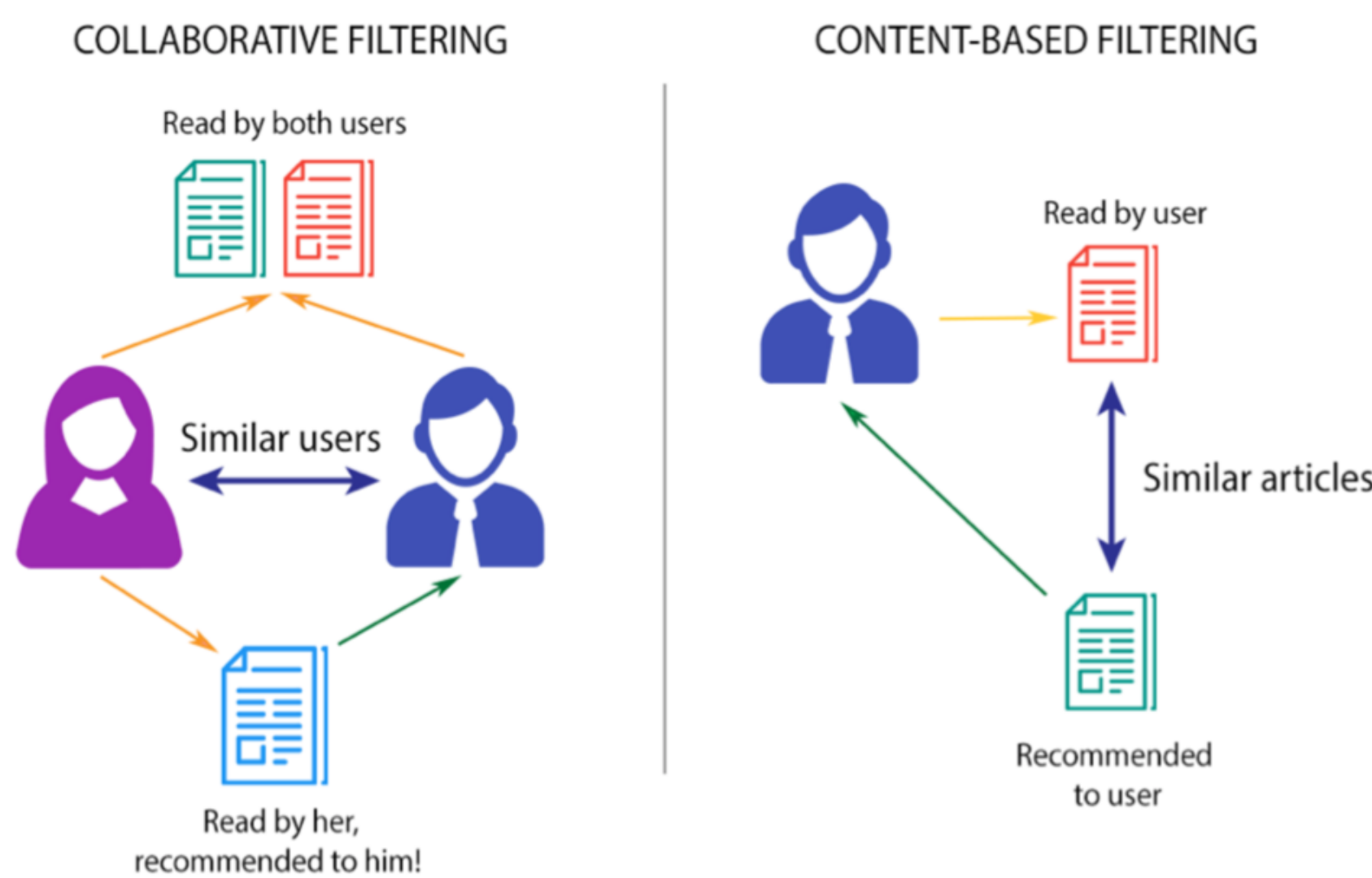


Ensemble of libfm and xlearn for Item Recommendation

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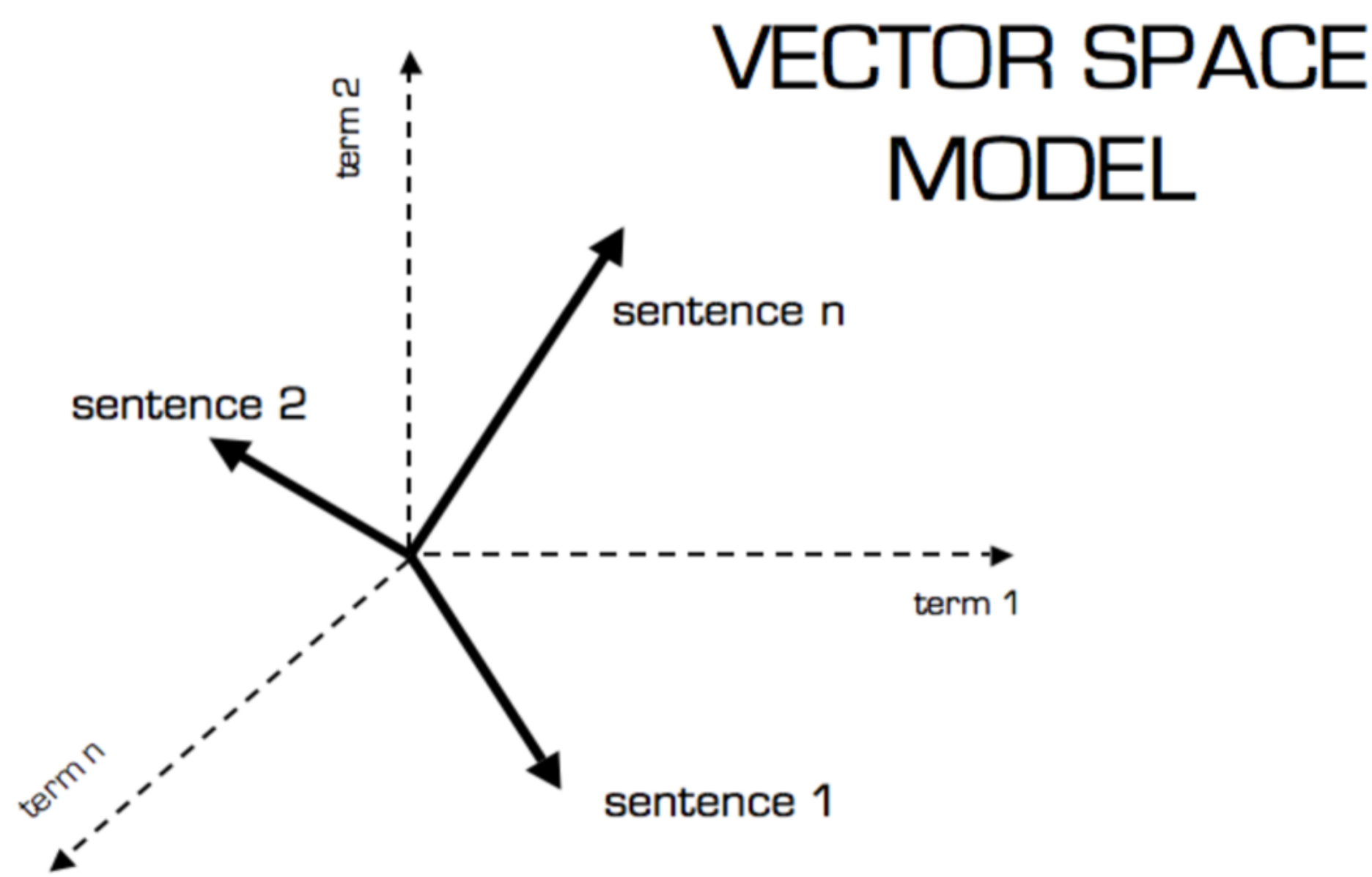
Background

General idea for movie recommendation
approach 1: recommend movies that similar uses are fond of
approach 2: recommend movies that are similar to movies the user has watched and given a positive respond



Vector Space Model

Set up a vector space model and each dimension of it stands for a feature. Training the model using machine learning.



