



National Research University Higher School of Economics  
Laboratory of Algorithms and Technologies for Network Analysis

# Decision-Making in Visual Product Recommendation using Neural Aggregation Network and Context Gating

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# Motivation



# Outline

- 1 Proposed approach
- 2 Experimental results
- 3 Conclusion and future work

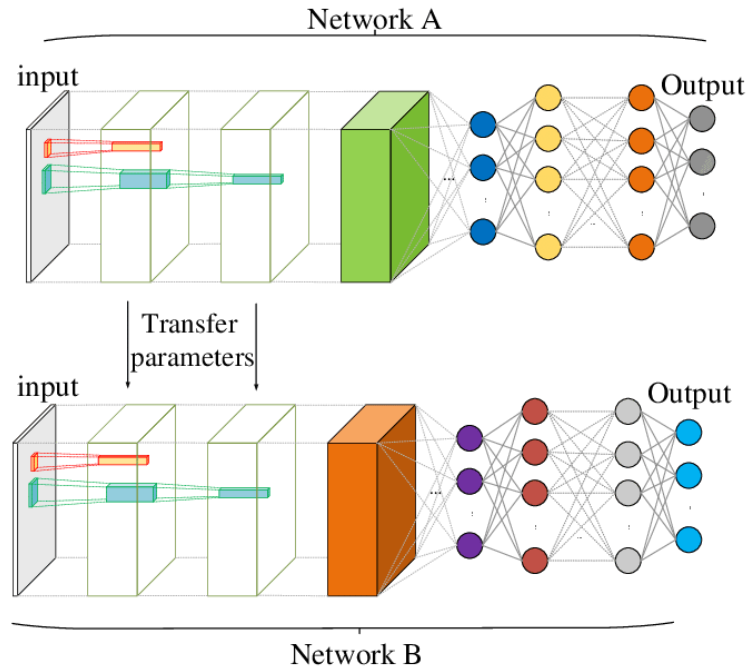


# Task Formulation

Let there be given  $N$  users:  $n$ -th user is associated with  $M_n$  images  $\{X_n(m)\}$ ,  $m = 1, 2, \dots, M_n$  of products (single product on each image) that this user has purchased or interacted with. Each product belongs to one or more of  $D$  categories. The task is to predict the relevant classes of products to a user based on a collection of images of products that user has interacted with, i.e. generated a  $D$ -dimensional vector of scores (estimates of posterior probabilities) that the corresponding category is relevant to the user.



