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Abstract

1 Player modelling methods are commonly seen in video games. Such methods
2 are implemented to improve players' user experience. Other than being popular
3 in video games, player modelling methods can also be used for recommender
4 systems. Users are being modelled by such methods so that a corresponding item
5 can be recommended to the user based on his/her user type.

1 Introduction

7 Have you ever wondered, why can't you find the best music on Spotify? Or the most interesting
8 book on Amazon? Or the finest hotel in the city of New York? In today's world, we want the service
9 we get from the service providers (no matter online or offline) to be tailored to our interests, which
10 means the services these days better to be personalized to amaze the customers. This is why recom-
11 mendation systems are crucial in such business applications.
12 For this project, I have implemented a player modelling algorithm called *NMF* for a hotel recom-
13 mendation problem.

14 2 Non-negative Matrix Factorization (NMF)

15 Introduction to NMF

16 *NMF* is a matrix factorization algorithm which factorize a big matrix $V(m \text{ by } n)$ into two smaller
17 matrices $W(m \text{ by } r)$ and $H(r \text{ by } n)$.

$$V \approx W \times H$$

19 For each column v_i in V , we have

$$v_i \approx W \times h_i$$

21 where h_i is the corresponding column in H , in other words, every column in V is a linear combi-
22 nation of W where H is the coefficient matrix. Geometrically, *NMF* projects the data points in
23 higher dimensional space to the lower dimensional space formed by the basis vectors in W , and H
24 contains the projected coefficients.

25 To integrate the theory with the context, matrices are commonly seen in recommendation problems,
26 with columns and rows being users and the corresponding items. When *NMF* factorizes such a
27 matrix into W and H , the columns in W contains the hidden features of the original matrix. Each
28 basis vector in W can be viewed as basic user type, every user therefore is represented as a linear
29 combination of such basic user types which are .

$$u = a_1 w_1 + a_2 w_2 + \dots + a_r w_r$$

31 where u is a single user and a_i s are the coefficients. Besides, such user-item matrices are usually
32 sparse (with high percentage of missing values), *NMF* with EM algorithm can reconstruct the origi-
33 nal matrix by filling out the missing values.

34 Here is an example of how *NMF* works, the number of basis was set to be 100(which might not be
35 optimal in this case):

36 **Acknowledgement**

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