



Research article

Survival prediction model for right-censored data based on improved composite quantile regression neural network

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Supplementary

Table S1. Parametric results of the integer encoding GS optimization model for the NKI70 dataset.

layer	method	node	dropout	n_epoch	bsize	optimizer	activation
layer = 1	GS-rcICQRNN-5	120	0.5	100	128	nadam	sigmoid
	GS-rcICQRNN-10	150	0.5	100	64	nadam	sigmoid
	GS-rcICQRNN-15	80	0.4	100	64	adam	sigmoid
	GS-rcICQRNN-19	80	0.2	200	64	nadam	sigmoid
	GS-rcICQRNN-30	80	0.3	200	128	adam	sigmoid
	GS-rcICQRNN-50	120	0.3	100	128	adam	sigmoid
	GS-QRNN	300	0.4	50	128	adam	sigmoid
layer = 2	GS-rcICQRNN-5	150	0.4	200	64	adam	sigmoid
	GS-rcICQRNN-10	80	0.2	200	64	nadam	sigmoid
	GS-rcICQRNN-15	120	0.4	200	64	nadam	sigmoid
	GS-rcICQRNN-19	200	0.5	200	64	nadam	sigmoid
	GS-rcICQRNN-30	300	0.5	200	128	adam	sigmoid
	GS-rcICQRNN-50	150	0.4	200	128	nadam	sigmoid
	GS-QRNN	150	0.4	50	64	adam	sigmoid
layer = 3	GS-rcICQRNN-5	80	0.2	200	64	adam	sigmoid
	GS-rcICQRNN-10	150	0.2	100	64	nadam	sigmoid
	GS-rcICQRNN-15	300	0.3	100	64	nadam	sigmoid
	GS-rcICQRNN-19	200	0.2	200	128	adam	sigmoid
	GS-rcICQRNN-30	100	0.3	200	128	adam	sigmoid
	GS-CQRNN-50	300	0.2	100	64	adam	sigmoid
	GS-QRNN	200	0.3	200	128	nadam	sigmoid

