

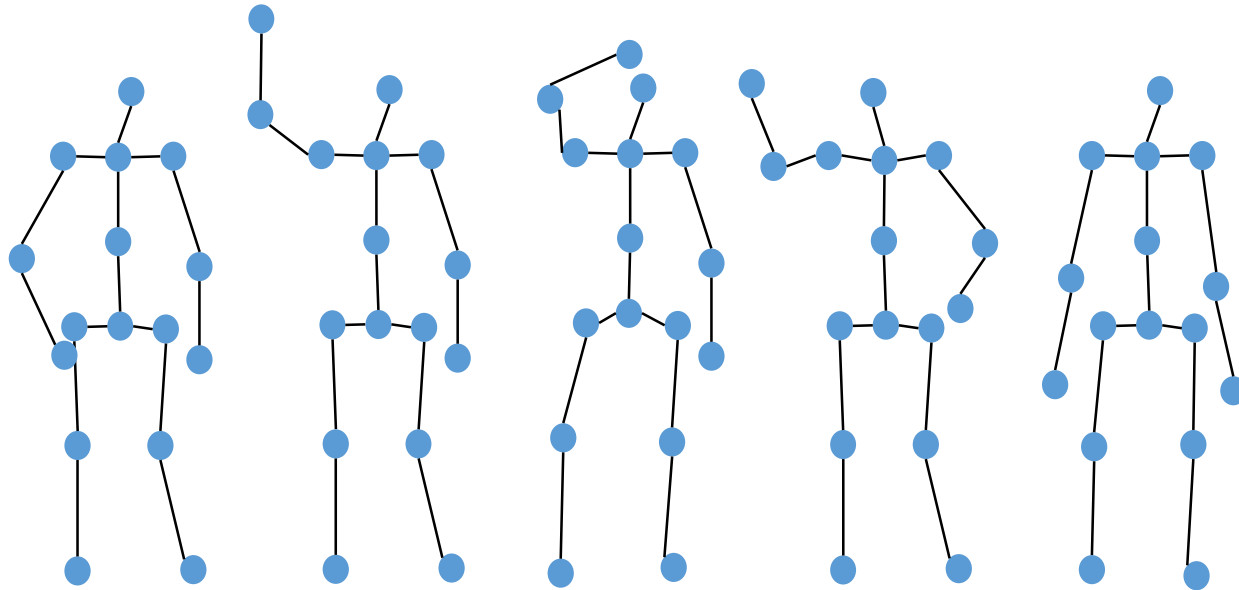
JT-MGCN: Joint-temporal Motion Graph Convolutional Network for Skeleton-Based Action Recognition

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Kyung Hee University

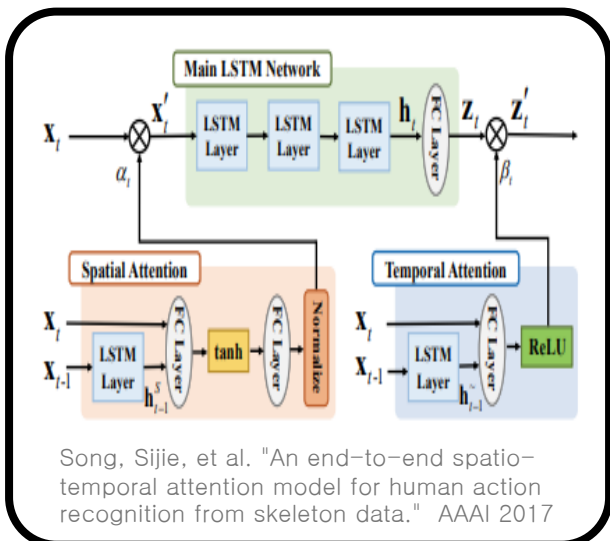
01. 21. 2021

Skeleton-Based Action Recognition

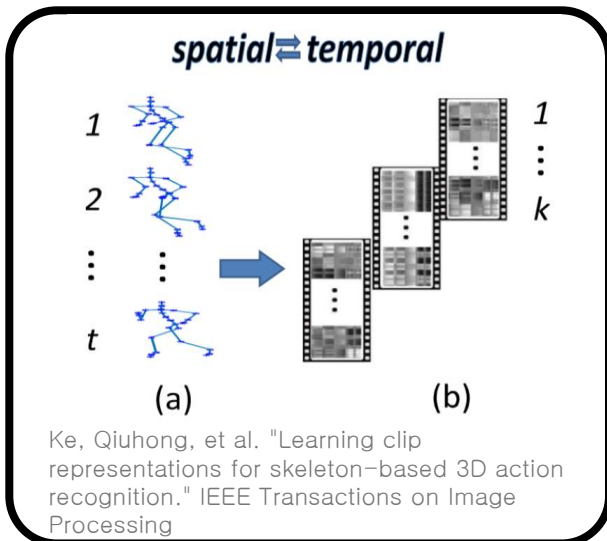


- **Without other different features**
- **Obtaining from RGB images or Depth cameras**

