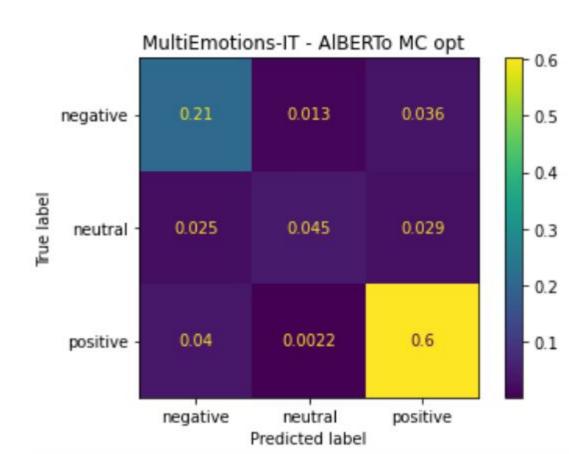
	precision	recall	f1-score	support
negative	0.80	0.80	0.80	115
neutral	0.60	0.48	0.53	44
positive	0.91	0.94	0.92	288
accuracy			0.86	447
macro avg	0.77	0.74	0.75	447
weighted avg	0.85	0.86	0.85	447



	precision	recall	f1-score	support
negative	0.76	0.81	0.78	115
neutral	0.74	0.45	0.56	44
positive	0.90	0.93	0.92	288
accuracy			0.85	447
macro avg	0.80	0.73	0.76	447
weighted avg	0.85	0.85	0.85	447



	precision	recall	f1-score	support
negative	0.76	0.81	0.78	115
neutral	0.74	0.45	0.56	44
positive	0.90	0.93	0.92	288
accuracy			0.85	447
macro avg	0.80	0.73	0.76	447
weighted avg	0.85	0.85	0.85	447

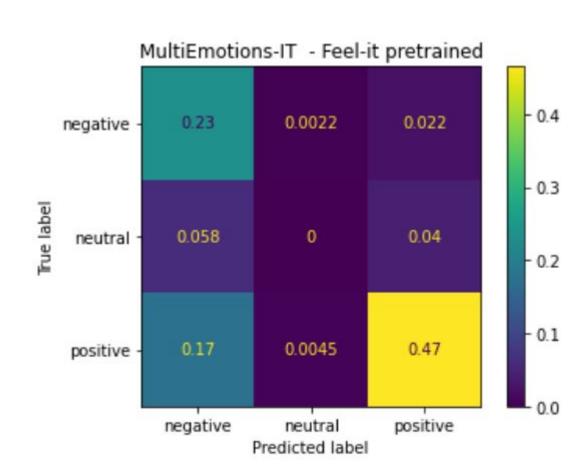


Feel-IT

O 3 samples were assigned to the class neutral, of which 0 were correct, out of 44 neutrals

	precision	recall	f1-score	support
negative	0.50	0.90	0.64	115
neutral	0.00	0.00	0.00	44
positive	0.88	0.72	0.79	288
accuracy			0.70	447
macro avg	0.46	0.54	0.48	447
weighted avg	0.70	0.70	0.68	447

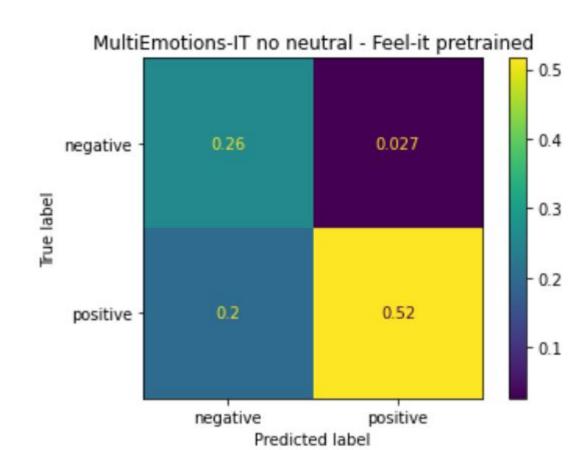
Feel-IT



Feel-IT no neutrals

	precision	recall	f1-score	support
negative	0.57	0.90	0.70	115
positive	0.95	0.72	0.82	288
accuracy			0.77	403
macro avg	0.76	0.81	0.76	403
weighted avg	0.84	0.77	0.78	403