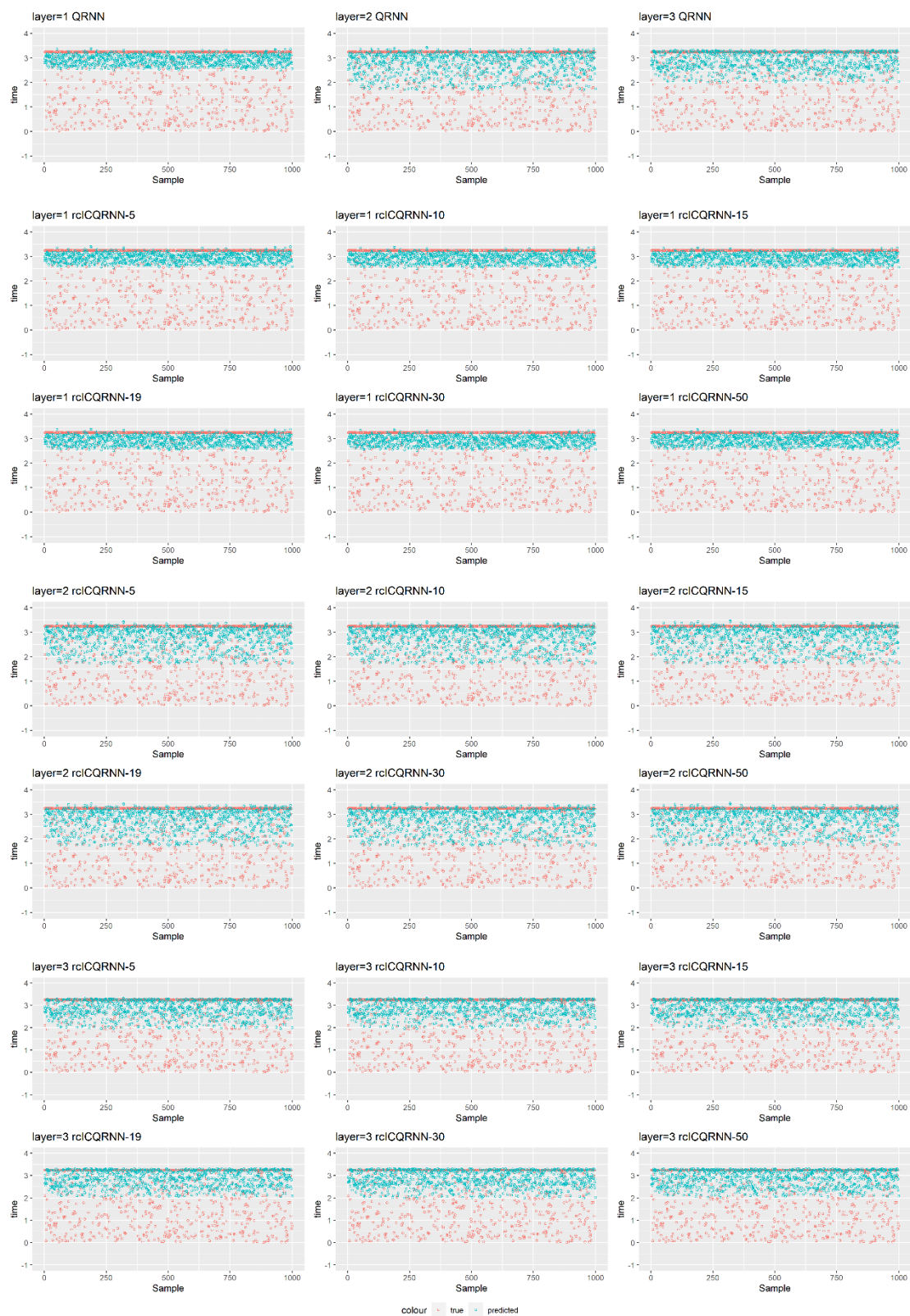


Figure S1. Scatter plots of actual versus predicted survival times.

Table S2. Parameter results of the integer encoding WOA-optimized model for the NKI70 dataset.

layer	method	node	dropout	n epoch	bsize
layer = 1	WOA-rcICQRNN-5	51	0.3	102	102
	WOA-rcICQRNN-10	50	0.4	136	94
	WOA-rcICQRNN-15	92	0.2	64	89
	WOA-rcICQRNN-19	61	0.2	69	72
	WOA-rcICQRNN-30	136	0.3	208	105
	WOA-rcICQRNN-50	102	0.4	315	107
	WOA-QRNN	20	0.2	192	118
layer = 2	WOA-rcICQRNN-5	91	0.4	83	104
	WOA-rcICQRNN-10	134	0.2	88	100
	WOA-rcICQRNN-15	130	0.3	50	93
	WOA-rcICQRNN-19	82	0.3	142	107
	WOA-rcICQRNN-30	40	0.4	142	96
	WOA-rcICQRNN-50	188	0.4	178	100
	WOA-QRNN	65	0.3	159	104
layer = 3	WOA-rcICQRNN-5	66	0.2	129	104
	WOA-rcICQRNN-10	263	0.4	377	106
	WOA-rcICQRNN-15	71	0.2	110	96
	WOA-rcICQRNN-19	44	0.2	109	101
	WOA-rcICQRNN-30	188	0.3	198	107
	WOA-rcICQRNN-50	30	0.4	167	106
	WOA-QRNN	178	0.2	113	104

Table S3. Parametric results of the One-Hot encoding GS optimization model for the NKI70 dataset.