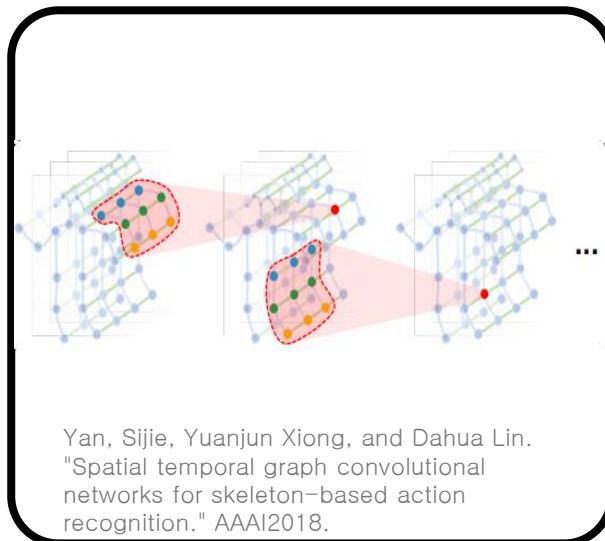
RNN based algorithm



CNN based algorithm



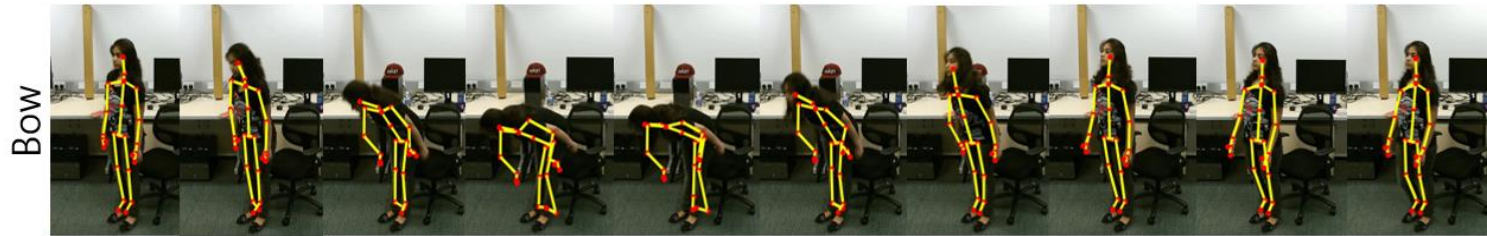
GCN based algorithm



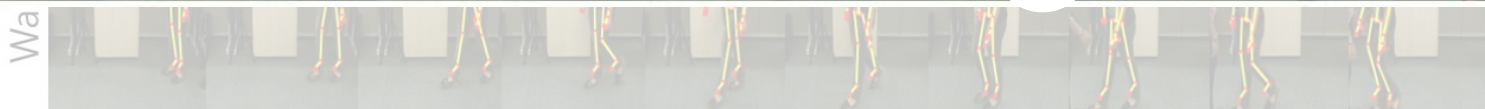
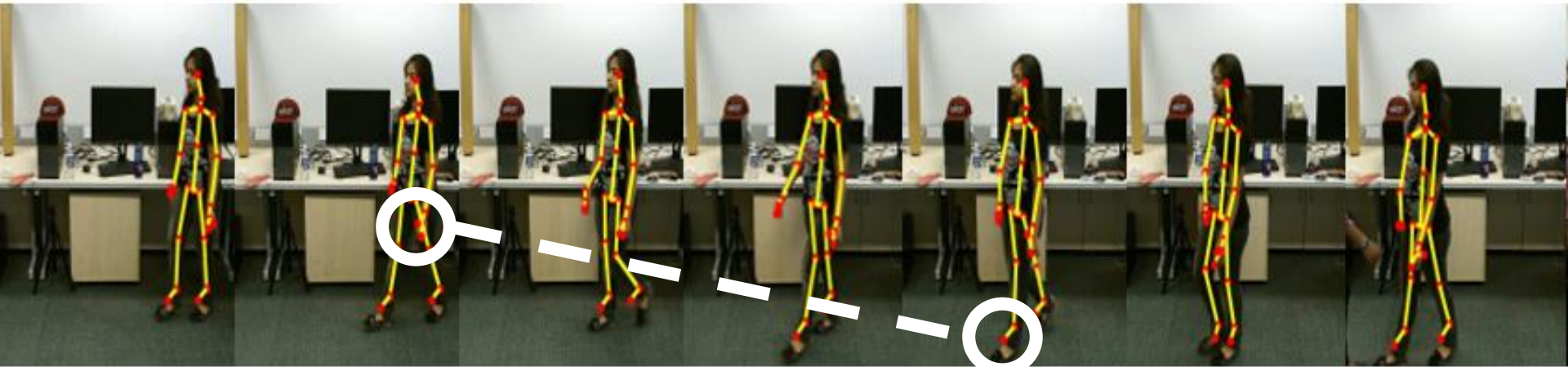
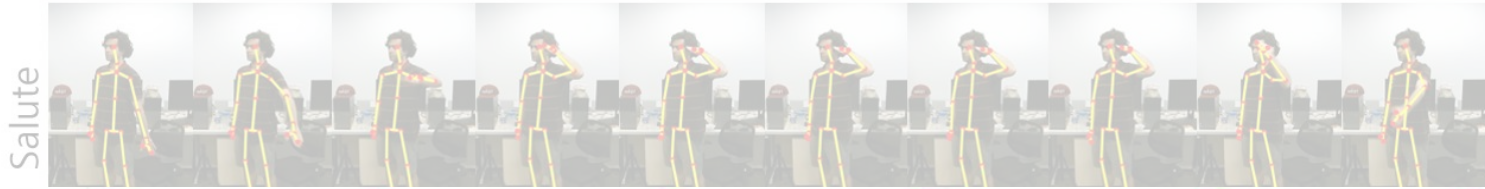
- FBRNN[2]
- ST-LSTM[17]
- GCA-LSTM+TSI[2]
- VA-LSTM[13]
- STA-LSTM[26]
- 2S-3D CNN[11]
- Res-TCN[6]
- MS deep CNN[7]
- Motion+Trans[8]
- ST-NBMIM[24]
- DPRN+GCNN[24]
- ARRN-LSTM[28]
- SR-TSL[21]
- IndRNN[10]
- (P+C)Net[1]
- AE-LSTM[16]
- MTCNN[5]
- ST-GCN[5]
- AGC-LSTM[25]
- AS-GCN[9]
- 2S-AGCN[20]
- BGC-LSTM[27]
- DGNN[18]

RNN	v	v	v	v	v	v							v	v	v	v	v			v			v
CNN							v	v	v	v	v	v				v	v						
GCN													v	v				v	v	v	v	v	v
		2016			2017								2018					2019					

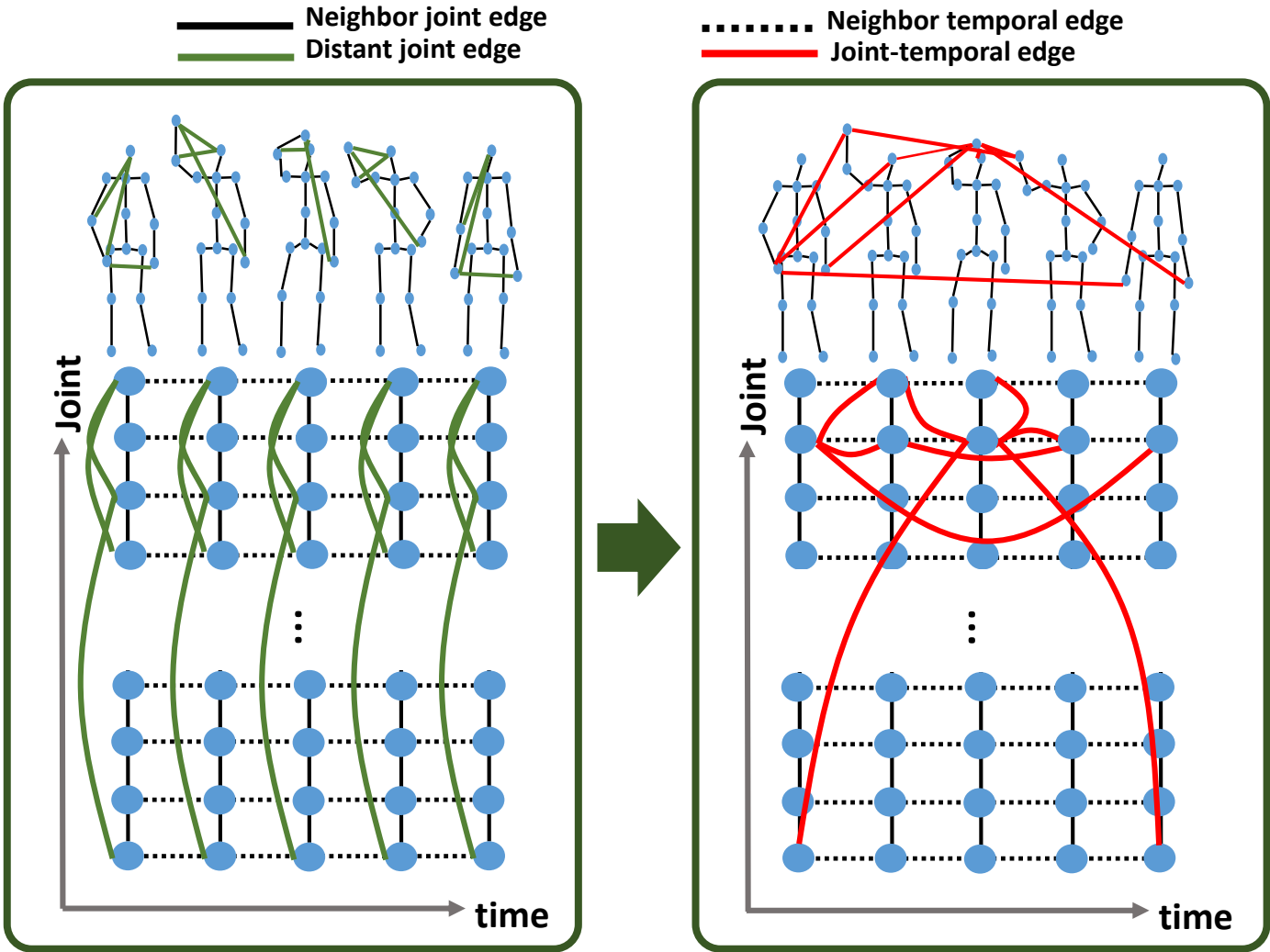
There are relationship between time and joint



