# Checking algorithm

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After I check algorithm, I find the result in my previous note and what I reported on last week's meeting is not wrong, but in a extreme case. I'll explain in this note.

In following setting, U is ground truth, i.e. logit (tensor).

### 1 Unsupervised

I dig into the condition and some issue I ran into last week, and I find something interesting.

The erratic pattern shows because of the generated value I set. This is basically how I generated values in simulation.

```
whole_shape = rep(20,3) ; core_shape = rep(4,3)
d1 = whole_shape[1] ; d2 = whole_shape[2] ; d3 = whole_shape[3]
r1 = core_shape[1] ; r2 = core_shape[2] ; r3 = core_shape[3]

####----- generate data
set.seed(37)
A = randortho(d1)[,1:r1]
B = randortho(d2)[,1:r2]
C = randortho(d3)[,1:r3]

### G: sd = 1
G = as.tensor(array(data = rnorm(r1*r2*r3,sd = 1),dim = core_shape))
U = ttl(G,list(A,B,C),ms = c(1,2,3))@data

ts = rbinom(d1*d2*d3,1,prob = as.vector( 1/(1 + exp(-U)) ))
ts = as.tensor(array(ts,dim = c(d1,d2,d3)))@data
```

The different G(core tensor) result in different result. I use rnorm to generate data, and all the elements in G is Gaussian with mean zero.

#### 1.1 sd = 1

When I set sd = 1, the results are not ideal.

It might because sometimes I think it converge, but actually it didn't. (Since the improvement for logLik for each update may not show a monotone deceasing trend when updating times increasing). To make sure I set updating times up to 100. The logLik is shown like:

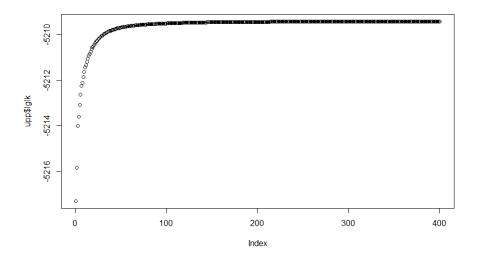


Figure 1: logLik

I plot one of the slices of the U and U-hat (they basically shows all the same pattern). It shows a erratic pattern. Like this:

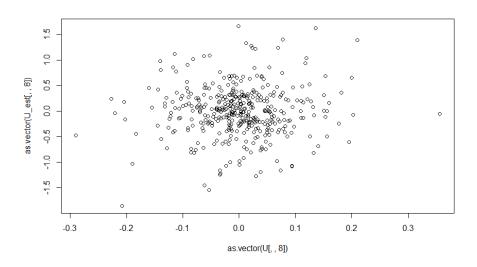


Figure 2: U slice in real value

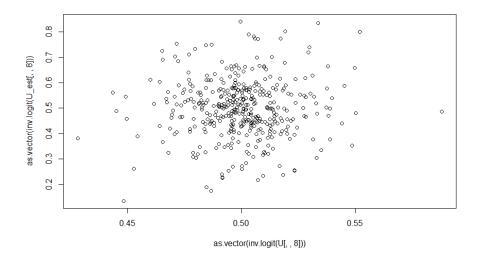


Figure 3: U slicer in logic scale

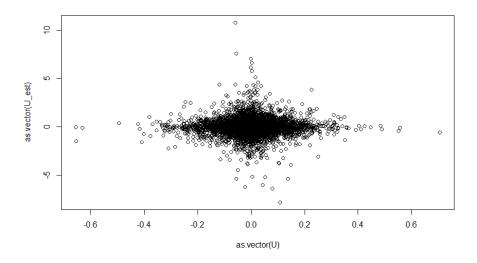


Figure 4: U tensor in real scale

### 1.2 sd = 10 or 20

I plot one of the slices of the U and U-hat(they basically shows all the same pattern). It makes more sense. Like this:

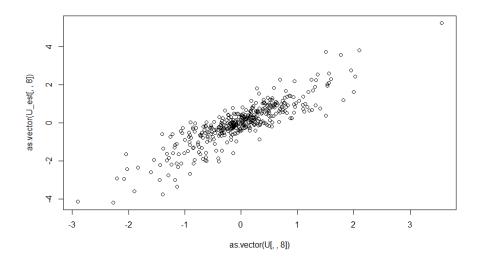


Figure 5: U slice in real value

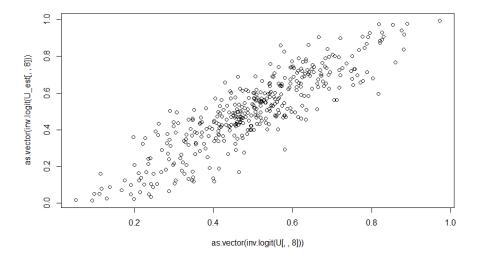


Figure 6: U slicer in logic scale

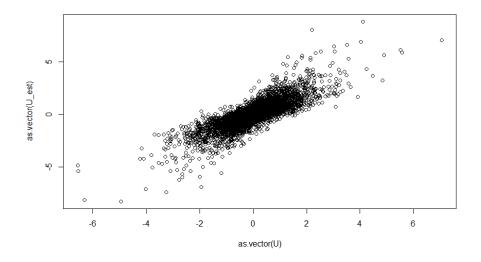


Figure 7: U tensor in real scale

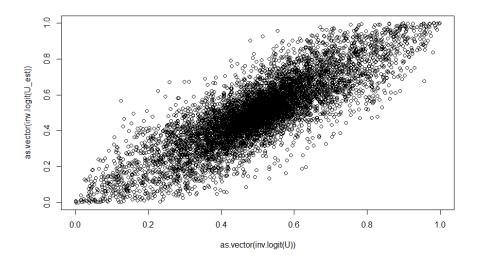


Figure 8: U tensor in real scale

And under this condition, logLik shows it converges faster than sd=1.

### 1.3 sd = 100

I plot one of the slices of the U and U-hat(they basically shows all the same pattern). It's more erratic than sd=10 or 20. And MSE is higher, say 1961873(idea case would be 4000

6000). The case is still convergent(by logLik). But I think the result is OK, the bad MSE it's just because more noise. Since the slices comparison makes sense, as shown below:

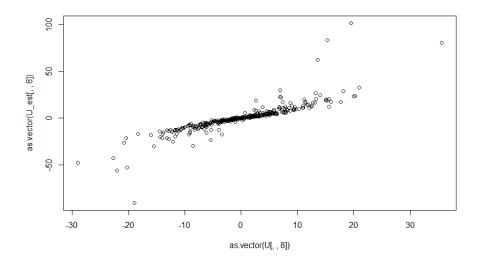


Figure 9: U slice in real value

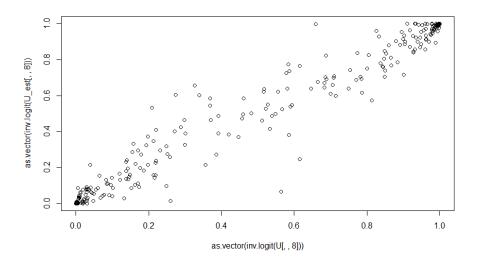


Figure 10: U slicer in logic scale

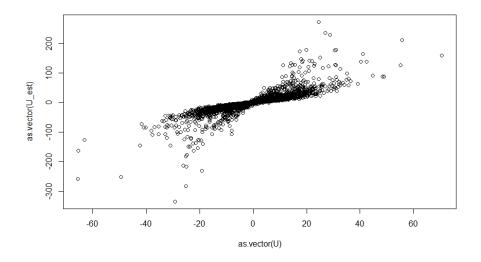


Figure 11: U tensor in real scale

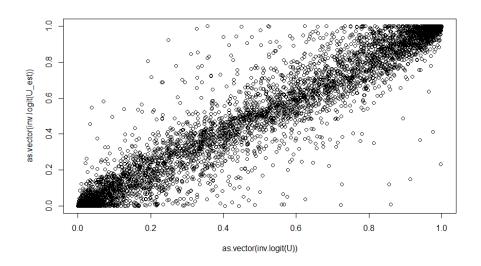


Figure 12: U tensor in real scale

#### 1.4 Uniform distribution to Generate core tensor

Then I set runif to generate core tensor.

### 1.4.1 [0,1]

When I set unif[0,1], the results are not ideal.

It might because sometimes I think it converge, but actually it didn't. (Since the improvement for logLik for each update may not show a monotone deceasing trend when updating times increasing). To make sure I set updating times up to 100. The logLik is shown like:

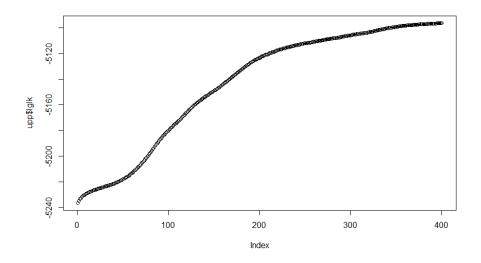


Figure 13: logLik

The MSE of U-hat is 2.930119e+19.