layer	method	node	dropout	n epoch	bsize	optimizer	activation
layer = 1	GS-rcICQRNN-5	300	0.2	50	128	nadam	sigmoid
	GS-rcICQRNN-10	150	0.5	100	128	nadam	sigmoid
	GS-rcICQRNN-15	150	0.3	50	64	nadam	sigmoid
	GS-rcICQRNN-19	150	0.2	50	64	nadam	sigmoid
	GS-rcICQRNN-30	300	0.5	50	64	adam	sigmoid
	GS-rcICQRNN-50	150	0.4	50	64	adam	sigmoid
	GS-QRNN	150	0.5	50	64	nadam	sigmoid
layer = 2	GS-rcICQRNN-5	200	0.2	100	64	nadam	sigmoid
	GS-rcICQRNN-10	300	0.5	200	128	nadam	sigmoid
	GS-rcICQRNN-15	200	0.4	200	64	adam	sigmoid
	GS-rcICQRNN-19	120	0.2	200	128	adam	sigmoid
	GS-rcICQRNN-30	200	0.3	200	128	nadam	sigmoid
	GS-rcICQRNN-50	200	0.3	100	64	nadam	sigmoid
	GS-QRNN	200	0.4	200	128	adam	sigmoid
layer = 3	GS-rcICQRNN-5	100	0.2	200	64	nadam	sigmoid
	GS-rcICQRNN-10	200	0.2	200	128	adam	sigmoid
	GS-rcICQRNN-15	200	0.2	100	64	nadam	sigmoid
	GS-rcICQRNN-19	200	0.2	100	64	nadam	sigmoid
	GS-rcICQRNN-30	200	0.4	200	64	nadam	sigmoid
	GS-CQRNN-50	150	0.2	200	128	adam	sigmoid
	GS-QRNN	120	0.2	200	64	adam	sigmoid

Table S4. Parameter results of the One-Hot encoding WOA-optimized model for the NKI70 dataset.

layer	method	node	dropout	n epoch	bsize
layer = 1	WOA-rcICQRNN-5	55	0.2	65	75
	WOA-rcICQRNN-10	121	0.3	117	98
	WOA-rcICQRNN-15	50	0.3	81	96
	WOA-rcICQRNN-19	35	0.2	154	99
	WOA-rcICQRNN-30	103	0.3	138	109
	WOA-rcICQRNN-50	122	0.3	73	81
	WOA-QRNN	34	0.3	125	73
layer = 2	WOA-rcICQRNN-5	24	0.2	106	64
	WOA-rcICQRNN-10	36	0.2	117	127
	WOA-rcICQRNN-15	69	0.3	119	88
	WOA-rcICQRNN-19	60	0.3	157	97
	WOA-rcICQRNN-30	63	0.4	121	72
	WOA-rcICQRNN-50	142	0.4	69	98
	WOA-QRNN	50	0.3	112	113
layer = 3	WOA-rcICQRNN-5	62	0.2	87	72
	WOA-rcICQRNN-10	63	0.3	284	104
	WOA-rcICQRNN-15	179	0.2	90	91
	WOA-rcICQRNN-19	43	0.3	184	76
	WOA-rcICQRNN-30	157	0.4	193	117
	WOA-rcICQRNN-50	36	0.2	113	71
	WOA-QRNN	158	0.2	176	106

Table S5. Parametric results of the integer encoding GS optimization model for the METABRIC dataset.

layer	method	node	dropout	n epoch	bsize	optimizer	activation
layer = 1	GS-rcICQRNN-5	200	0.5	50	128	adam	sigmoid
	GS-rcICQRNN-10	200	0.5	50	128	adam	sigmoid
	GS-rcICQRNN-15	200	0.5	100	64	adam	sigmoid
	GS-rcICQRNN-19	200	0.5	100	64	adam	sigmoid
	GS-rcICQRNN-30	200	0.5	50	64	adam	sigmoid
	GS-rcICQRNN-50	150	0.5	100	64	adam	sigmoid
	GS-QRNN	200	0.5	100	64	adam	sigmoid
layer = 2	GS-rcICQRNN-5	150	0.5	50	64	nadam	sigmoid
	GS-rcICQRNN-10	200	0.4	50	128	adam	sigmoid
	GS-rcICQRNN-15	200	0.5	50	64	adam	sigmoid
	GS-rcICQRNN-19	200	0.5	100	128	adam	sigmoid
	GS-rcICQRNN-30	200	0.5	50	128	nadam	sigmoid
	GS-rcICQRNN-50	200	0.5	50	64	adam	sigmoid
	GS-QRNN	120	0.5	100	128	nadam	sigmoid
layer = 3	GS-rcICQRNN-5	120	0.2	200	64	adam	sigmoid
	GS-rcICQRNN-10	200	0.2	200	128	adam	sigmoid
	GS-rcICQRNN-15	120	0.2	200	64	nadam	sigmoid
	GS-rcICQRNN-19	200	0.3	100	64	adam	sigmoid
	GS-rcICQRNN-30	120	0.2	200	64	nadam	sigmoid
	GS-CQRNN-50	150	0.5	100	128	nadam	sigmoid
	GS-QRNN	150	0.2	100	64	nadam	sigmoid