There are relationship between time and joint



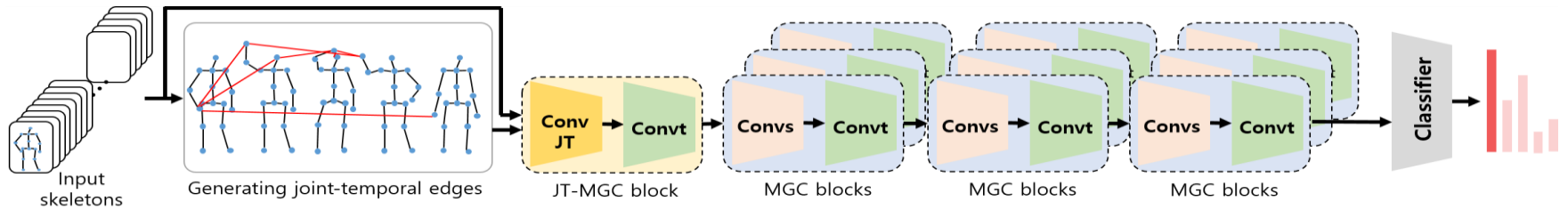
Proposed algorithm



2S-AGCN, Shi et al. *CVPR* 2019.

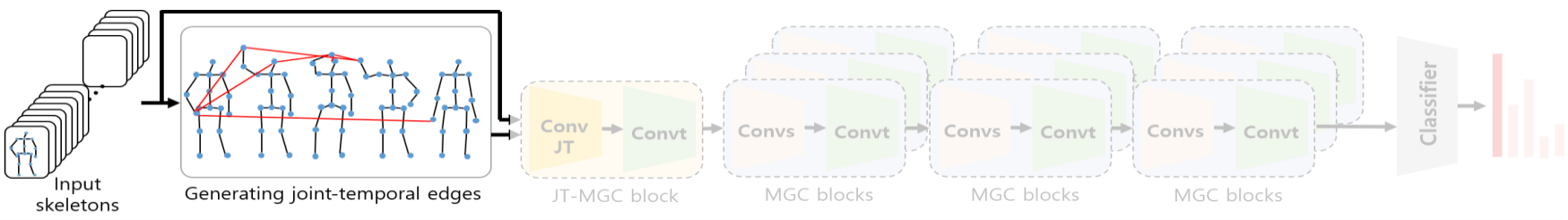
Our proposed algorithm

Overall frameworks

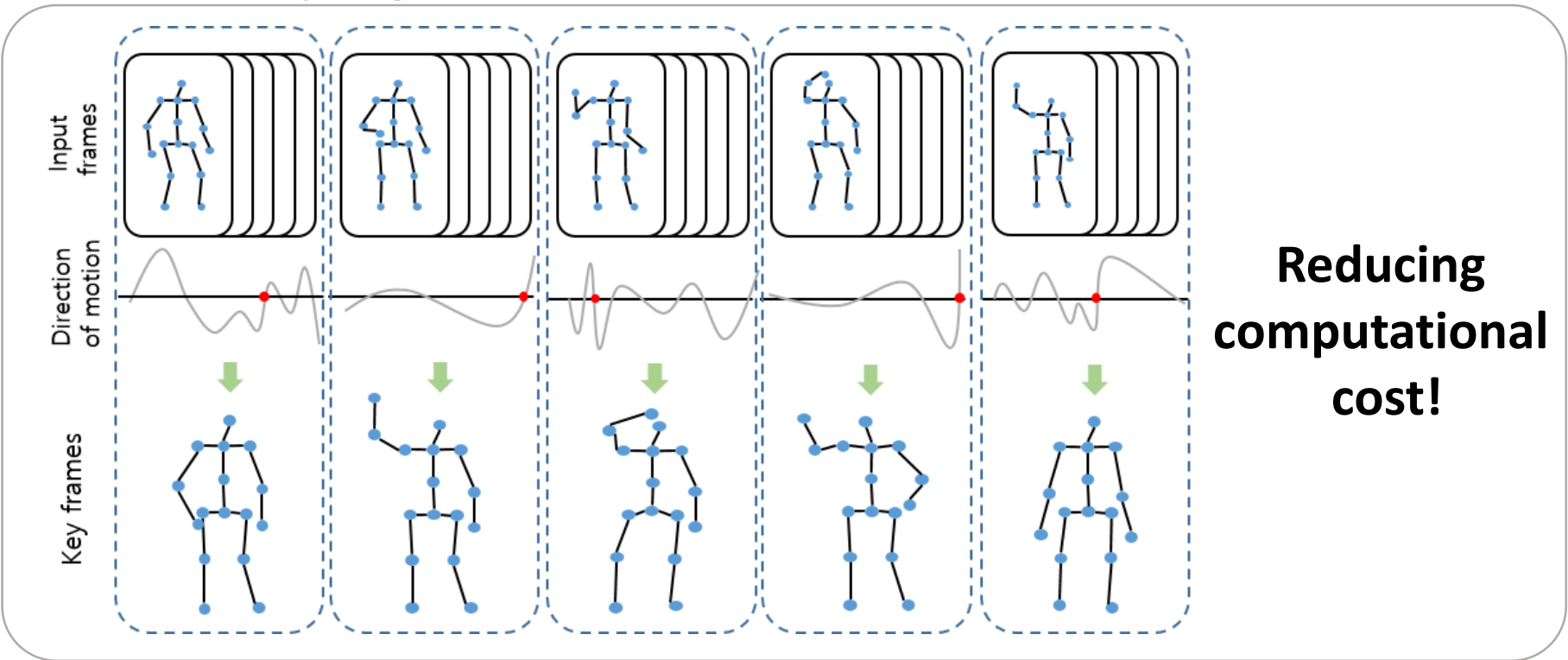


Proposed algorithm

Overall frameworks