Feel-IT no neutrals

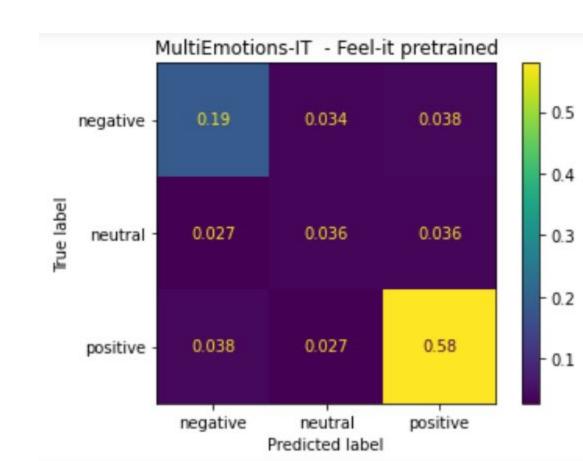


Feel-IT fine-tuned

	precision	recall	f1-score	support
negative	0.74	0.72	0.73	115
neutral	0.37	0.36	0.37	44
positive	0.89	0.90	0.89	288
accuracy			0.80	447
macro avg	0.67	0.66	0.66	447
weighted avg	0.80	0.80	0.80	447

MultiEmotions-IT

Feel-IT fine-tuned



MultiEmotions-IT

Dataset examples (predictions made by AIBERTo MC)

- é dedicata a tutti i ragazzi che hanno bisogno di credere nella vita (pred=positive, label=neutral)
- o dividerei con la mia famiglia che proprio quella del mulino bianco non è ma c è l amore! (pred=positive, label=neutral)
- onn hanno capito un cazzo dovevi arrivi primo sei mio amore (pred=negative, label=positive)
- o sono riuscita a piangere (pred=negative, label=positive)
- i vostri pubblicitari sono geni del marketing (pred=negative, label=positive)
- sarei grato alla barilla e alle marche di pasta italiane di comprare grano italiano per aiutare veramente il paese grazie (pred=positive, label=negative)
- e simpatica come una cartella di equitalia (pred=positive, label=negative)

AIBERTO MC

	precision	recall	f1-score	support
negative	0.53	0.78	0.63	120
neutral	0.85	0.60	0.70	265
positive	0.50	0.74	0.60	54
accuracy			0.66	439
macro avg	0.63	0.70	0.64	439
weighted avg	0.72	0.66	0.67	439

AIBERTo MC opt

	precision	recall	f1-score	support
negative	0.47	0.75	0.58	120
neutral	0.81	0.48	0.60	265
positive	0.41	0.70	0.52	54
accuracy			0.58	439
macro avg	0.57	0.64	0.57	439
weighted avg	0.67	0.58	0.59	439

AIBERTo MC no neutrals

	precision	recall	f1-score	support
negative	0.93	0.93	0.93	120
positive	0.83	0.83	0.83	54
accuracy			0.90	174
macro avg	0.88	0.88	0.88	174
weighted avg	0.90	0.90	0.90	174

• AIBERTo MC opt no neutrals

	precision	recall	f1-score	support
negative	0.89	0.92	0.90	120
positive	0.80	0.74	0.77	54
accuracy			0.86	174
macro avg	0.84	0.83	0.84	174
weighted avg	0.86	0.86	0.86	174

AIBERTo MC fine-tuned

	precision	recall	f1-score	support
negative	0.76	0.72	0.74	120
neutral	0.84	0.86	0.85	265
positive	0.73	0.74	0.73	54
accuracy			0.81	439
macro avg	0.78	0.77	0.78	439
weighted avg	0.81	0.81	0.81	439

AIBERTo MC opt fine-tuned

	precision	recall	f1-score	support
negative	0.70	0.67	0.68	120
neutral	0.80	0.84	0.82	265
positive	0.73	0.67	0.70	54
accuracy			0.77	439
macro avg	0.75	0.72	0.73	439
weighted avg	0.77	0.77	0.77	439

