SACA Net: Cybersickness Assessment of Individual Viewers for VR Content via Graph-based Symptom Relation Embedding - Supplementary Material -

1 Network Details

Table 1. Network details of the visual expectation generator in the sensory mismatch detector of the stimulus symptom context guider.

Visual Expectation Generator			
Layer	Filter/ Stride	Output Size $(h \times w \times c)$ $112 \times 112 \times 16$	
ConvLSTM1	$3 \times 3/$ (2, 2)		
ConvLSTM2	$3 \times 3/$ (2, 2)	$56{\times}56{\times}32$	
ConvLSTM3	$3 \times 3/$ (2, 2)	$28{\times}28{\times}64$	
ConvLSTM4	$3 \times 3/$ (2, 2)	$14{\times}14{\times}128$	
DeConvLSTM1	$3 \times 3/$ (2, 2)	$28 \times 28 \times 64$ $56 \times 56 \times 32$	
DeConvLSTM2	$3 \times 3/$ (2, 2)		
${\bf DeConvLSTM3}$	$3\times3/$ $(2, 2)$	$112{\times}112{\times}16$	
DeConvLSTM4	$3 \times 3/$ (2, 2)	$224{\times}224{\times}3$	

Table 2. Network details of the mismatch encoder and the visual encoder in the stimulus symptom context guider. The mismatch encoder and the visual encoder have the same network structure but do not share their weights.

Mismatch Encoder / Visual Encoder			
Layer	Filter/ Stride	Output Size $(l \times h \times w \times c)$	
3D-Conv1	$3 \times 3 \times 3 / $ $(1, 2, 2)$	9×112×112×8	
3D-Conv2	$3 \times 3 \times 3/$ (1, 2, 2)	$7{\times}56{\times}56{\times}16$	
3D-Conv3	$3 \times 3 \times 3/$ (1, 2, 2)	$5{\times}28{\times}28{\times}32$	
3D-Conv4	$3 \times 3 \times 3/$ (1, 2, 2)	$3{\times}14{\times}14{\times}64$	
3D-Conv5	$3 \times 3 \times 3/$ (1, 2, 2)	$1{\times}7{\times}7{\times}64$	

Table 3. Network details of the global context encoder and the symptom group feature extraction in the stimulus symptom context guider. From FC2, it is applied individually for each symptom group. The feature after FC3 indicates the symptom group feature.

Global Context Encoder / Symptom Group Feature Extraction					
Layer	Filter/ Stride	$\begin{array}{c} \text{Output Size} \\ (h{\times}w{\times}c) \end{array}$			
2D-Conv	3×3/ (1, 1)	$7 \times 7 \times 256$			
FC1		1×1×64			
FC2	32/ (-)	$1{\times}1{\times}32$			
FC3	32/	$1{\times}1{\times}32$			
FC4	1/ (-)	$1\times1\times1$			

Table 4. Network details of the time-wise encoder, the frequency band attention, the time-freq-wise encoder, and the symptom feature extraction in the physiological symptom guider. From FC4_2, it is applied individually for each symptom. The feature after FC4_3 indicates the symptom feature.

Time-wise Encoder/Frequency Band Attention /Time-Freq-wise Encoder/Symptom Feature Extraction				
Layer	Filter/ Stride	$\begin{array}{c} \text{Output Size} \\ (h{\times}w{\times}c) \end{array}$		
1D-Conv1_1	1×3/ (1, 1)	$48{\times}128{\times}32$		
1D-Conv1_2	1×3/ (1, 1)	$48{\times}128{\times}32$		
1D-Conv1_3	$1\times3/$ $(1, 2)$	$48{\times}64{\times}32$		
2D-Conv2_1	(2, 2)	24×32×16		
$2D$ -Conv2_2	$3 \times 3/$ (2, 2)	$12{\times}16{\times}8$		
$2D\text{-}Conv2_3$	$3 \times 3/$ (2, 2)	$6\times 8\times 1$		
FC2_1	5/ (-)	$1\times1\times5$		
2D-Conv3_1	$\frac{3\times 3}{1}$ (1, 1)	48×64×32		
$2D\text{-}Conv3_2$	$3 \times 3/$ (2, 1)	$24{\times}64{\times}32$		
2D-Conv3_3	$3 \times 3/$ (2, 2)	$12{\times}32{\times}32$		
2D-Conv4_1	$\frac{3\times3/}{(1, 1)}$	$12\times8\times32$		
$2D\text{-}Conv4_2$	$3 \times 3/$ (2, 2)	$6\times4\times32$		
FC4_1	256/ (-)	$1{\times}1{\times}256$		
FC4_2	16/ (-)	$1{\times}1{\times}16$		
FC4_3	16/ (-)	$1\times1\times16$		
FC4_4	4/ (-)	$1\times1\times4$		
FC4_5	1/ (-)	$1\times1\times1$		

