

Finaally...Let there be bars

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0) Key Words

1. Light-version: of Split-Restaurant and Split-Dish for more runs
2. Full-version: of Split-Dish and Split-Dish for robustness
3. Split-Dish-All/Further: Bigger moves for Split-Dish
4. Mixing Process: Better mixing Iterations between Split-Restaurant and Split-Dish for faster "convergence"
5. Small Tricks: some little modifications for better split and merge moves.

1) Pseudocode

For Initialization:

Table Config is the key.

Aim: Since dish config is vague, it is wise to just split Restaurant into smaller tables for later reconstruction.

For Search:

Dish Config is the key.

Aim: Since table config is local, it is wise to focus on better Dish Config across restaurants.

(I) SCHEME

(a) Initialization:

1 table and 1 dish per restaurant

Repeat several times:

- (1) Run Split-Restaurant(Full-version)[accept]
- (2) Run Split-Dish(Light-version)[accept](random Dish k)

(b) Search:

Repeat several times:

- (1) Run Split-Restaurant(Light-Version)[accept/reject](random Restaurant j)
- (2) Run Split-Dish(Full-Version)[accept/reject](random Dish k)
- (3) (Occasionally)Run Split-Dish-All[accept/reject]

- (4) (Occasionally)Run Split-Dish-Further[accept/reject](random Dish k)

(II) Split-Restaurant

- (a) Light-Version[Decision](j)
 - (1) In random order,Split all tables in j using 2-means++(producing $2m_j$. initial tables)
 - (2) Run TKM search(Local Search table/dish+Merge table)
 - (3) Decision for the new config
- (b) Full-Version[Decision]
 - (1) For $j=\text{randperm}(J)$
 - (2) In random order,Split all tables in j using 2-means++(producing $2m_j$. initial tables)
 - (3) Run TKM search(Local Search table/dish)
 - (4) Decision for the new config
 - (5) End

(III) Split-Dish

- (a) Light-Version[Decision](k)
 - (1) In random order,Split all tables in dish k using 2-means++(producing $2m_{.k}$ initial tables)
 - (2) Split dish k using 2-means++
 - (3) Run TKM search(Local Search table/dish)
 - (4) Decision for the new config
- (b) Full-Version[Decision](k)
 - (1) In random order,Split all tables in dish k using 2-means++(producing $2m_{.k}$ initial tables)
 - (2) (Multiple Runs)Split dish k using 2-means++
 - (3) (Multiple Runs)Run TKM search(Local Search table/dish+merge dish)(?merge table)
 - (4) Decision for the new config
- (c) All-Version[Decision]
 - (1) For $k=\text{randperm}(K)$
 - (2) if($k \leq \text{length}(\text{dishes})$)
 - (3) Light-Version Split-Dishes[accept](k)
 - (4) End
 - (5) End
 - (6) (Multiple Runs)Run TKM search(Local Search table/dish+merge dish)
 - (7) Decision for the new configuration
- (d) Further-Version[Decision](k)
 - (1) Full-Version Split-Dishes[accept](k)
d1,d2 are the dishes that the splitted dishes are assigned to
 - (2) If($d1 \neq d2$)
 - (3) Further-Version Split-Dishes[accept](d1)
 - (4) Further-Version Split-Dishes[accept](d2)
 - (5) End
 - (6) (Multiple Runs)Run TKM search(Local Search table/dish+merge dish)
 - (7) Decision for the new configuration



Figure 1: 40 Restaurants

(IV) **TKM** While log probability does not increase any more:

- (1) Local Search Tables(For chosen restaurants)
- (2) Local Search Dishes(For chosen dishes)
- (3) Merge Tables(For chosen restaurants)
- (4) Merge Dishes(For chosen dishes)

(V) **Small Tricks**

- (1) Merge Dish:
 - (i) Previously: Simply Merge two dishes without changing table config
 - (ii) Better: Given Dish config \vec{k}_{jt} (k-term fixed), it is better to merge tables (belong to dish k) in the same restaurant to further decrease -log Probability.
- (2) Split table:
 - (i) Previously: 2-means++ allows new tables to have new/previous dishes
 - (ii) Better: During Search, in order to split "sticky" table/dish, it is better not to allow them assigned to new/previous dishes.
- (3) Split dish: (similar to Split table)

2) Experiment

i) Settings

40 Restaurants, 10 bars

ii) Initialization

Run 5 times:Split-Restaurant(Full-Version) + Split-Dish(Light-Version)