Feel-it

O 3 samples were assigned to the class neutral, of which 3 were correct, out of 265 neutrals

	precision	recall	f1-score	support
negative	0.39	0.93	0.55	120
neutral	1.00	0.01	0.02	265
positive	0.24	0.67	0.35	54
accuracy			0.34	439
macro avg	0.54	0.53	0.31	439
weighted avg	0.74	0.34	0.21	439

Feel-it no neutrals

	precision	recall	f1-score	support
negative	0.86	0.93	0.89	120
positive	0.80	0.67	0.73	54
accuracy			0.84	174
macro avg	0.83	0.80	0.81	174
weighted avg	0.84	0.84	0.84	174

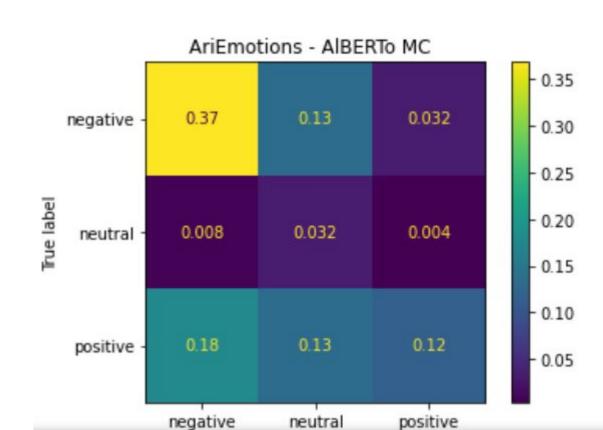
• Feel-it fine-tuned

	precision	recall	f1-score	support
negative	0.75	0.74	0.75	120
neutral	0.85	0.85	0.85	265
positive	0.72	0.76	0.74	54
accuracy			0.81	439
macro avg	0.78	0.78	0.78	439
weighted avg	0.81	0.81	0.81	439

AIBERTo MC

	precision	recall	f1-score	support
negative	0.67	0.69	0.68	133
neutral	0.11	0.73	0.19	11
positive	0.76	0.27	0.40	106
accuracy			0.52	250
macro avg	0.51	0.56	0.42	250
weighted avg	0.68	0.52	0.54	250

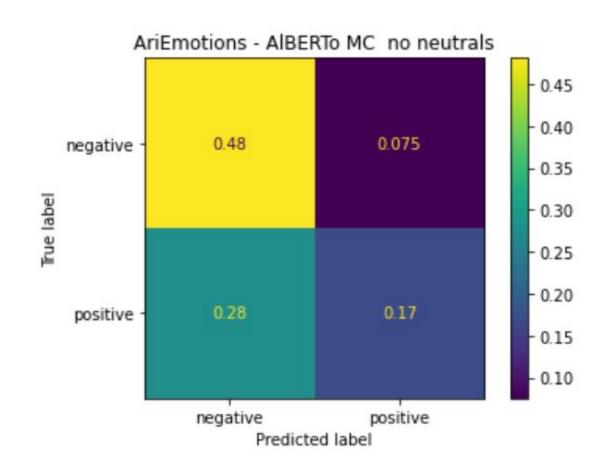
AIBERTo MC



AIBERTo MC no neutrals

	precision	recall	f1-score	support
negative	0.64	0.86	0.73	133
positive	0.69	0.38	0.49	106
accuracy			0.65	239
macro avg	0.66	0.62	0.61	239
weighted avg	0.66	0.65	0.62	239