Model

Libfm

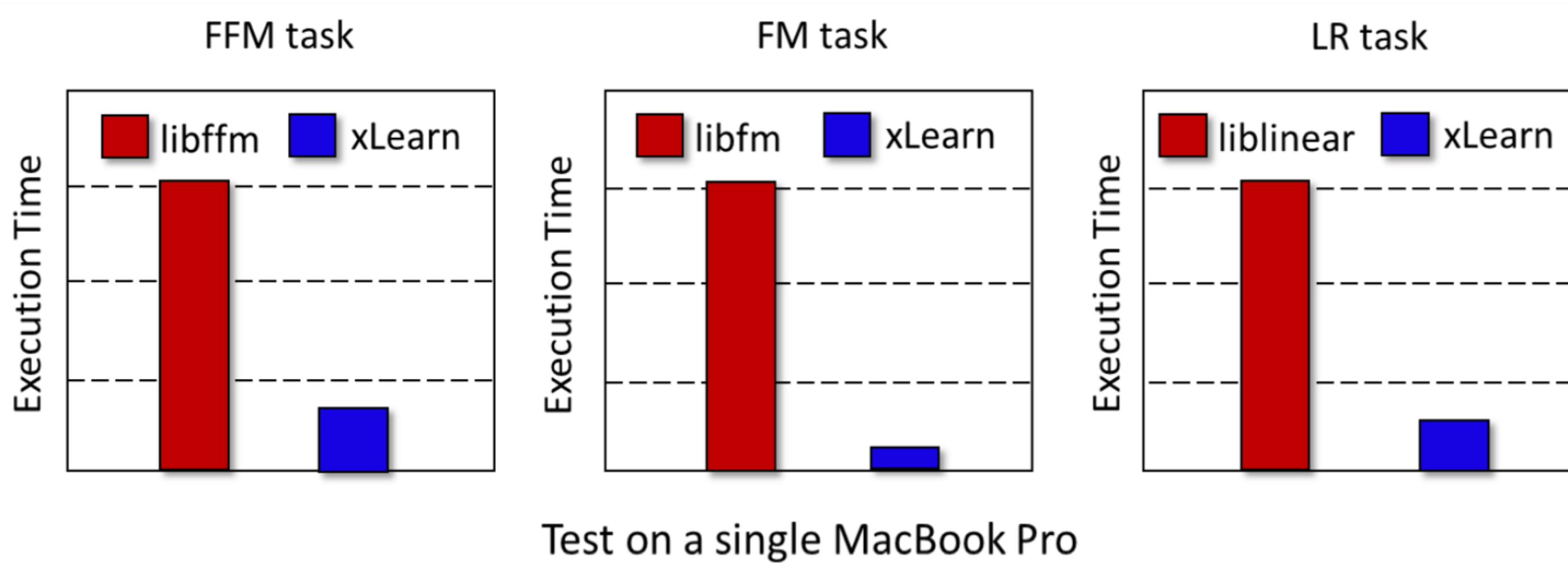
Libfm is a software implementation for factorization machines that features stochastic gradient descent (SGD) and alternating least squares (ALS) optimization as well as Bayesian inference using Markov Chain Monte Carlo (**MCMC**). Here is a example of how libfm works.

Feature vector \mathbf{x}																	Target \mathbf{y}					
x_1	1	0	0	...	1	0	0	0	...	0.3	0.3	0.3	0	...	13	0	0	0	0	...	5	y_1
x_2	1	0	0	...	0	1	0	0	...	0.3	0.3	0.3	0	...	14	1	0	0	0	...	3	y_2
x_3	1	0	0	...	0	0	1	0	...	0.3	0.3	0.3	0	...	16	0	1	0	0	...	1	y_3
x_4	0	1	0	...	0	0	1	0	...	0	0	0.5	0.5	...	5	0	0	0	0	...	4	y_4
x_5	0	1	0	...	0	0	0	1	...	0	0	0.5	0.5	...	8	0	0	1	0	...	5	y_5
x_6	0	0	1	...	1	0	0	0	...	0.5	0	0.5	0	...	9	0	0	0	0	...	1	y_6
x_7	0	0	1	...	0	0	1	0	...	0.5	0	0.5	0	...	12	1	0	0	0	...	5	y_7
A B C ... User				TI NH SW ST ... Movie				TI NH SW ST ... Other Movies rated				Time		Last Movie rated								