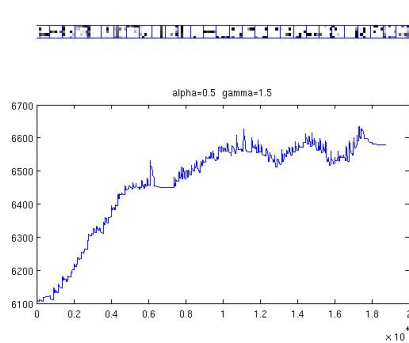


Figure 2: 5 runs:Dish Config and -log Probability

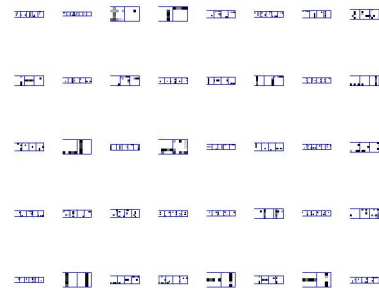


Figure 3: 5 runs:Table Config for 40 restaurants

iii) Search

Outline:

1. **Scheme 1:Split-Restaurant:Split-Dish=1:1**
2. **Scheme 2:Split-Restaurant:Split-Dish=5:1**
3. **Bigger Moves:Split-Dish(All-Version)+(Further-Version)**

1) For $j=\text{randperm}(J)$

1. Split-Restaurant(Light-Version)
2. Split-Dish(Full-Version)

End

Two variants:

- a)Split-Dish(Full-Version) with merge tables in TKM
- b)Split-Dish(Full-Version) with merge tables in TKM

Conclusion:

I tried several runs and found a) in the beginning tends to create single table for the restaurant since the dish config is still vague(t-term dominates).

Below are the typical examples.

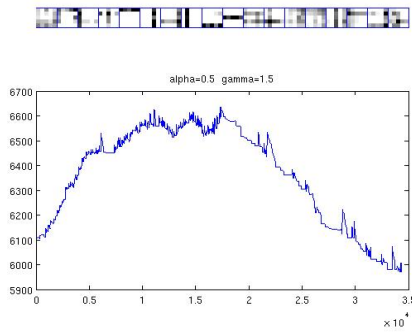


Figure 4: a) with merge table: Dish Config and -logProbability

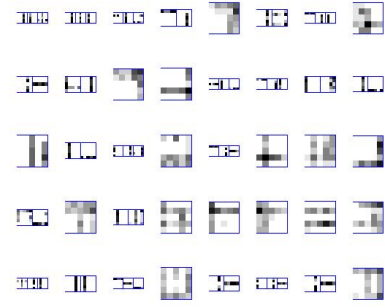


Figure 5: a) with merge table: Table Config for 40 restaurants

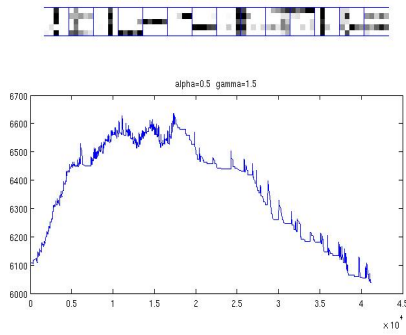


Figure 6: b) without merge table: Dish Config and -logProbability

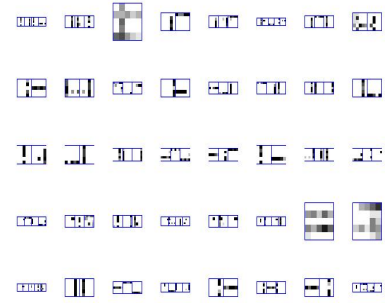


Figure 7: b) without merge table: Table Config for 40 restaurants

2) Since Split-Dish(Full-Version) is expensive and may not benefit much from one Split-Restaurant(Light-Version), we may try the mixing process below: (No merge table during TKM in Split-Dish(Full-Version))

For Iter=1:5

count=1;

For j=randperm(J)

1. Split-Restaurant(Light-Version)

2. If(mod(count,5)==0)
Split-Dish(Full-Version)
End

3. count=count+1;