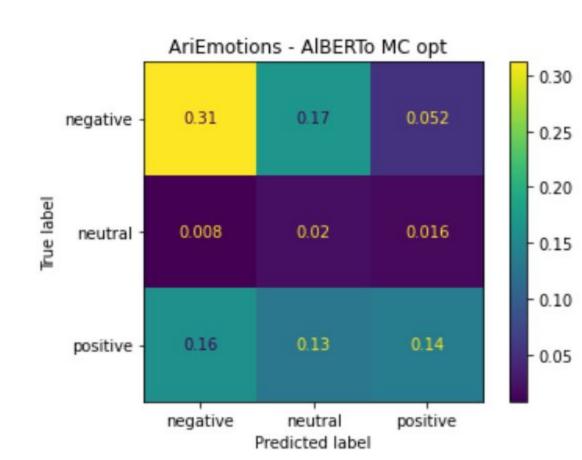
AIBERTo MC no neutrals



AIBERTo MC opt

	precision	recall	f1-score	support
negative	0.65	0.59	0.62	133
neutral	0.06	0.45	0.11	11
positive	0.67	0.32	0.43	106
accuracy			0.47	250
macro avg	0.46	0.45	0.39	250
weighted avg	0.63	0.47	0.52	250

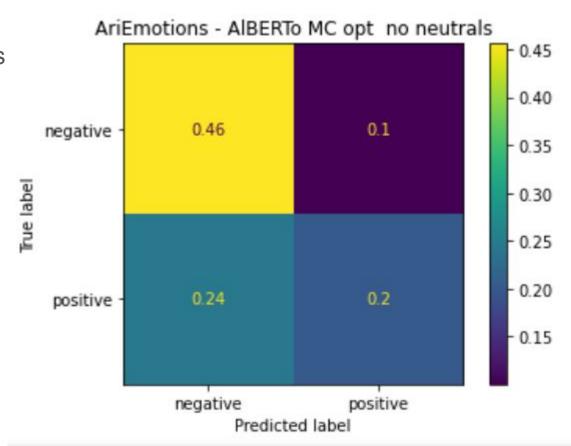
AIBERTo MC opt



AIBERTo MC opt no neutrals

	precision	recall	f1-score	support
negative	0.65	0.82	0.73	133
positive	0.67	0.45	0.54	106
accuracy			0.66	239
macro avg	0.66	0.64	0.63	239
weighted avg	0.66	0.66	0.64	239

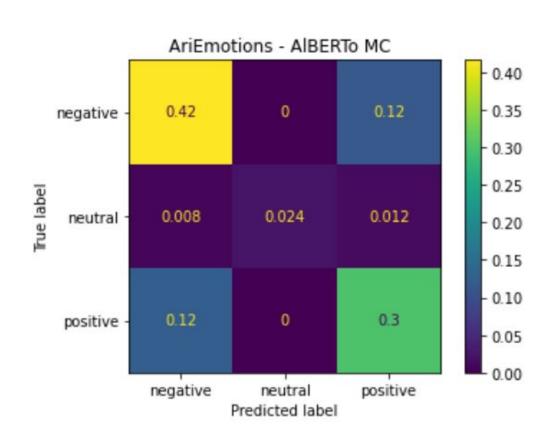
AIBERTo MC opt no neutrals



AIBERTo MC fine-tuned

	precision	recall	f1-score	support
negative	0.76	0.78	0.77	133
neutral	1.00	0.55	0.71	11
positive	0.70	0.71	0.70	106
accuracy			0.74	250
macro avg	0.82	0.68	0.73	250
weighted avg	0.75	0.74	0.74	250

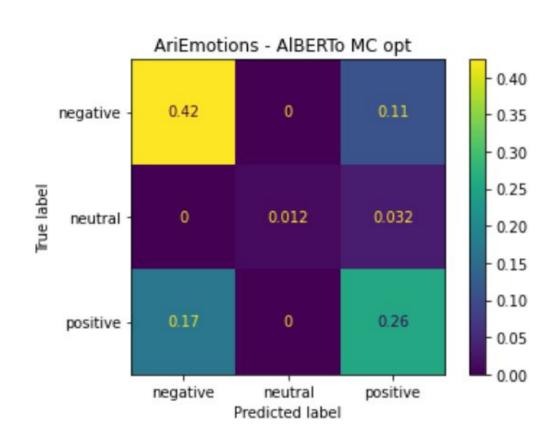
AIBERTo MC fine-tuned



AIBERTo MC opt fine-tuned

	precision	recall	f1-score	support
negative	0.72	0.80	0.75	133
neutral	1.00	0.27	0.43	11
positive	0.65	0.60	0.62	106
accuracy			0.69	250
macro avg	0.79	0.56	0.60	250
weighted avg	0.70	0.69	0.68	250