Table S6. Parameter results of the integer encoding WOA-optimized model for the METABRIC dataset.

layer	method	node	dropout	n_epoch	bsize
layer=1	WOA-rcICQRNN-5	245	0.4	164	102
	WOA-rcICQRNN-10	183	0.4	71	72
	WOA-rcICQRNN-15	212	0.4	120	111
	WOA-rcICQRNN-19	202	0.3	62	68
	WOA-rcICQRNN-30	204	0.4	73	115
	WOA-rcICQRNN-50	51	0.4	128	79
	WOA-QRNN	63	0.3	69	108
layer=2	WOA-rcICQRNN-5	68	0.4	87	81
	WOA-rcICQRNN-10	107	0.3	135	102
	WOA-rcICQRNN-15	139	0.4	80	102
	WOA-rcICQRNN-19	107	0.4	99	102
	WOA-rcICQRNN-30	180	0.4	62	101
	WOA-rcICQRNN-50	100	0.4	203	116
	WOA-QRNN	84	0.4	65	102
layer=3	WOA-rcICQRNN-5	47	0.4	82	72
	WOA-rcICQRNN-10	136	0.4	59	74
	WOA-rcICQRNN-15	253	0.4	100	102
	WOA-rcICQRNN-19	109	0.4	148	102
	WOA-rcICQRNN-30	62	0.4	100	116
	WOA-rcICQRNN-50	233	0.4	59	81
	WOA-QRNN	20	0.4	464	102

Table S7. Optimized parameter results of GS algorithm and WOA algorithm for One-Hot encoding of METABRIC dataset.

layer	method	node	dropout	n epoch	bsize	optimizer	activation
layer = 1	GS-rcICQRNN-5	150	0.5	50	64	nadam	sigmoid
	GS-rcICQRNN-10	150	0.5	50	64	nadam	sigmoid
	GS-rcICQRNN-15	150	0.5	100	128	adam	sigmoid
	GS-rcICQRNN-19	200	0.5	50	64	adam	sigmoid
	GS-rcICQRNN-30	150	0.5	50	64	nadam	sigmoid
	GS-rcICQRNN-50	150	0.5	100	128	adam	sigmoid
	GS-QRNN	200	0.5	50	64	adam	sigmoid
	WOA-rcICQRNN-5	270	0.3	92	114	-	-
	WOA-rcICQRNN-10	280	0.4	292	102	-	-
	WOA-rcICQRNN-15	168	0.4	270	108	-	-
	WOA-rcICQRNN-19	232	0.3	122	111	-	-
	WOA-rcICQRNN-30	217	0.4	93	78	-	-
	WOA-rcICQRNN-50	279	0.4	117	74	-	-
	WOA-QRNN	184	0.4	160	99	-	-
layer = 2	GS-rcICQRNN-5	200	0.5	50	64	adam	sigmoid
	GS-rcICQRNN-10	200	0.4	100	128	adam	sigmoid
	GS-rcICQRNN-15	100	0.3	100	64	adam	sigmoid
	GS-rcICQRNN-19	100	0.5	100	64	nadam	sigmoid
	GS-rcICQRNN-30	120	0.4	100	64	nadam	sigmoid
	GS-rcICQRNN-50	200	0.5	100	128	nadam	sigmoid
	GS-QRNN	200	0.3	50	64	adam	sigmoid
	WOA-rcICQRNN-5	102	0.3	124	84	-	-
	WOA-rcICQRNN-10	195	0.4	99	74	-	-
	WOA-rcICQRNN-15	248	0.3	62	74	-	-
	WOA-rcICQRNN-19	245	0.4	97	102	-	-
	WOA-rcICQRNN-30	176	0.3	123	102	-	-
	WOA-rcICQRNN-50	170	0.4	92	80	-	-
	WOA-QRNN	59	0.2	98	74	-	-
layer = 3	GS-rcICQRNN-5	150	0.5	100	64	adam	sigmoid
	GS-rcICQRNN-10	200	0.5	100	64	nadam	sigmoid
	GS-rcICQRNN-15	120	0.3	100	64	nadam	sigmoid
	GS-rcICQRNN-19	150	0.5	100	64	adam	sigmoid
	GS-rcICQRNN-30	200	0.3	100	128	nadam	sigmoid
	GS-rcICQRNN-50	120	0.4	200	128	adam	sigmoid
	GS-QRNN	200	0.5	100	64	adam	sigmoid
	WOA-rcICQRNN-5	164	0.4	120	74	-	-
	WOA-rcICQRNN-10	154	0.3	76	74	-	-
	WOA-rcICQRNN-15	186	0.4	78	93	-	-
	WOA-rcICQRNN-19	255	0.4	205	102	-	-
	WOA-rcICQRNN-30	95	0.2	147	102	-	-
	WOA-rcICQRNN-50	102	0.4	180	116	-	-
	WOA-QRNN	147	0.4	115	102	-	-