2 Network Computational Cost

 ${\bf Table~5.~Weight~parameter~size~and~inference~time~for~the~proposed~network.~The~inference~time~is~checked~based~on~a~single~TITAN~XP~GPU.}$

Model	# of Weights	Inference Time (sec)
Stimulus Symptom Context Guider	3.03M	1.646
Physiological Symptom Guider	0.16M	0.057
Symptom Relation Embedder	0.04M	0.016
Total	3.23M	1.719

3 Additional Quantitative Results

Table 6. Total SSQ score prediction performances according to the mismatch feature from the sensory mismatch detector in the stimulus symptom context guider.

VRSA DB-Shaking			VRSA DB-FR				
Method	PLCC	SROCO	RMSE	Method	PLCC	SROCO	RMSE
$\begin{array}{c} {\rm Proposed~Method} \\ {\rm (w/o~Mismatch~Features)} \end{array}$	0.725	0.606	30.069	Proposed Method (w/o Mismatch Feature)	0.777	0.640	24.992
Proposed Method (w/ Mismatch Feature)	0.751	0.679	25.373	Proposed Method (w/ Mismatch Feature)	0.801	0.671	22.937

Table 7. Total SSQ score prediction performances according to Relational Embedding (RE) and Stimulus Context (ST).

haking			VRSA DE	3-FR		
PLCC	SROCC	RMSE	Method	PLCC	SROCO	RMSE
0.610	0.461	35.070	Proposed Method (w/o RE, w/o ST)	0.745	0.599	25.611
0.677	0.544	32.961	Proposed Method (w/ RE, w/o ST)	0.768	0.619	24.631
0.751	0.679	25.373	Proposed Method (w/ RE, w/ ST)	0.801	0.671	22.937
	0.610	0.610 0.461 0.677 0.544	PLCC SROCC RMSE 0.610 0.461 35.070 0.677 0.544 32.961	PLCC SROCC RMSE Method 0.610 0.461 35.070 Proposed Method (w/o RE, w/o ST) 0.677 0.544 32.961 Proposed Method (w/ RE, w/o ST) 0.751 0.679 25.373 Proposed Method	PLCC SROCC RMSE Method PLCC 0.610 0.461 35.070 Proposed Method (w/o RE, w/o ST) 0.745 0.677 0.544 32.961 Proposed Method (w/ RE, w/o ST) 0.768 0.751 0.679 25 373 Proposed Method (w/ RE, w/o ST) 0.801	PLCC SROCC RMSE Method PLCC SROCC 0.610 0.461 35.070 Proposed Method (w/o RE, w/o ST) 0.745 0.599 0.677 0.544 32.961 Proposed Method (w/ RE, w/o ST) 0.768 0.619 0.751 0.679 25.373 Proposed Method (w/ RE, w/o ST) 0.801 0.671

4 Learning Curves

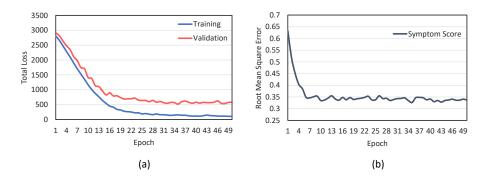


Fig. 1. (a) Total loss for training and validation according to the learning epoch. (b) Root mean square error (RMSE) validation for symptom score according to the learning epoch. Both results are from one training fold on VRSA DB-FR.