AIBERTo MC opt fine-tuned

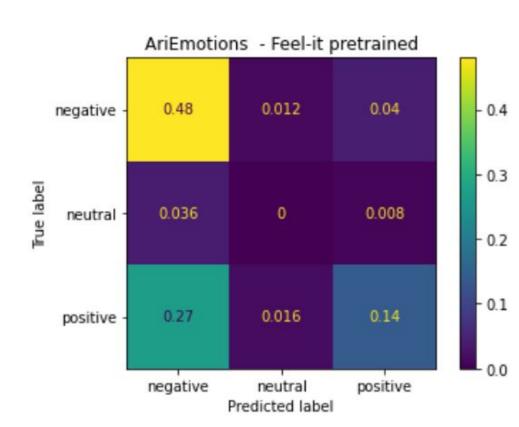


Feel-IT

 7 samples were assigned to the class neutral, of which 0 were correct, out of 11 neutrals

	precision	recall	f1-score	support
negative	0.61	0.90	0.73	133
neutral	0.00	0.00	0.00	11
positive	0.74	0.33	0.46	106
accuracy			0.62	250
macro avg	0.45	0.41	0.40	250
weighted avg	0.64	0.62	0.58	250

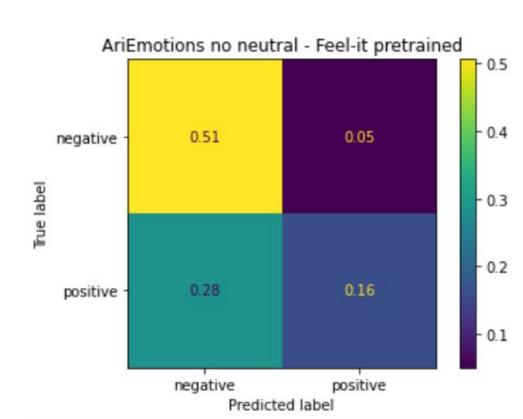
Feel-IT



Feel-IT no neutrals

	precision	recall	f1-score	support
negative	0.64	0.91	0.75	133
positive	0.76	0.36	0.49	106
accuracy			0.67	239
macro avg	0.70	0.63	0.62	239
weighted avg	0.69	0.67	0.63	239

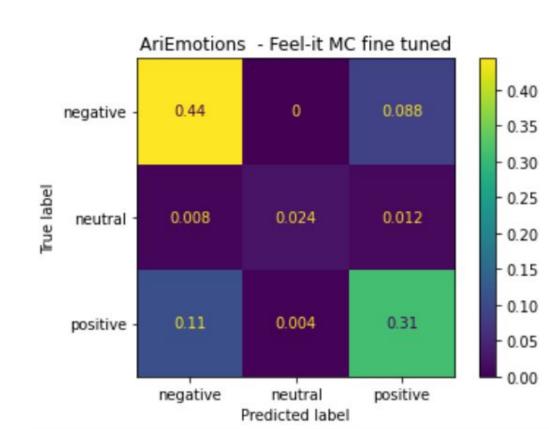
Feel-IT no neutrals



Feel-IT fine-tuned

	precision	recall	f1-score	support
negative	0.79	0.83	0.81	133
neutral	0.86	0.55	0.67	11
positive	0.76	0.74	0.75	106
accuracy			0.78	250
macro avg	0.80	0.71	0.74	250
weighted avg	0.78	0.78	0.78	250

Feel-IT fine-tuned



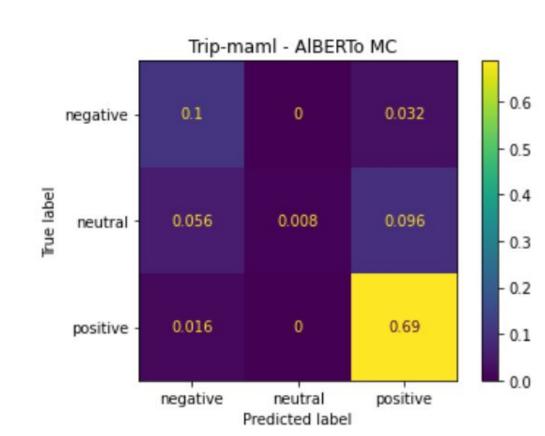
Dataset examples (predictions made by AIBERTo MC)