Table S8. Survival prediction results after feature selection for the METABRIC dataset.

layer	method	Cindex	MMSE	QL
layer = 1	Integer-FS-CQRNN-5	0.761(0.0103)	0.6524(0.0355)	0.3119(0.0047)
	Integer-FS-CQRNN-10	0.7617(0.0081)	0.657(0.0321)	0.3122(0.0051)
	Integer-FS-CQRNN-15	0.761(0.0107)	0.66(0.0356)	0.3117(0.0058)
	Integer-FS-CQRNN-19	0.762(0.0093)	0.6599(0.0335)	0.3105(0.0057)
	Integer-FS-CQRNN-30	0.7636(0.0092)	0.6448(0.0289)	0.3108(0.0053)
	Integer-FS-CQRNN-50	0.7639(0.0094)	0.6525(0.029)	0.3096(0.0054)
	Integer-FS-QRNN	0.7617(0.0115)	0.6509(0.0243)	0.3123(0.0054)
	One-Hot-FS-CQRNN-5	0.8356(0.0077)	0.5135(0.0241)	0.2818(0.0038)
	One-Hot-FS-CQRNN-10	0.8357(0.0099)	0.5119(0.0259)	0.2828(0.0051)
	One-Hot-FS-CQRNN-15	0.8338(0.0078)	0.5174(0.0266)	0.2827(0.0036)
	One-Hot-FS-CQRNN-19	0.8362(0.0092)	0.5174(0.0255)	0.2833(0.0046)
	One-Hot-FS-CQRNN-30	0.8341(0.0085)	0.5186(0.027)	0.2841(0.0045)
	One-Hot-FS-CQRNN-50	0.8338(0.0078)	0.5174(0.0266)	0.2827(0.0036)
	One-Hot-FS-QRNN	0.8368(0.0092)	0.5156(0.0241)	0.2823(0.0048)
layer = 2	Integer-FS-CQRNN-5	0.7666(0.0072)	0.7388(0.034)	0.2952(0.0033)
	Integer-FS-CQRNN-10	0.7649(0.0079)	0.7489(0.0397)	0.2966(0.004)
	Integer-FS-CQRNN-15	0.7647(0.0066)	0.7491(0.0323)	0.2967(0.0035)
	Integer-FS-CQRNN-19	0.7657(0.0062)	0.7494(0.0269)	0.2956(0.0035)
	Integer-FS-CQRNN-30	0.765(0.0066)	0.7489(0.0328)	0.2968(0.0036)
	Integer-FS-CQRNN-50	0.7677(0.0078)	0.7408(0.0364)	0.2953(0.0043)
	Integer-FS-QRNN	0.7681(0.0064)	0.7342(0.0315)	0.2955(0.0037)
	One-Hot-FS-CQRNN-5	0.8263(0.0057)	0.6714(0.0289)	0.2763(0.0037)
	One-Hot-FS-CQRNN-10	0.8272(0.0069)	0.6747(0.0323)	0.2759(0.0038)
	One-Hot-FS-CQRNN-15	0.8289(0.0064)	0.6676(0.0306)	0.2759(0.0038)
	One-Hot-FS-CQRNN-19	0.8283(0.0059)	0.6604(0.0287)	0.2758(0.0036)
	One-Hot-FS-CQRNN-30	0.8284(0.0065)	0.6741(0.0365)	0.2757(0.0034)
	One-Hot-FS-CQRNN-50	0.8287(0.0059)	0.6635(0.0243)	0.2761(0.0034)
	One-Hot-FS-QRNN	0.8282(0.0074)	0.6659(0.0315)	0.2767(0.0037)
layer = 3	Integer-FS-CQRNN-5	0.7608(0.0083)	0.7716(0.0548)	0.2957(0.0049)
	Integer-FS-CQRNN-10	0.7617(0.0067)	0.7688(0.04)	0.2957(0.0039)
	Integer-FS-CQRNN-15	0.7589(0.0089)	0.7784(0.0428)	0.296(0.0042)
	Integer-FS-CQRNN-19	0.759(0.0075)	0.7754(0.0423)	0.296(0.0039)
	Integer-FS-CQRNN-30	0.7591(0.0067)	0.7687(0.0446)	0.2951(0.0043)
	Integer-FS-CQRNN-50	0.7597(0.0067)	0.7774(0.0405)	0.2954(0.0042)
	Integer-FS-QRNN	0.7579(0.0073)	0.7676(0.0451)	0.2948(0.0044)
	One-Hot-FS-CQRNN-5	0.8148(0.0072)	0.7153(0.0382)	0.2814(0.0047)
	One-Hot-FS-CQRNN-10	0.8122(0.007)	0.7353(0.0338)	0.2841(0.0038)
	One-Hot-FS-CQRNN-15	0.8127(0.0086)	0.7275(0.0432)	0.2821(0.0046)
	One-Hot-FS-CQRNN-19	0.8106(0.0081)	0.7216(0.0439)	0.2827(0.0042)
	One-Hot-FS-CQRNN-30	0.8127(0.0078)	0.7251(0.0353)	0.2828(0.0049)
	One-Hot-FS-CQRNN-50	0.8119(0.0091)	0.7221(0.0378)	0.2823(0.0045)
	One-Hot-FS-QRNN	0.8126(0.0069)	0.721(0.0417)	0.2811(0.0053)