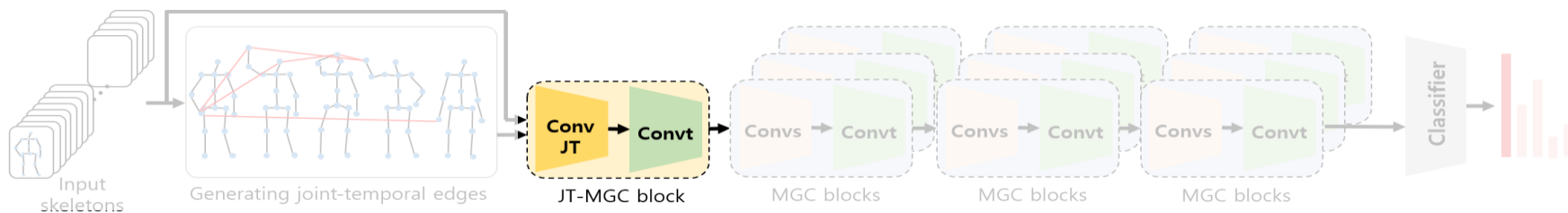


Frame Sampling

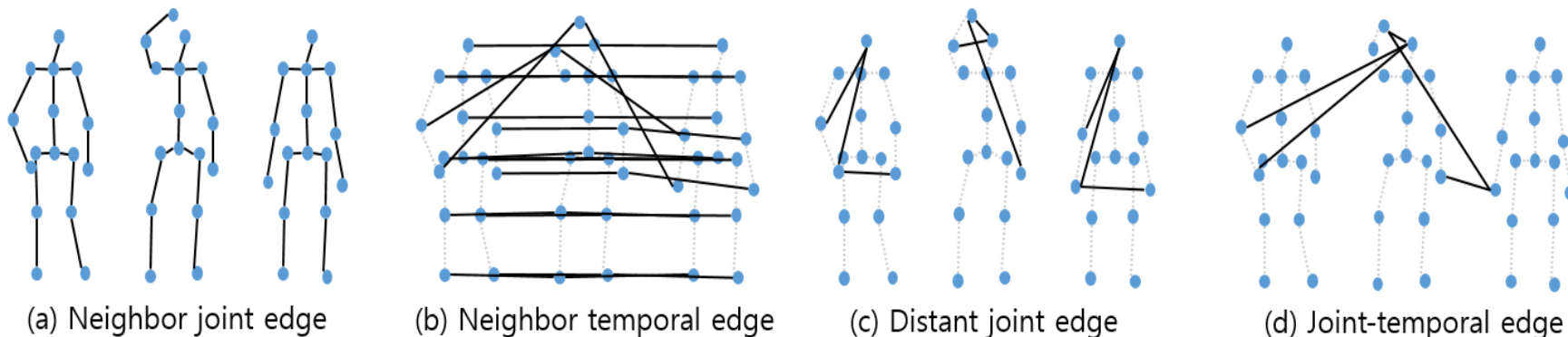


Proposed algorithm(2)

Overall frameworks



Generating various edges

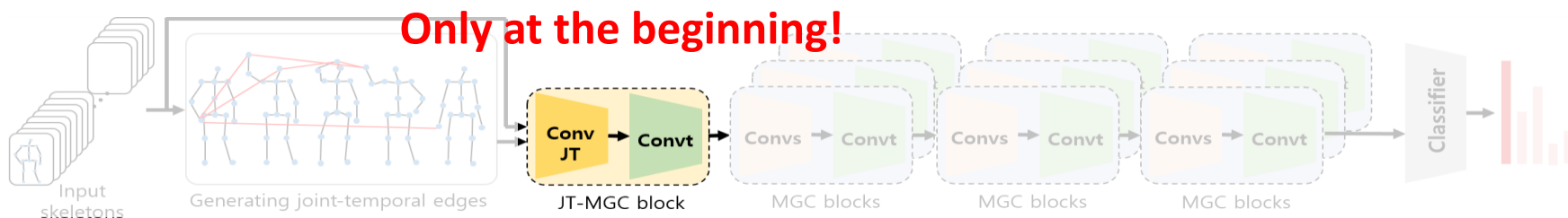


Way to make JT edges

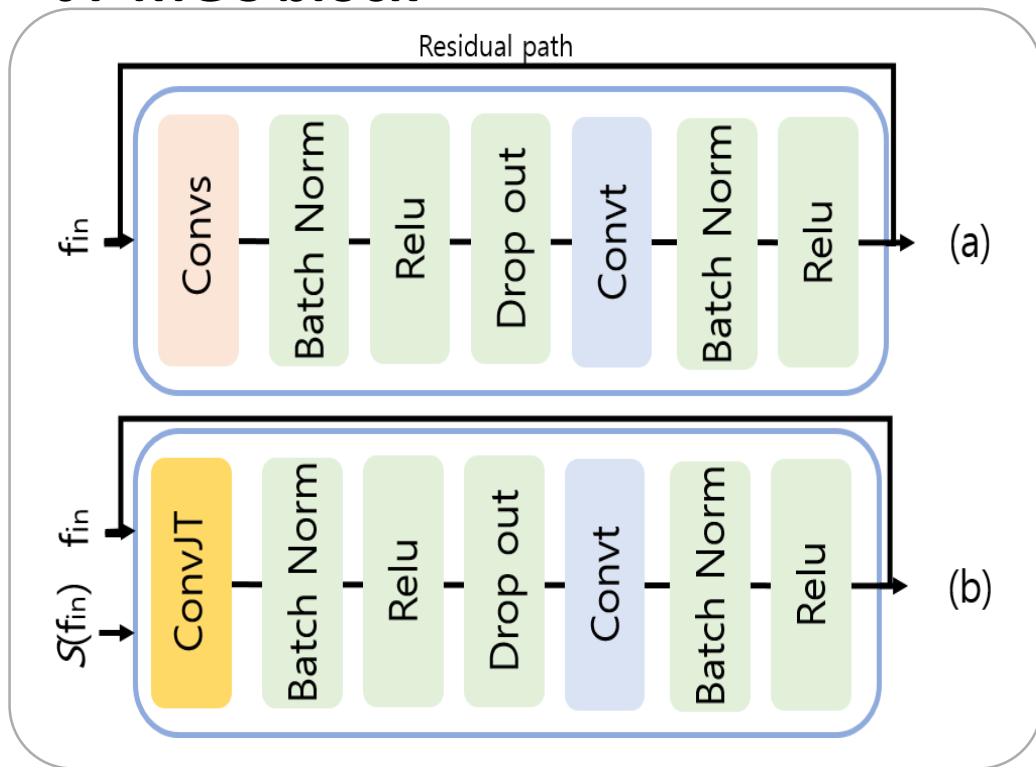
- 1) Learnable parameter
- 2) Encoder-Decoder model