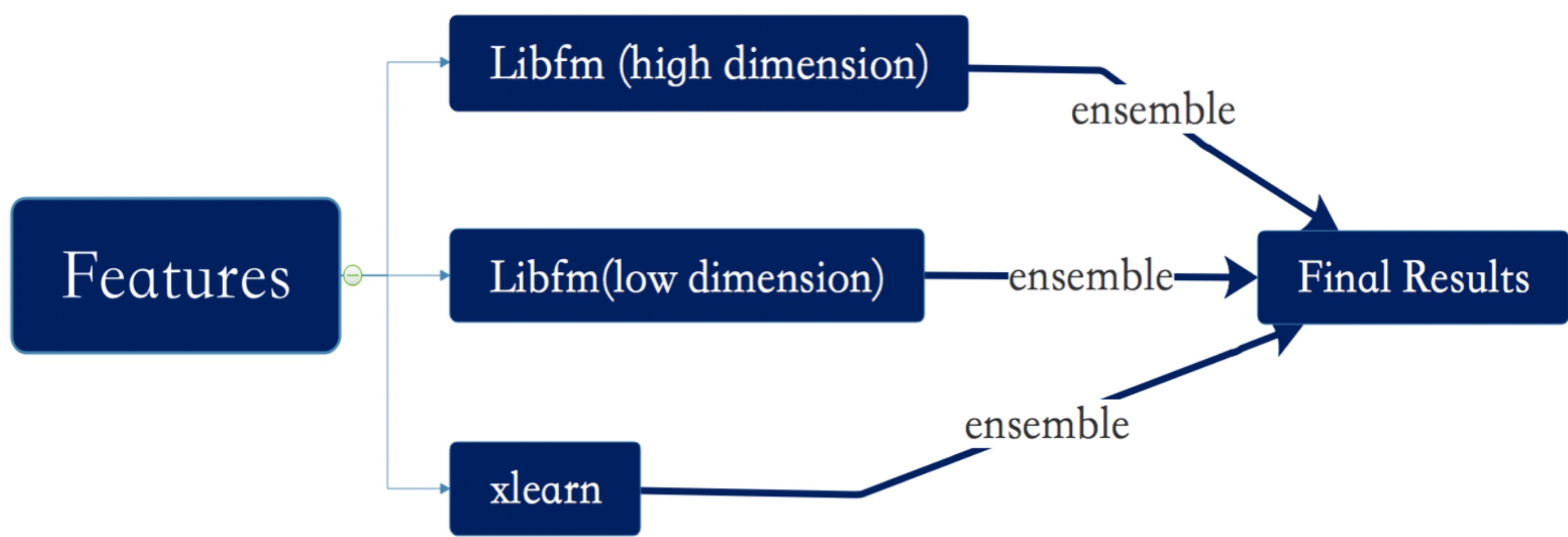
Xlearn

Xlearn is a high performance, easy-to-use, and scalable machine learning package, which can be used to solve large-scale machine learning problems. It is possible alternation of libfm.

The training speed of xlearn is much faster than libfm.



My Approach



Feature Select

- User feature: user ID
- Item feature: the elements in the movie, for instance, whether it is a comedy, fiction movie, documentary, etc.
- Time feature: date & time

Train Model

- a = the output of low dimension libfm model
- b = the output of high dimension libfm model
- c = the output of xlearn model

Final Result

$$\text{output} = \frac{a + b + c}{3}$$

Results

Model	Score	Rank
ensemble of Libfm and xlearn	29.79887	3/35
ensemble of Libfm with different dimensions	30.50439	23/35
Libfm	30.96461	31/35
xlearn	30.81886	29/36

It turns out that :

- Whether we use libfm and xlearn, a sigle model is not enough to fully illustrate the recommendation system.
- The ensemble of libfm models with different parameters works better than a single model, but is still not good enough.
- Calculate the ensemble with libfm and xlearn and get the best result, which rank 3 in the final test.

#	Δpub	Team Name
1	—	Au Revior~
2	—	Zhanghao Wu
3	—	Haoyan