# Transfer learning



# Algorithms

1 Average pooling

2 Neural Aggregation

3 Neural Aggregation + Context Gating



# Average Pooling

$$x_n = 1/M_n \sum_{m=1}^{M_n} (x_n(m))x_n(m)$$



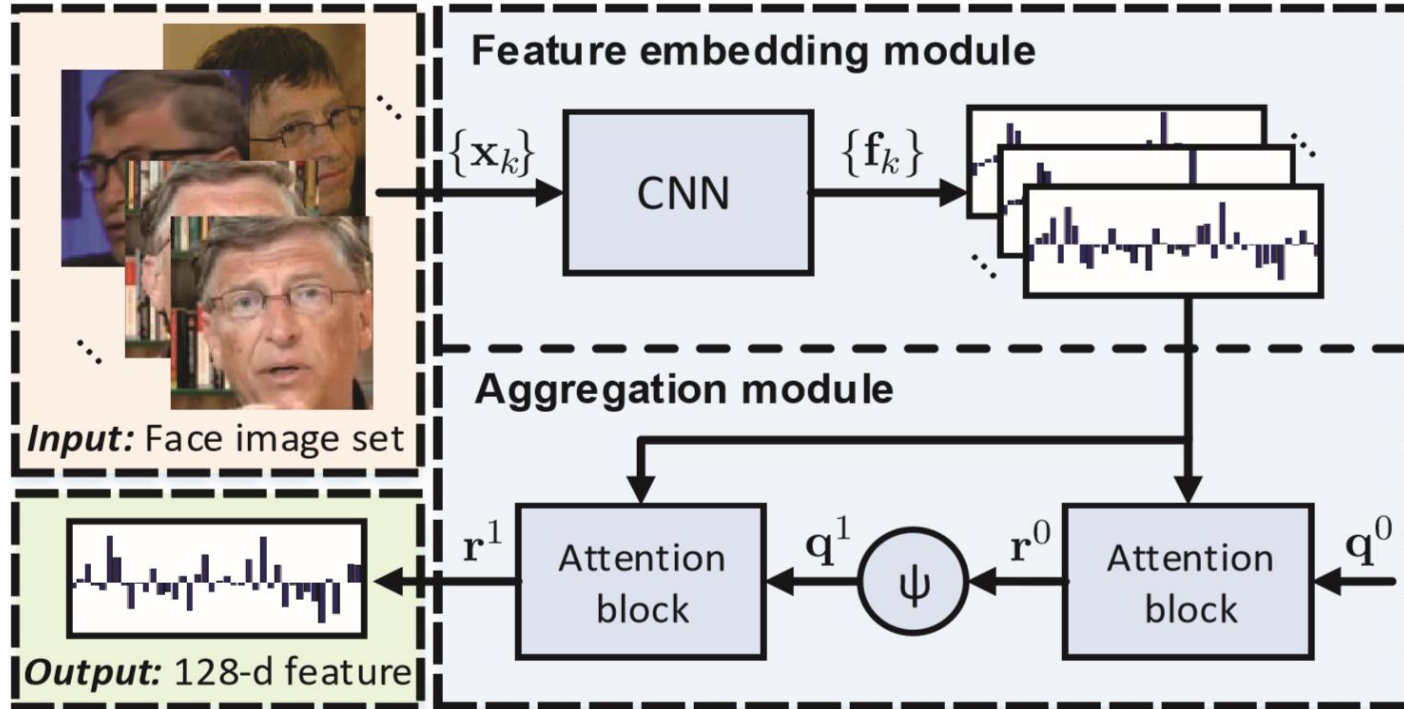
# Learnable Pooling

$$x_n = \sum_{m=1}^{M_n} w(x_n(m)) x_n(m)$$

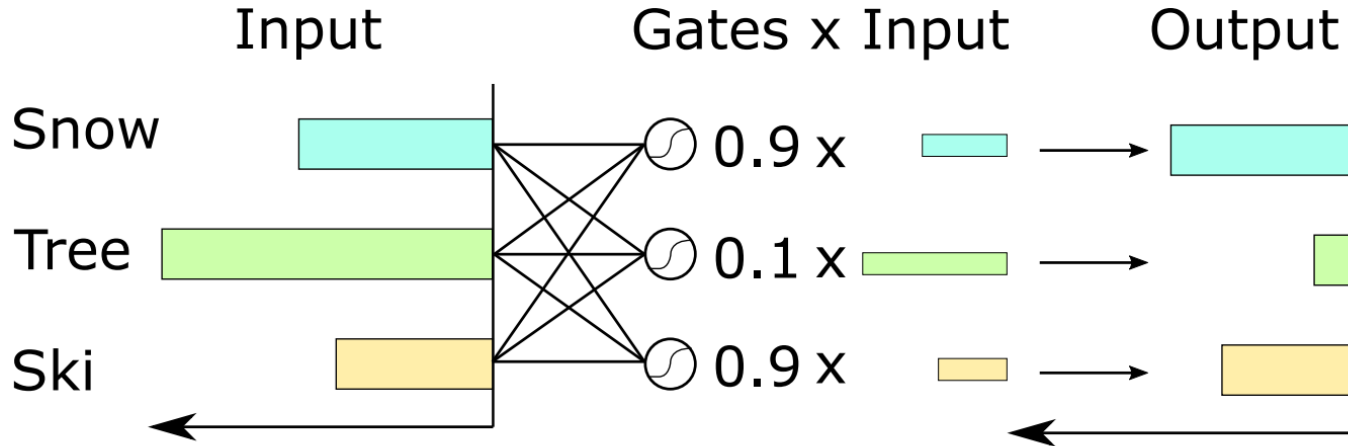




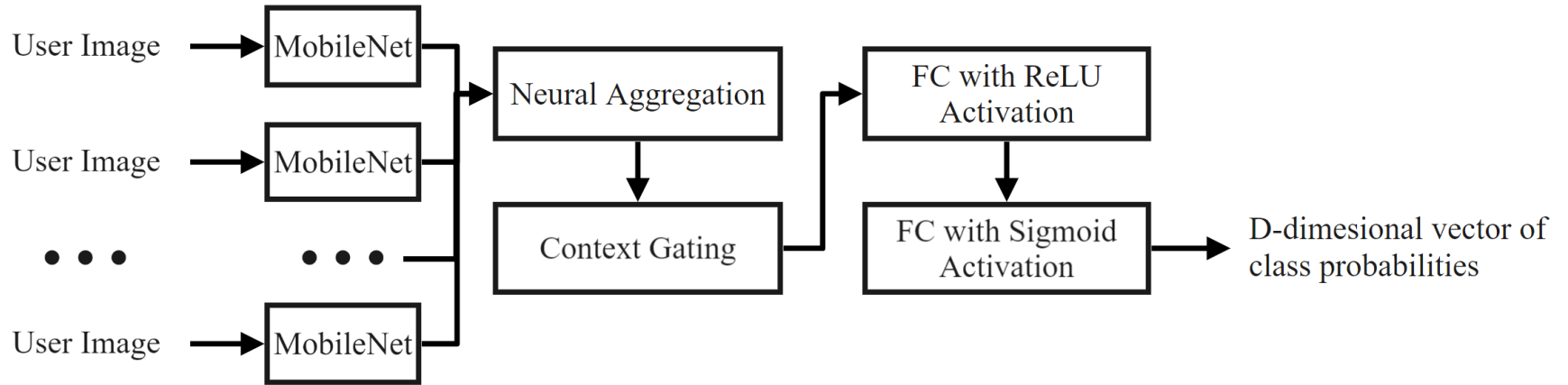
# Neural Aggregation Module



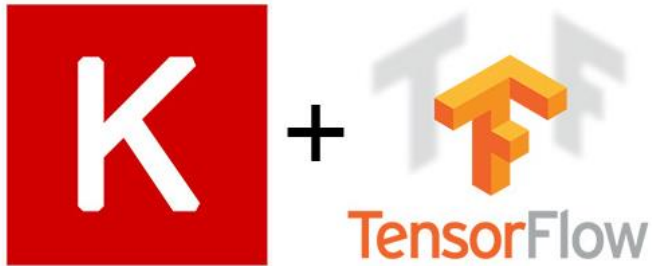
# Context Gating Module



# Proposed Approach



# Training Pipeline



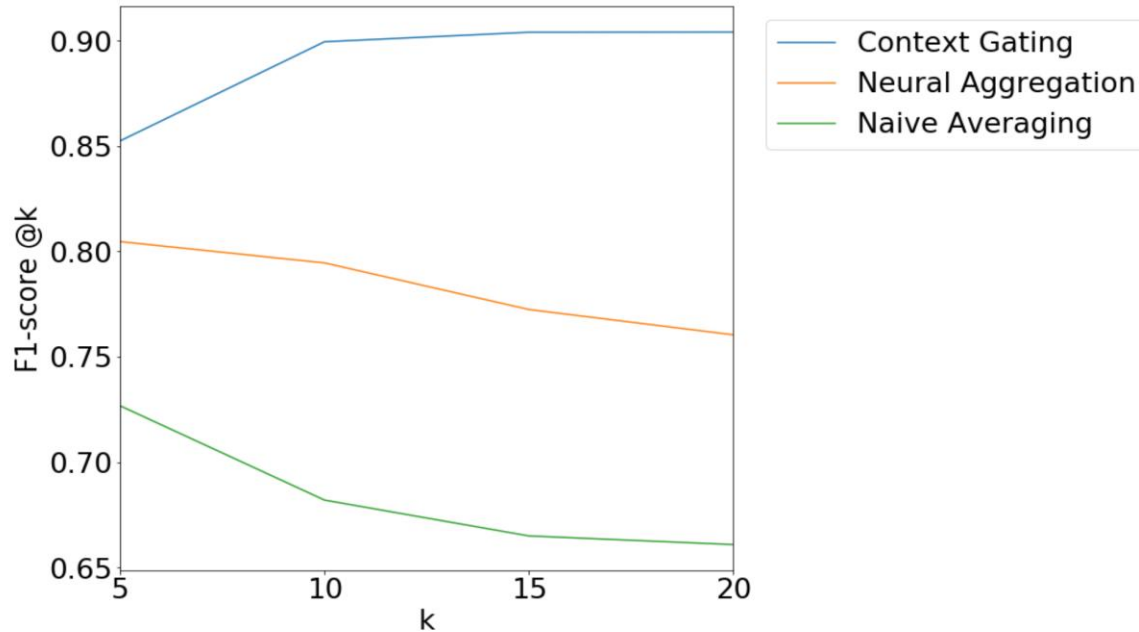
# Dataset

547700 entries  
66519 unique users  
28237 unique items  
1000 categories



“Amazon Products”

# Dependence of F1-measure on the number of recommendations $k$



# Recall@k and Precision@k for different aggregation strategies

<b>k</b>	<b>Aggregation</b>	<b>Recall @k</b>	<b>Precision @k</b>
5	Average	0.704867	0.749925
	Neural Aggregation	0.772574	0.839458
	Neural Aggregation + Context Gating	<b>0.792203</b>	<b>0.922438</b>
10	Average	0.797340	0.595867
	Neural Aggregation	0.901716	0.710123
	Neural Aggregation + Context Gating	<b>0.91846</b>	<b>0.881151</b>
15	Average	0.815469	0.561431
	Neural Aggregation	0.932418	0.710123
	Neural Aggregation + Context Gating	<b>0.942565</b>	<b>0.868210</b>
20	Average	0.820141	0.553453
	Neural Aggregation	0.943513	0.636783
	Neural Aggregation + Context Gating	<b>0.947498</b>	<b>0.864384</b>



# Conclusions:

- 1 The neural aggregation with context gating outperforms the naive averaging method by up to 34%

# Future work:

- 1 Mobile recommender system
- 2 Comparing the performance of the proposed approach with traditional recommender system







Thank you!