Proposed algorithm

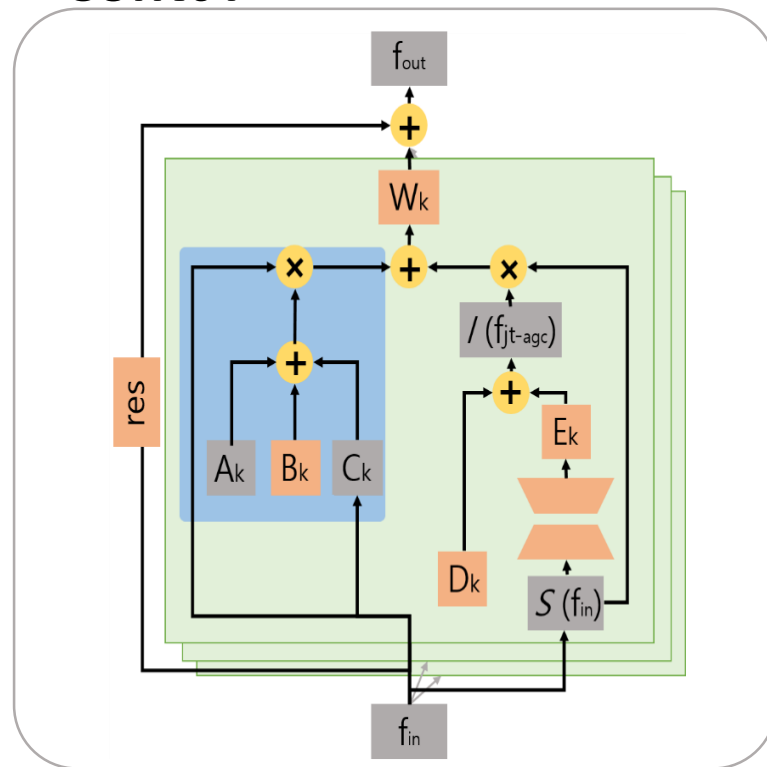
Overall frameworks



JT-MGC block

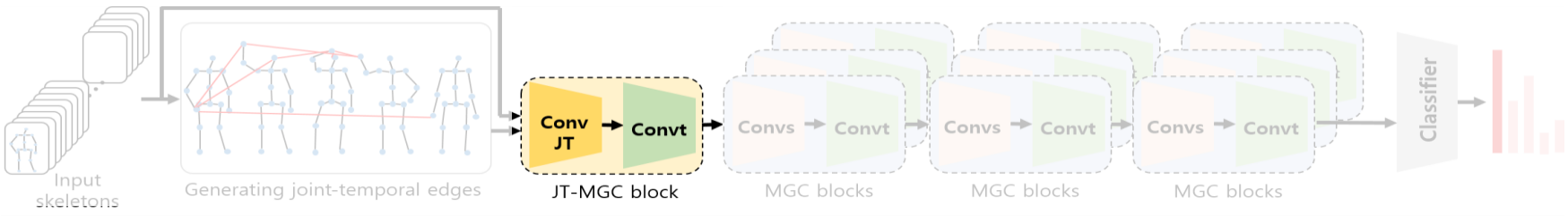


ConvJT

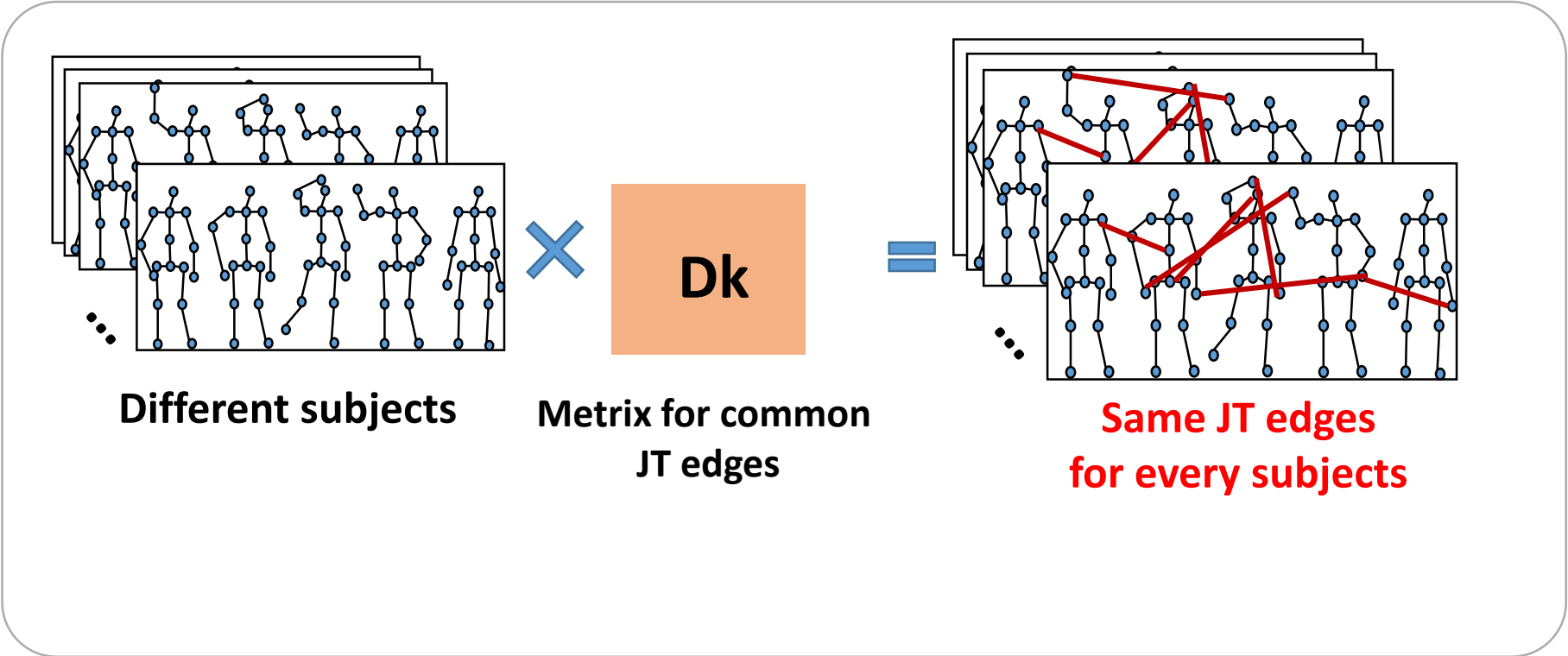


Proposed algorithm

Overall frameworks

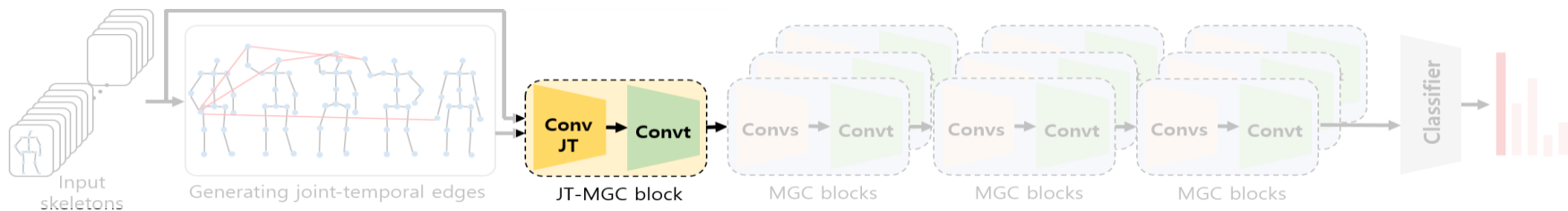