- o infelice e sventurato potrà farmi ingiusto fato ma infedele io non sarò (pred=negative, label=positive)
- la candida mano (pred=neutral, label=positive)
- ono tanto merito tanto valore I ombra de secoli coprir non può (pred=negative, label=positive)
- o più non si trovano fra mille amanti sol due bell anime che sian costanti e tutti parlano di fedeltà (pred=neutral, label=negative)
- odecisa è la mia sorte tutto cangiò d'aspetto più non mi trovo in petto né speme né timor (pred=neutral, label=negative)
- oconoscerai chi sono ti pentirai del dono ma sarà tardi allor (pred=positive, label=negative)

AIBERTo MC

	precision	recall	f1-score	support
negative	0.59	0.76	0.67	17
neutral	1.00	0.05	0.10	20
positive	0.84	0.98	0.91	88
accuracy			0.80	125
macro avg	0.81	0.60	0.56	125
weighted avg	0.83	0.80	0.74	125

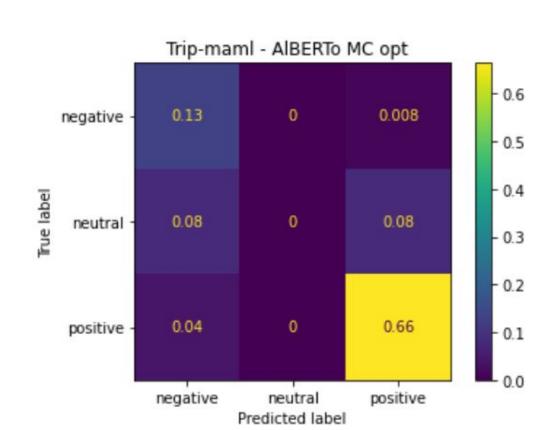
AIBERTo MC



AIBERTo MC opt

	precision	recall	f1-score	support
negative	0.52	0.94	0.67	17
neutral	0.00	0.00	0.00	20
positive	0.88	0.94	0.91	88
accuracy			0.79	125
macro avg	0.47	0.63	0.53	125
weighted avg	0.69	0.79	0.73	125

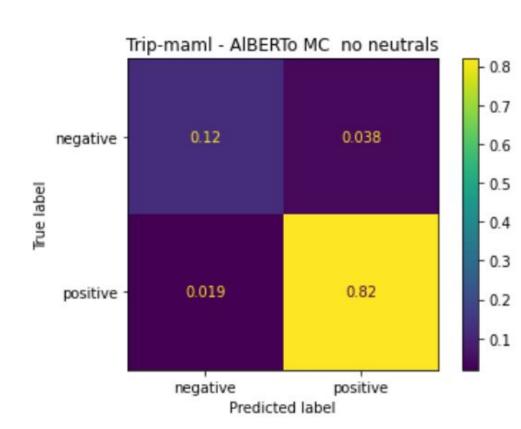
AIBERTo MC opt



AIBERTo MC no neutrals

	precision	recall	f1-score	support
negative	0.87	0.76	0.81	17
positive	0.96	0.98	0.97	88
accuracy			0.94	105
macro avg	0.91	0.87	0.89	105
weighted avg	0.94	0.94	0.94	105

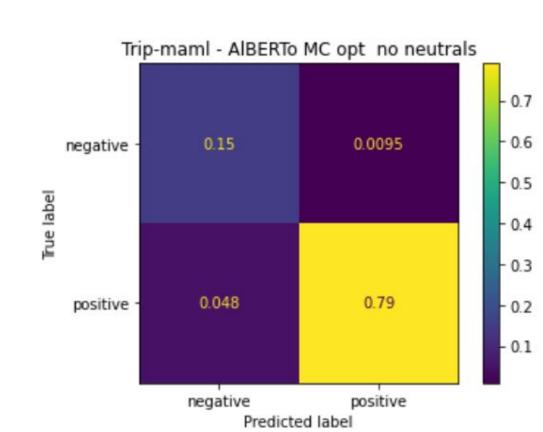
AIBERTo MC no neutrals



AIBERTo MC opt no neutrals

	precision	recall	f1-score	support
negative	0.76	0.94	0.84	17
positive	0.99	0.94	0.97	88
accuracy			0.94	105
macro avg	0.88	0.94	0.90	105
weighted avg	0.95	0.94	0.95	105