I plot one of the slices of the U and U-hat(they basically shows all the same pattern). It shows a erratic pattern. Like this:

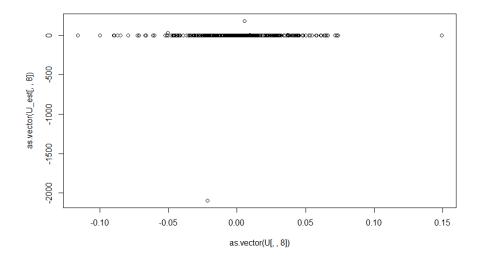


Figure 14: U slice in real value

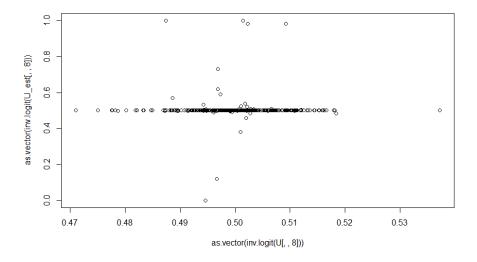


Figure 15: U slicer in logic scale

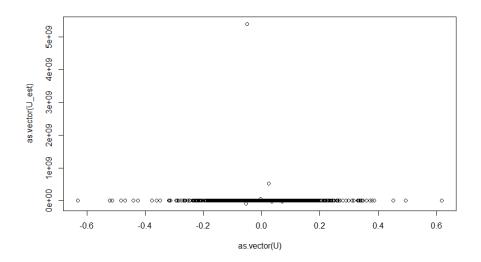


Figure 16: U tensor in real scale

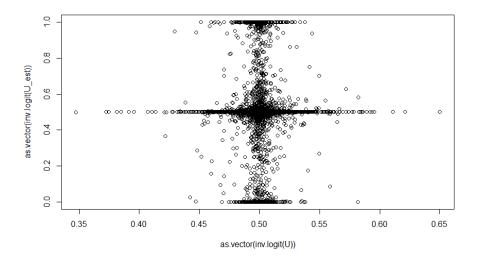


Figure 17: U tensor in log scale

### $1.4.2 \quad [-10,10]$

When I set uniform to be [-10,10], it basically shows the same result as rnorm(0,10), except relatively lower convergence than Gaussian case.

### 1.5 Check with initialization

In this case, it shows the same as the result without initialization. (The result is in my previous note [Check\_Algorithm\_and\_some\_Evidence\_Theory])

## 2 Supervised

Still, I set

$$d_1 = d_2 = d_3 = 20$$
$$r_1 = r_2 = r_3 = 2$$

First I start with simple version, I set covariate matrix to be diag(20), identity matrix with 20 rows/columns.

Then the supervised(U-hat1) and unsupervised(U-hat2) should have same result.

The Frobenious norm of two U-hats is 8.088389e-05.

The tensor of U-hat1 and U-hat2 is:

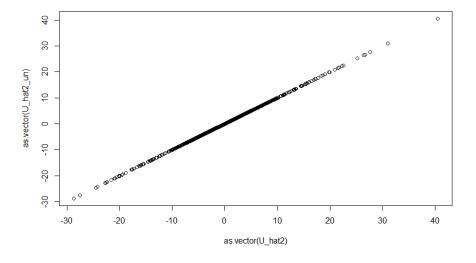


Figure 18: 2 U-hat tensor in real scale

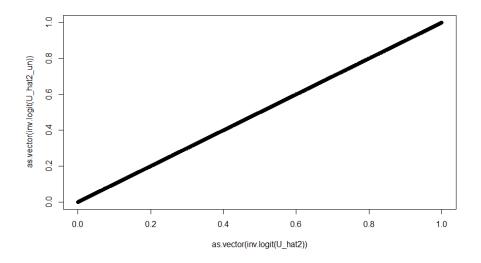


Figure 19: 2 U-hat tensor in log scale

The comparison of one of factor matrix is(others are the same):

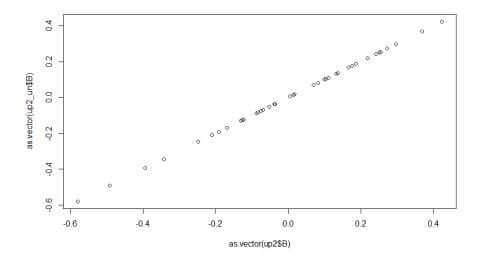


Figure 20: 2 factor matrices

The comparison of core tensor is:

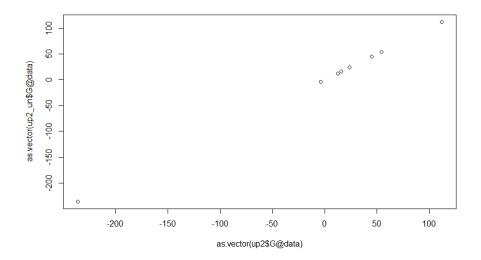


Figure 21: core tensor