1) Multiply Learnable Parameters - Dk

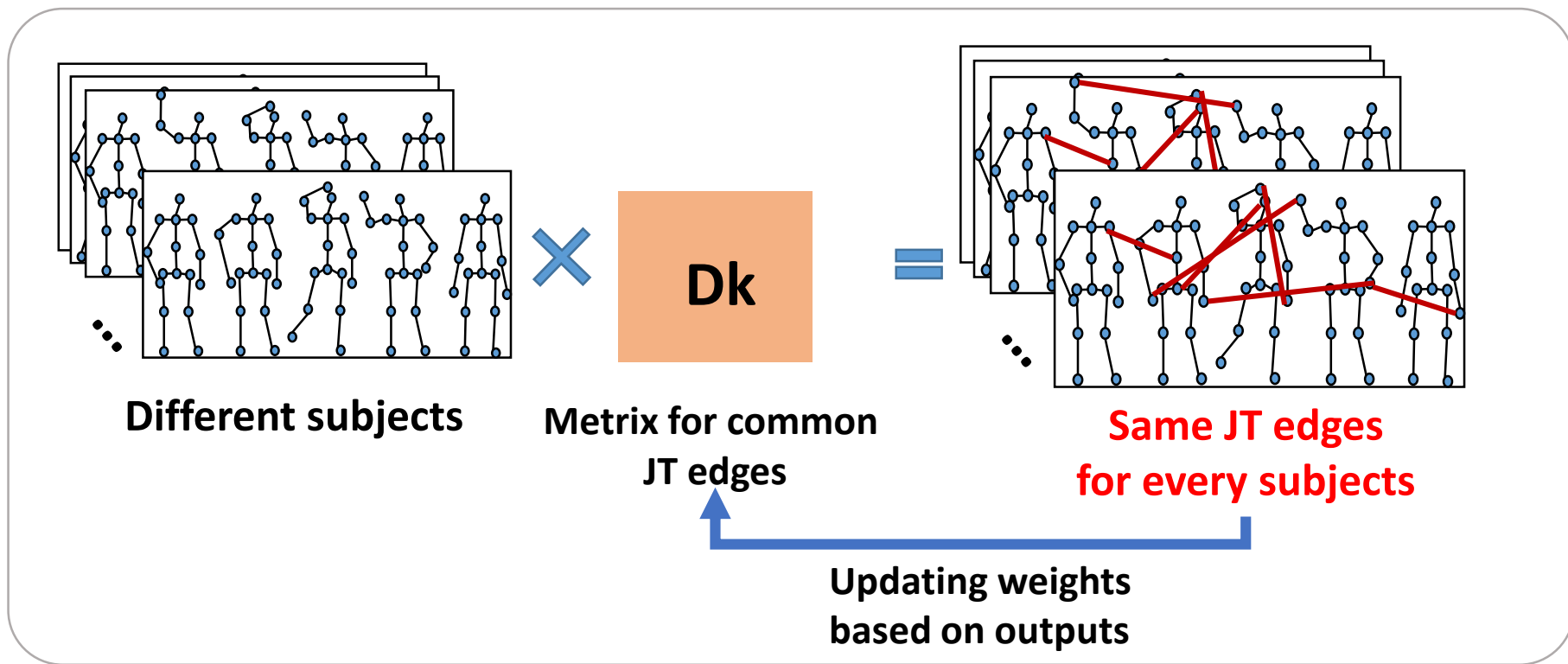


Proposed algorithm

Overall frameworks

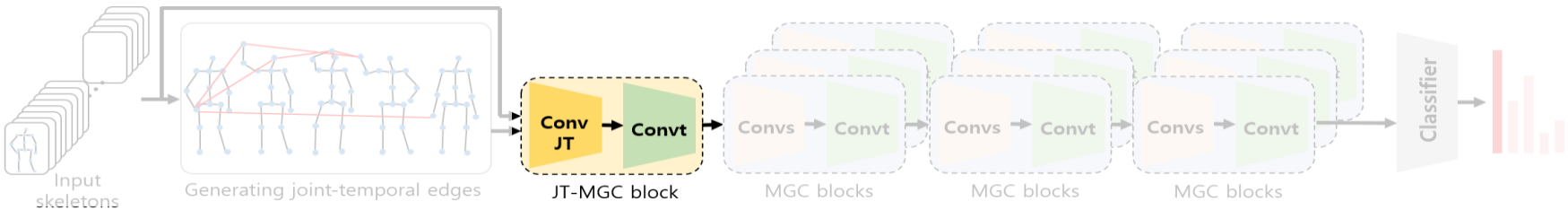


1) Multiply Learnable Parameters - D_k

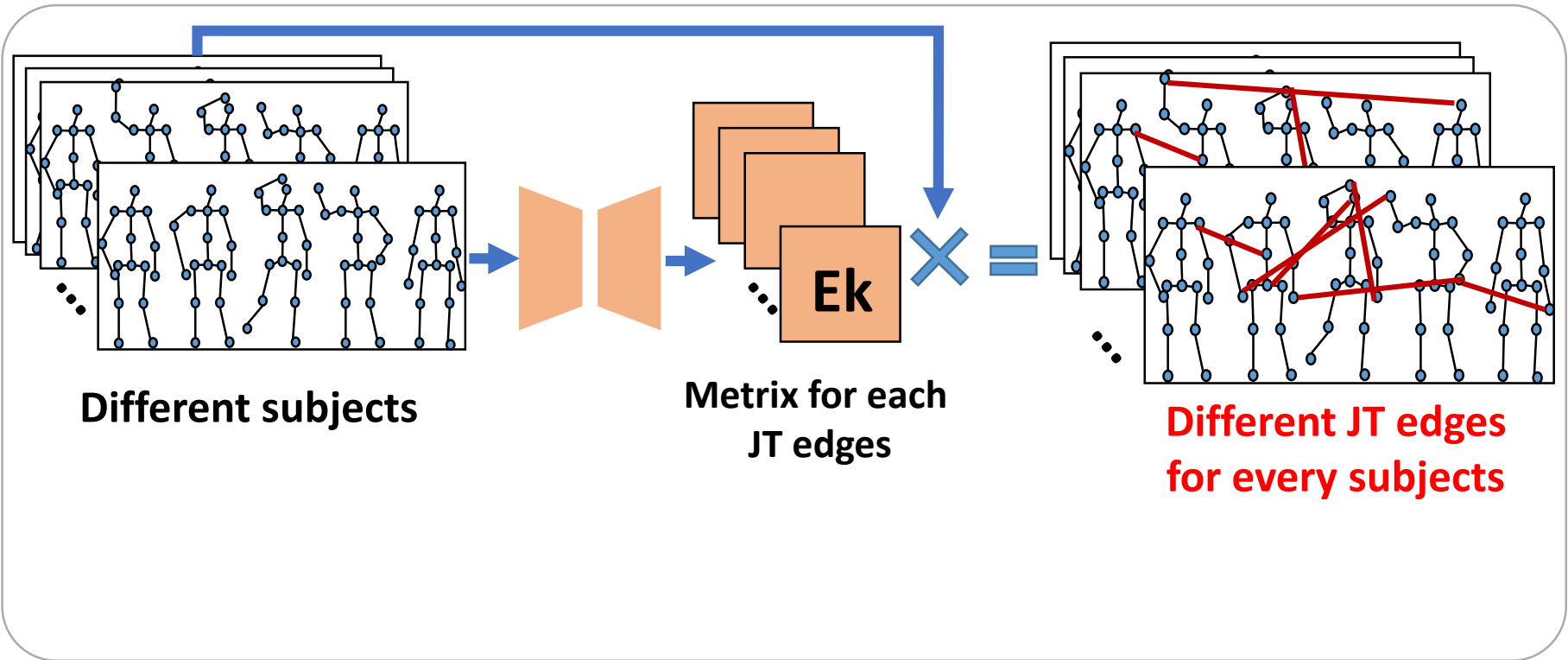


Proposed algorithm

Overall frameworks