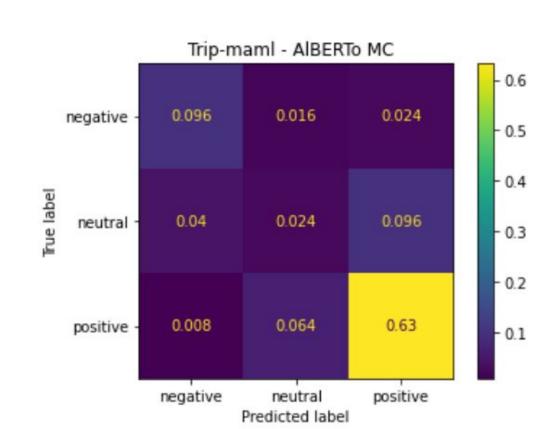
 AIBERTo MC opt no neutrals



AIBERTo MC fine-tuned

	precision	recall	f1-score	support
negative	0.67	0.71	0.69	17
neutral	0.23	0.15	0.18	20
positive	0.84	0.90	0.87	88
accuracy			0.75	125
macro avg	0.58	0.58	0.58	125
weighted avg	0.72	0.75	0.73	125

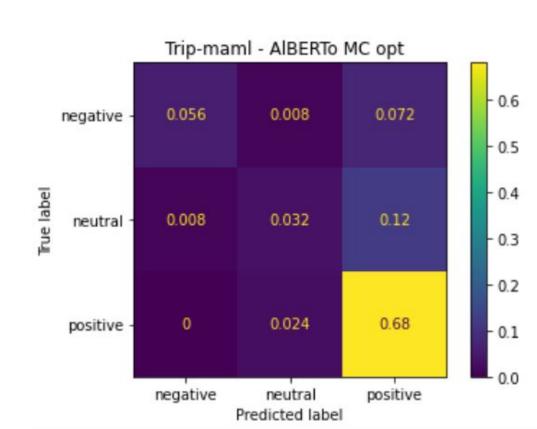
AIBERTo MC fine-tuned



AIBERTo MC opt fine-tuned

	precision	recall	f1-score	support
negative	0.88	0.41	0.56	17
neutral	0.50	0.20	0.29	20
positive	0.78	0.97	0.86	88
accuracy			0.77	125
macro avg	0.72	0.53	0.57	125
weighted avg	0.75	0.77	0.73	125

AIBERTo MC opt fine-tuned

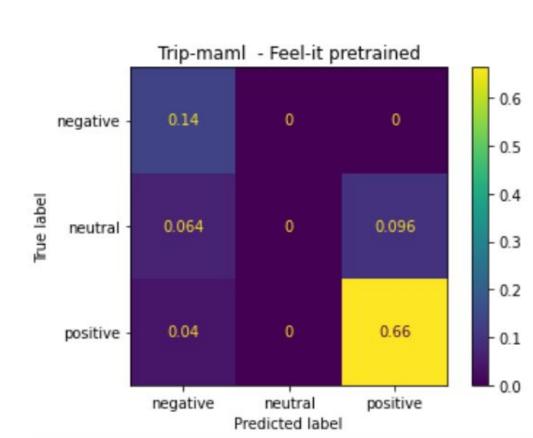


• Feel-IT

 0 samples were assigned to the class neutral, of which 0 were correct, out of 20 neutrals

	precision	recall	f1-score	support
negative	0.57	1.00	0.72	17
neutral	0.00	0.00	0.00	20
positive	0.87	0.94	0.91	88
accuracy			0.80	125
macro avg	0.48	0.65	0.54	125
weighted avg	0.69	0.80	0.74	125

