Complexity Analysis

Donglai Wei

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0.Notation

Restaurant-Level:

L-c:Local customer move, find the best table for a customer given others fixed L-t:Local table move, find the best dish for a table given others fixed M-t:Merge table move, merge two tables DR:Decompose Restaurant

Dish-Level:

L-d: Local word move, reallocate the words distribution in a dish given others fixed M-d:Merge dish move, merge two dishes DD:Decompose Dish

 $m_{.k}$ is the number of tables in dish k $m_{j.}$ the number of tables in Restaurant j $n_{jt.}$ the number of customers in Restaurant j table t $n_{j..}$ the number of tables in Restaurant j

 $n_{..k}$ the number of customers in dish **k**

 $n_{...k}^w$ the number of tables in dish k with word w.

Method	Complexity
L-c	$\mathcal{O}(n_{j}m_{j.})$
L-t	$\mathcal{O}(Km_{j.})$
M-t	$\mathcal{O}(m_{j.}^2)$
DR	$\mathcal{O}((m_{j.} + K^2)n_{j} + (K + m_{j.})m_{j.})$
L-d	$\mathcal{O}(n_{k}^w + m_{})$
M-d	$\mathcal{O}(K^2)$
DD	$K * [\mathcal{O}(L-d) + \mathcal{O}(M-d)] + m_{} * \mathcal{O}(DR)$

J restaurants, K dishes, L:log-probability(K-term+T-term)

1) Restaurant-level

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1.1) local-merge move
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Local-Customer: \mathcal{O}(m_{j.}^2 \frac{n_{j..}}{m_{j.}}) = \mathcal{O}(n_{j..} m_{j..})
Local-Table: \mathcal{O}(m_{j.}K)
Merge-Table: \mathcal{O}(m_i^2)
While L doesn't increase any more:
      %a)Local-Customer:
          For t_1=Randperm(m_{j.}):
                For t_2=Randperm(m_{i.} \setminus t_1):
                    While local move can be made:
                            Greedily move one customer at a time from t_1 to t_2 if the move increases L'(T)
                    End
                End
          End
       %b)Local-Table:
          For t_1=Randperm(m_i):
               Assign t_1 to the dish which increase L most(allow it to have new dish)
          End
       %c)Merge Table:
          For t_1=Randperm(m_i):
               Merge table t_1 to the table in j with the best dish k, which increase \mathbf{L}'(\mathbf{T}) most
               \%if cannot increase L'(T), then leave it alone
          End
End
1.2) Decompose restaurant
Initialization: \mathcal{O}(n_{j..}K^2) (#proposed table\proptoK)
Local-Merge Moves in (1.1): \mathcal{O}(m_{j.}n_{j..}) + \mathcal{O}(m_{j.}K) + \mathcal{O}(m_{j.}^2)
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%a) Initialization
Make Restaurant j into one table t_0 where customers following uniform distribution
\%(P(t_{ji} = t_0) = \frac{1}{W})
Possible Dish={Nonempty \ dishes} \ k_0
While Possible Dish is not empty:
        For each dish k \in Possible Dish:
             For each customer i in t_0:
                  sample t_{\mathrm{ji}} \in \{t_{\mathrm{0}}, t_{\mathrm{k}}\} \sim \{\frac{1}{W}, \frac{n_{\mathrm{i.k}}^{\mathrm{W}} + \phi}{n_{\mathrm{i.k}} + W\phi}\}
       Propose to form table t_{\mathtt{k}} with customers whose t_{\mathtt{ji}} = t_{\mathtt{k}}
        Calculate the change d_{\mathbf{k}} for k-term and w-term:
        \%Sample a proposal t_{\mathbf{k}*} according to the weight and make the new table:
       Sample a proposal \{t_{\mathbf{k_1}},...,t_{\mathbf{k_K}}\} \sim \ e^{\mathbf{r_{proposal}}\{\mathbf{d_{k_1}},\ldots,\mathbf{d_{k_K}}\}}
        \%r_{	t proposal} > 0 , the more decrease of d_{	t k} , the less propable to form table t_{	t k}
        Possible Dish=Possible Dish\setminus k_*
        t_0 = t_0 \setminus t_{\mathbf{k}_*}
End
If there are still customers left in t_0:
   make it a new table with a new dish K+1
End
\%b)Refinement for Restaurant j(Local-Search and Merge Move for tables in Restaurant j)
LM-Restaurant(j,T)
%c)Decision
Calculate the change of L between present Restaurant j config and its previous config:
\Delta L' = \Delta k - term + T\Delta t - term + \Delta w - term
If (\Delta L' < 0):
     Accept the new configuration
Else:
     Restore Previous Config
End
2) Dish-level
2.1) Local-Dish
Find promising dishes: \mathcal{O}(m_{\perp})
Find the best approximated Reallocation of word w: \mathcal{O}(n_k^w)
In all: \mathcal{O}(n_{k}^{w} + m_{..})
Dish List={Nonempty \ dishes} \ k
For w=Randperm(Words Occur in Dish k):
     \%i) Find promising dishes(appear most often with the tables having word w in dish k)
     For kk=Dish List
          Restaurant_index(kk)=index of restaurants in dish kk, that have tables serving dish k
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Restaurant_count(kk)=length(Restaurant_index(kk))
    End
    Promising_Dishes=find(Restaurant_count==max(Restaurant_count))
    %ii) Find the best approximated Reallocation of word w:
    \Delta L=0;
    For kkk=Promising_Dishes:
          %a)Naive Reallocation:
        For j=Restaurant_index(kkk)
             Assign all of words w from the table serving dish k to the table serving dish kkk
        End
        Calculate the change of L between present config and previous config:l_0
        %b)Gready Search:
         \Delta l=1
        While \Delta l>0
               \Delta l_{
m k}=change of L by assigning one word w from dish kkk back to dish k
               \Delta l_{
m t}=max change of L by assigning one word w from dish kkk back to dish k in Restaurant j
               \Delta l = \Delta l_k + \Delta l_t
        End
         \Delta L = max(\Delta L, l_0 + \Delta l)
    End
    %iii)Decision:
    If \Delta L>0
        Accept new config
    Else
        Restore previous config
    End
End
2.2) Merge-Dish
Merge-Dish: \mathcal{O}(K^2)
Dish List=\{Nonempty \ dishes\} \setminus k
While Dish List is not empty:
    Randomly pick a dish k \in Dish List
    Dish List=Dish List\k
    Merge dish k to the dish\in Dish List which increase \mathbf{L}'(\mathbf{T}) mostly
    \%\mbox{if cannot increase L'(T), then leave it alone}
End
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2.3) Decompose Dish

Initialization: $m_{.k}\mathcal{O}(DR)$

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\textbf{Local-Merge Move:} \mathcal{O}(n^w_{..k} + m_{..}) + \mathcal{O}(K^2)
In all, Decompose Dish: K * [\mathcal{O}(L-d) + \mathcal{O}(M-d)] + m_... * \mathcal{O}(DR)
For k=Randperm(K)
   \% a) Initialization: \ Reconfig \ without \ Dish \ k
       For j=restaurants which have tables serving dish k
            Decompose Restaurant(j,Temperature,k);
       End
   \%b)Merge\ new\ proposed\ dishes + Local - Dish
       For k=new proposed dishes
            Merge Dish(Temperature,k);
       End
       For w=words which appear in dish k
            Local-Dish(w,Temperature,k);
       End
   %d) Decision
       If (\Delta k - term + \Delta w - term + \mathbf{Temperature} * \Delta t - term < 0):
            Accept new config
       End
End
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