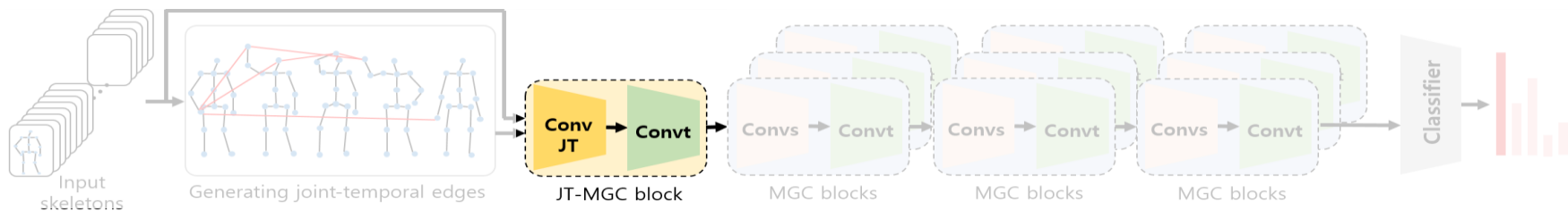


2) Multiply matrix through encoder-decoder - Ek

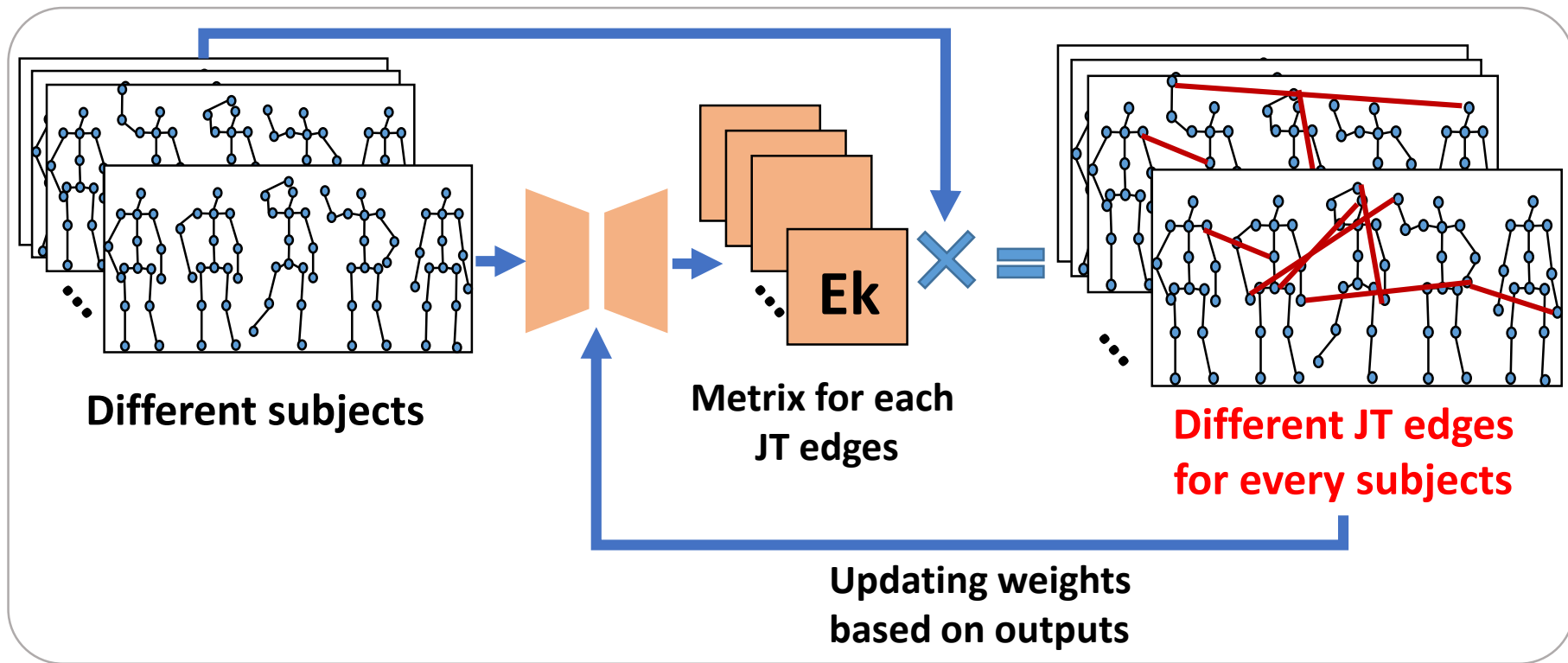


Proposed algorithm

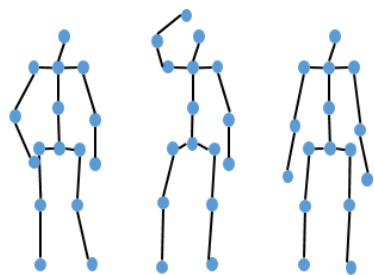
Overall frameworks



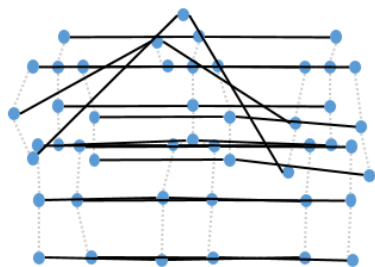
2) Multiply matrix through encoder-decoder - Ek