Table S9. Survival prediction results after integer encoding optimization for METABRIC dataset.

layer	method	Cindex	MMSE	OL
layer = 1	Integer-FS-GS-CORNN-5	0.7969(0.0105)	0.5388(0.0318)	0.2918(0.0049)
	Integer-FS-GS-CQRNN-10	0.7984(0.0098)	0.5379(0.0255)	0.2907(0.0043)
	Integer-FS-GS-CQRNN-15	0.7937(0.0086)	0.5418(0.0263)	0.2945(0.0036)
	Integer-FS-GS-CQRNN-19	0.7932(0.0069)	0.5482(0.0258)	0.2946(0.0031)
	Integer-FS-GS-CQRNN-30	0.7958(0.0112)	0.5422(0.0387)	0.2917(0.0043)
	Integer-FS-GS-CQRNN-50	0.791(0.0102)	0.5506(0.0239)	0.2968(0.0043)
	Integer-FS-GS-QRNN	0.7913(0.0094)	0.5504(0.0322)	0.2953(0.0035)
	Integer-FS-WOA-CQRNN-5	0.7886(0.0106)	0.5698(0.0348)	0.2969(0.0054)
	Integer-FS-WOA-CQRNN-10	0.7933(0.0092)	0.5458(0.0279)	0.2939(0.0043)
	Integer-FS-WOA-CQRNN-15	0.7911(0.008)	0.5603(0.0257)	0.2975(0.0039)
	Integer-FS-WOA-CQRNN-19	0.7912(0.0115)	0.5493(0.0362)	0.2948(0.0055)
	Integer-FS-WOA-CQRNN-30	0.7946(0.0107)	0.5409(0.031)	0.2952(0.0051)
	Integer-FS-WOA-CQRNN-50	0.78(0.0124)	0.5793(0.032)	0.307(0.0051)
	Integer-FS-WOA-QRNN	0.7679(0.0134)	0.5931(0.0417)	0.3101(0.0058)
layer = 2	Integer-FS-GS-CORNN-5	0.8108(0.0082)	0.5519(0.0315)	0.2706(0.0032)
	Integer-FS-GS-CQRNN-10	0.8002(0.0077)	0.5951(0.0369)	0.2795(0.0033)
	Integer-FS-GS-CQRNN-15	0.8077(0.0076)	0.5609(0.036)	0.2728(0.0035)
	Integer-FS-GS-CQRNN-19	0.7977(0.0068)	0.5912(0.0342)	0.2783(0.0027)
	Integer-FS-GS-CQRNN-30	0.8083(0.0072)	0.5535(0.0353)	0.2726(0.0038)
	Integer-FS-GS-CQRNN-50	0.808(0.0081)	0.5579(0.039)	0.2732(0.0036)