End

End

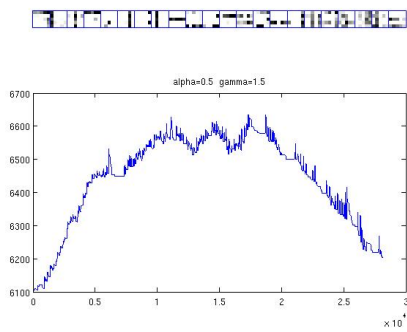


Figure 8: Iter 1:Dish Config and -log Probability

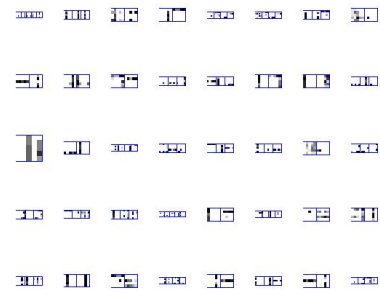


Figure 9: Iter 1:Table Config for 40 restaurants

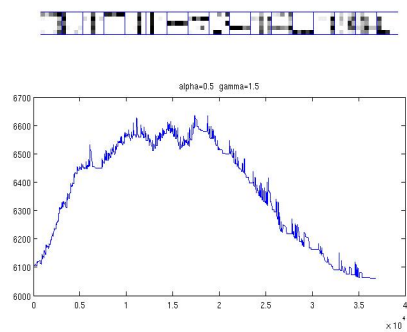


Figure 10: Iter 2:Dish Config and -log Probability

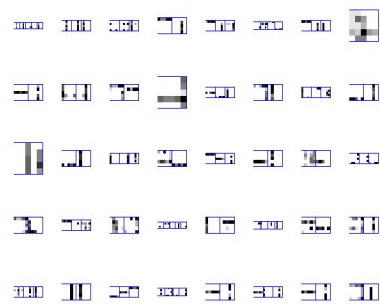


Figure 11: Iter 2:Table Config for 40 restaurants

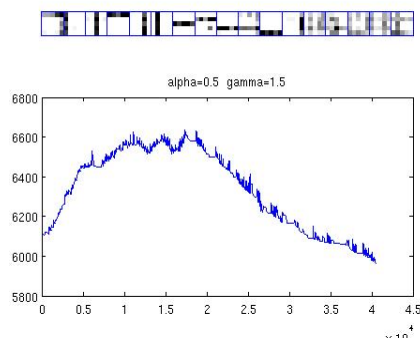


Figure 12: Iter 3:Dish Config and -log Probability



Figure 13: Iter 3:Table Config for 40 restaurants

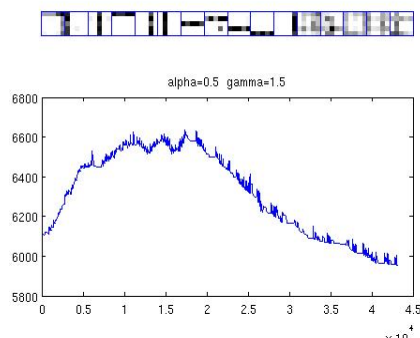


Figure 14: Iter 4:Dish Config and -log Probability

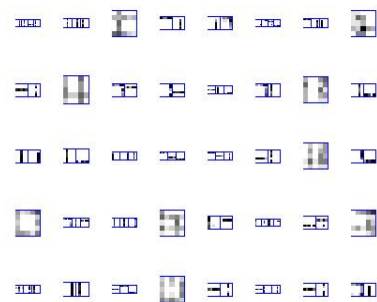


Figure 15: Iter 4:Table Config for 40 restaurants

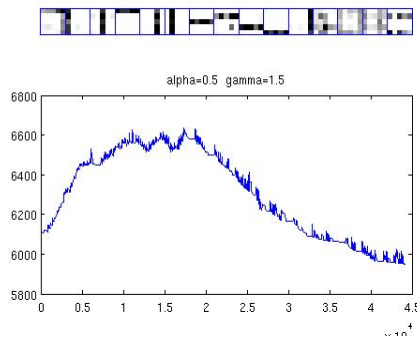


Figure 16: Iter 5:Dish Config and -log Probability

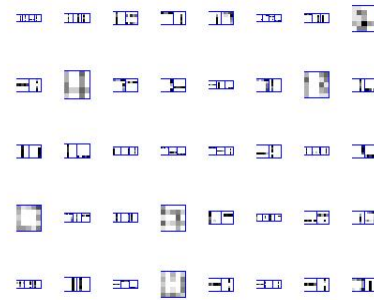


Figure 17: Iter 5: Table Config for 40 restaurants

3) From Above, though we roughly figure out 10 true bars, the noisy dishes refuse to be "explained" by them.

The reason is manifold:

1. Some of the true bars are not "strong enough": though splitting one noisy dish decreases k-term, the t-term increases more.
2. The noisy dish is composed of more than two bars, thus split it into two components may not be better than leave it alone.