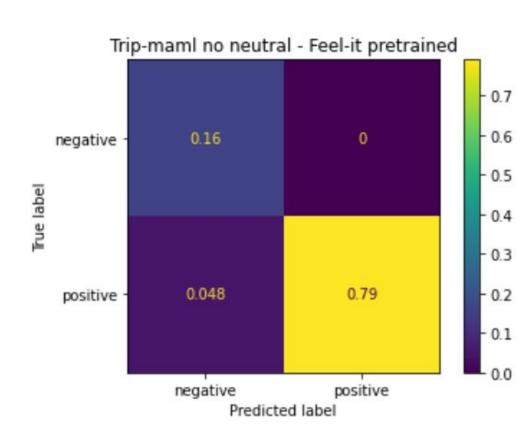
Feel-IT



• Feel-IT no neutrals

	precision	recall	f1-score	support
negative	0.77	1.00	0.87	17
positive	1.00	0.94	0.97	88
accuracy			0.95	105
macro avg	0.89	0.97	0.92	105
weighted avg	0.96	0.95	0.95	105

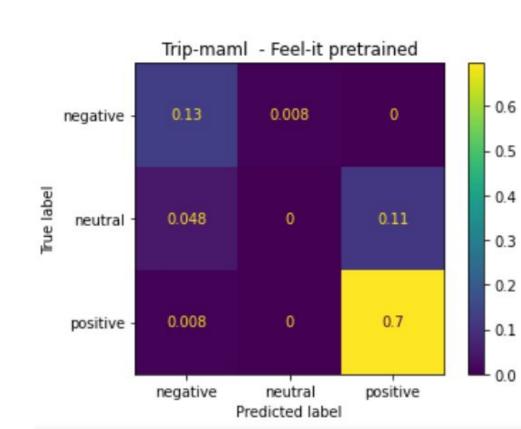
Feel-IT no neutrals



Feel-IT fine-tuned

	precision	recall	f1-score	support
negative	0.70	0.94	0.80	17
neutral	0.00	0.00	0.00	20
positive	0.86	0.99	0.92	88
accuracy			0.82	125
macro avg	0.52	0.64	0.57	125
weighted avg	0.70	0.82	0.76	125

Feel-IT fine-tuned



Dataset examples (predictions made by AIBERTo MC)

- Posto isolato molto démodé moquette lisa ed arredi anni 70 mal tenuti. Personale quasi tutto di colore, improbabile e di scarsissima professionalità.. manca il ristorante e la colazione è di basso livello.. evitate gente!! (pred=negative, label=neutral)
- Prima tappa del nostro viaggio che ci porterà in Toscana. Ci siamo fermati a Milano e su consiglio di un amico abbiamo dormito 2 notti in questo piccolo Hotel. Atmosfera accogliente in stile europeo asiatico buona colazione camere in stile asiatico accoglienti e pulite bagno un po piccolo, parcheggio in strada camera con tv frigobar niente cassaforte pittosto silenzioso circa 20 minuti dal centro con mezzi pubblici zona tranquilla niente ristorante (pred=negative, label=neutral)
- Ci sono stata per lavoro e fortunatamente non ho pagato io , ma viste le tariffe e l ' offerta non lo sceglierei in futuro . La cosa che proprio non mi è piaciuta è stata l assenza di parcheggio , servizio ormai presente anche nei B & amp (pred=negative, label=neutral)
- Hotel carino, non molto pulito ma nella media accettabile, colazione troppo ridotta, con prodotti da supermercato tipo briochers e non fatti in casa come si dovrebbe, ma in particolare la zona è DA_EVITARE: a mio parere pericolosa e malfamata. Provare per credere! (pred=positive, label=negative)
- Sono stato due notti in una camera di questa struttura. Il personale è gentile e disponibile e questo conta sempre. La posizione è comoda per visitare il centro di Firenze. La camera abbastanza pulita con solo qualche pecca in bagno. camera abbastanza ampia e vetri insonorizzati, tende pesanti per proteggere dalla luce. la terrazza è molto bella ma sta al quinto piano senza ascensore, rispetto alle camere che stanno al secondo. Una mattina mi son portato la colazione su ed è stato gradevole (pred=positive, label=neutral)