	Integer-FS-GS-QRNN	0.8002(0.0068)	0.5683(0.0295)	0.2754(0.0031)
	Integer-FS-WOA-CQRNN-5	0.8047(0.0093)	0.5302(0.0311)	0.2756(0.0042)
	Integer-FS-WOA-CQRNN-10	0.7979(0.0111)	0.6094(0.0455)	0.2807(0.0045)
	Integer-FS-WOA-CQRNN-15	0.8052(0.0117)	0.5457(0.0535)	0.272(0.0047)
	Integer-FS-WOA-CQRNN-19	0.8067(0.0106)	0.5533(0.0427)	0.2728(0.0047)
	Integer-FS-WOA-CQRNN-30	0.805(0.0101)	0.5681(0.0393)	0.2737(0.0028)
	Integer-FS-WOA-CQRNN-50	0.7991(0.0066)	0.6066(0.0314)	0.281(0.0037)
	Integer-FS-WOA-QRNN	0.8002(0.0152)	0.5352(0.0479)	0.271(0.005)
layer = 3	Integer-FS-GS-CORNN-5	0.7681(0.0053)	0.7166(0.0313)	0.2945(0.0036)
	Integer-FS-GS-CQRNN-10	0.7704(0.0056)	0.7179(0.0373)	0.2968(0.0042)
	Integer-FS-GS-CQRNN-15	0.7675(0.0065)	0.7255(0.0309)	0.2942(0.0041)
	Integer-FS-GS-CQRNN-19	0.7593(0.0074)	0.7508(0.0386)	0.3(0.0039)
	Integer-FS-GS-CQRNN-30	0.7674(0.0071)	0.7301(0.0411)	0.2944(0.0038)
	Integer-FS-GS-CQRNN-50	0.7833(0.0069)	0.6726(0.0366)	0.2888(0.0039)
	Integer-FS-GS-QRNN	0.7628(0.0079)	0.7519(0.0437)	0.2979(0.0039)
	Integer-FS-WOA-CQRNN-5	0.8032(0.0073)	0.5121(0.0258)	0.2713(0.0036)
	Integer-FS-WOA-CQRNN-10	0.807(0.0097)	0.549(0.0399)	0.2757(0.0038)
	Integer-FS-WOA-CQRNN-15	0.8068(0.0102)	0.5734(0.0478)	0.2767(0.0058)
	Integer-FS-WOA-CQRNN-19	0.7968(0.0121)	0.6126(0.0384)	0.2833(0.0051)
	Integer-FS-WOA-CQRNN-30	0.8035(0.0098)	0.5301(0.0402)	0.2703(0.0032)
	Integer-FS-WOA-CQRNN-50	0.8039(0.0081)	0.5848(0.046)	0.2796(0.0061)
	Integer-FS-WOA-QRNN	0.8022(0.007)	0.5009(0.0228)	0.2739(0.0038)



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