Possible Solutions:

1. Split-Dish-All: though split one noisy dish may be weak, we can wait and accumulate them. In the end, it may be profitable.
2. Split-Dish-Further: Split-Dish(Full version)(k) + Split-Dish(Further version)(d1, d2)
(p.s. we expect true bars won't be bothered by it: true bars may not be well explained by two other dishes, thus 2-means++ will assign)

Thus, we have following Scheme:

While -log probability cannot decrease any more


```
count=1;
For j=randperm(J)
    1. Split-Restaurant(Light-Version)[accept/reject](j)
    2. If(mod(count,5)==0)
        Split-Dish(Full-Version)[accept/reject]
        End
    3. count=count+1;
End
Split-Dish(All-Version)[accept/reject]
Split-Dish(Further-Version)[accept/reject](random k)
End
```

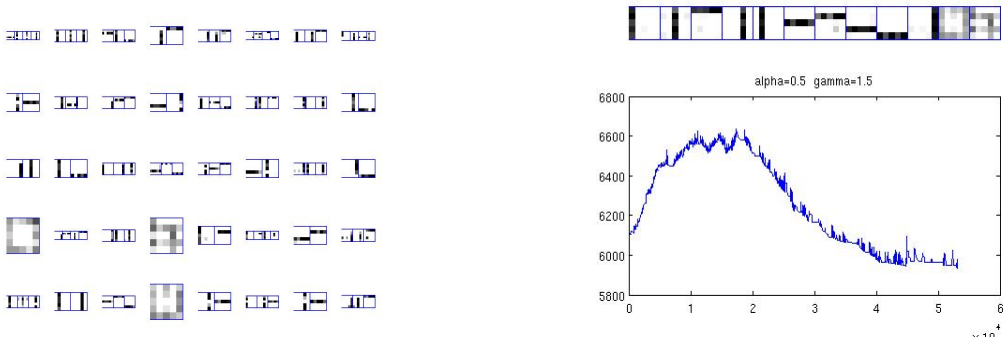


Figure 18: Iterations with Split-Dish(All-Version) only
Figure 19: dish config for Fig 18:The last 2 dishes are problematic

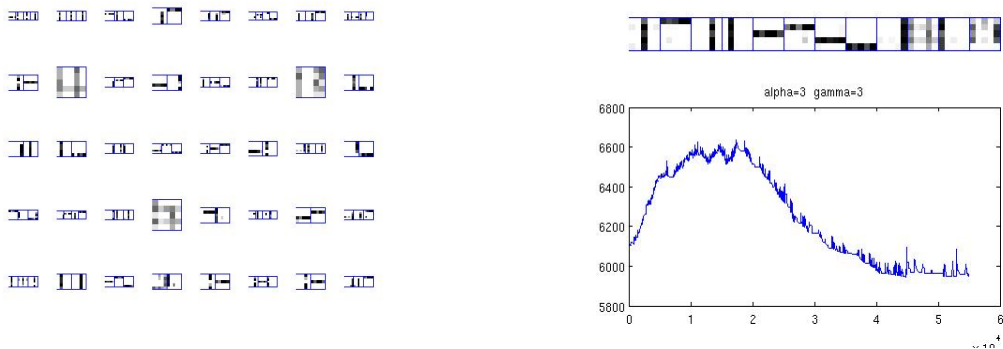


Figure 20: +Split-Dish(Further-Version):Get out of stuck while introducing new noise
Figure 21: dish config for Fig 20:alleviate the problem by introducing new dishes

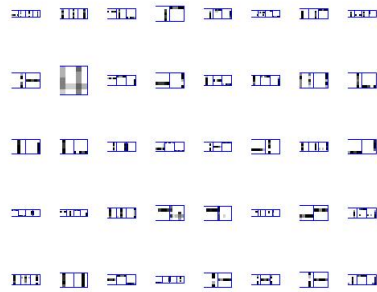


Figure 22: +Split-Dish(Further-Version): get rid of the last dish

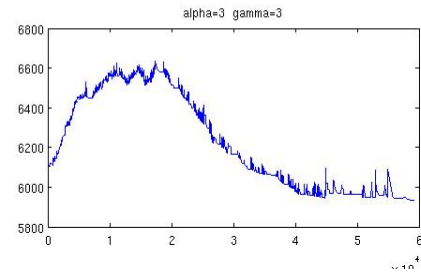


Figure 23: dish config for Fig 20:ALMOST THERE

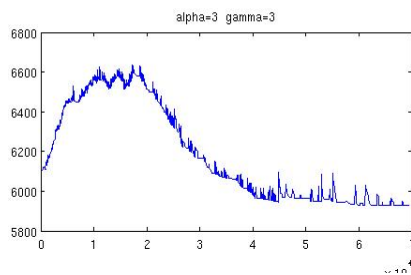


Figure 24: +Split-Dish(All-Version): One more try



Figure 25: dish config for Fig 22:Closer

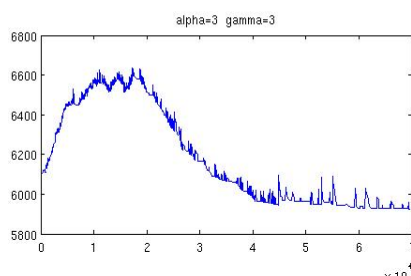


Figure 26: +Split-Restaurant



Figure 27: dish config for Fig 24:Finally...