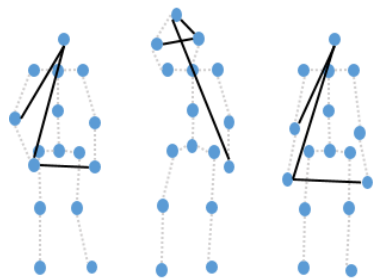
Results



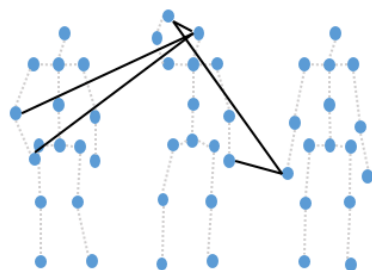
(a) Neighbor joint edge



(b) Neighbor temporal edge



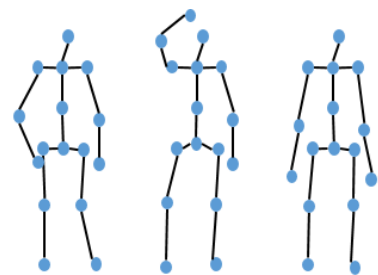
(c) Distant joint edge



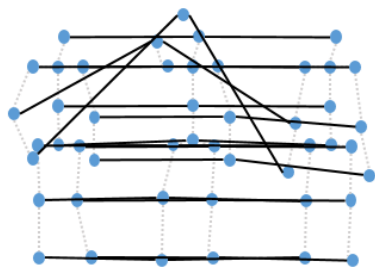
(d) Joint-temporal edge

method	CS(%)
(a)+(b)	81.5
(a)+(b)+(c)	88.5
(a)+(b)+(c)+(d)	90.4

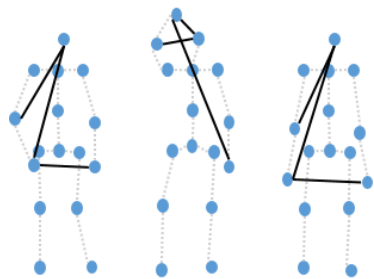
Method	Year	CS(%)	CV(%)
PA-LSTM [18]	2016	62.9	70.3
ST-LSTM+TS [13]	2016	69.2	77.7
STA-LSTM [23]	2017	73.4	81.2
VA-LSTM [27]	2017	79.4	87.6
MTLN [5]	2017	79.6	84.8
ST-NBMIM [25]	2018	80.0	84.2
MTCNN [6]	2018	81.1	87.4
ST-GCN [26]	2018	81.5	88.3
DPRL+GCNN[24]	2018	83.5	89.8
SR-TSL [22]	2018	84.8	92.4
AS-GCN [10]	2019	86.8	94.2
2S-AGCN [20]	2019	88.5	95.1
DGNN [19]	2019	89.9	96.1
JT-MGCN(proposed)	2019	90.40	95.78



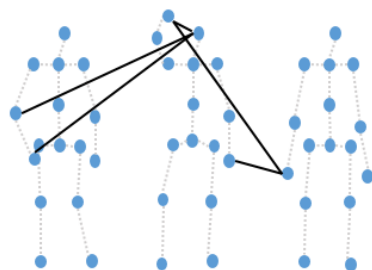
(a) Neighbor joint edge



(b) Neighbor temporal edge



(c) Distant joint edge



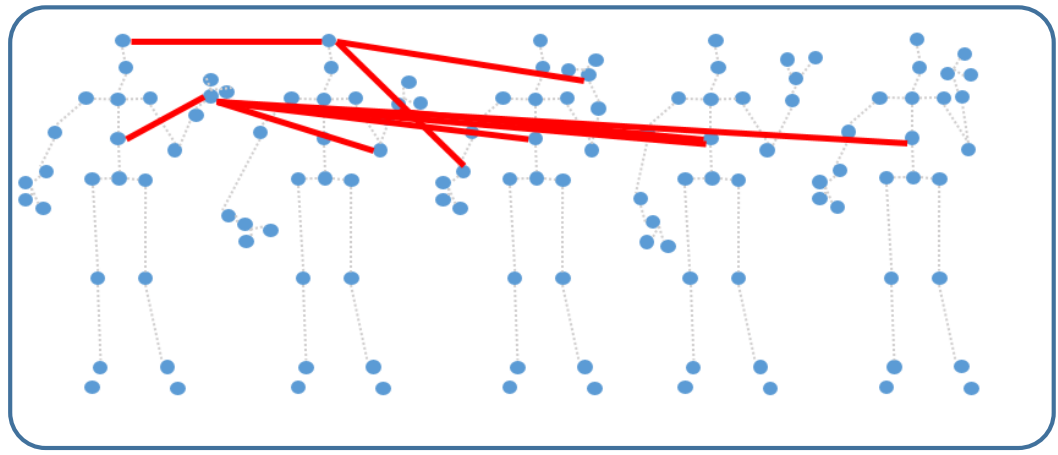
(d) Joint-temporal edge

	Method	CS(%)
Without shuffling	(a)+(b)+(c)	88.5
	(a)+(b)+(c)+(d)	90.4
With shuffling	(a)+(b)+(c)	13.4
	(a)+(b)+(c)+(d)	8.8

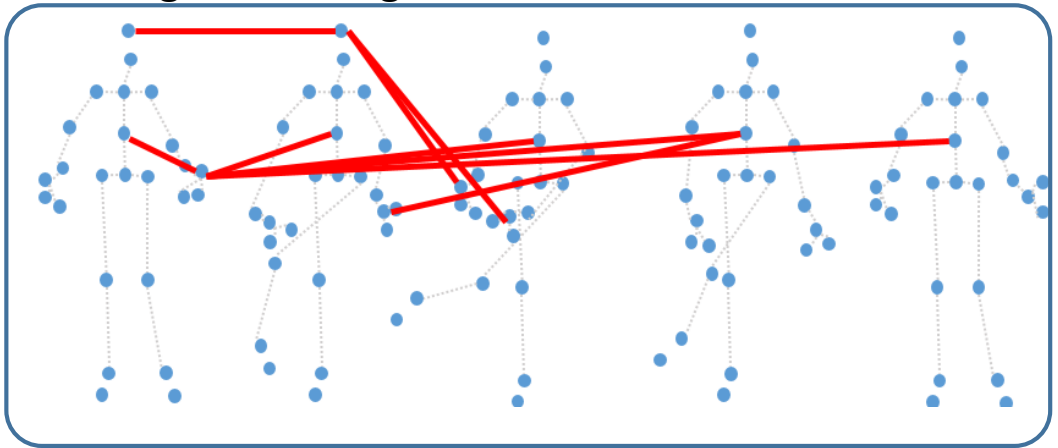
JT edges give More Meaningful features!

Visualization of Joint-Temporal edges

Drink water



Kicking Something



Independent edges are stronger than others!

Q & A