

# Gibbs Sampling version of SSVI.

①

Algorithm: Gibbs Sampling

- initialize  $W, H, S^W, \pi^W, S^H, \pi^H$
- for  $j = 1, 2, \dots, \text{burnin}, \dots$  do:
  - Sample  $S_{fk}^W$
  - Sample  $S_{kt}^H$
 } using collapsed gibbs sampling derived before
- compute  $\phi_{fkt} = \frac{W_{fk} S_{fk}^W H_{kt} S_{kt}^H}{\sum_l W_{fl} S_{fl}^W H_{lt} S_{lt}^H}$
- sample  $W_{fk} \sim \text{Gamma} \left( a + \sum_t X_{fte} \phi_{fkt}, b + S_{fk}^W \sum_t H_{kte} S_{kt}^H \right)$
- sample  $H_{kt} \sim \text{Gamma} \left( c + \sum_f X_{fte} \phi_{fkt}, d + S_{kt}^H \sum_f W_{fk} S_{fk}^W \right)$
- sample  $\pi_{tk}^H \sim \text{Beta} \left( \frac{a_0^H}{K} + \sum_t S_{kt}^H, \frac{b_0^H (K-1)}{K} + T - \sum_t S_{kt}^H \right)$
- sample  $\pi_{tk}^W \sim \text{Beta} \left( \frac{a_0^W}{K} + \sum_t S_{fk}^W, \frac{b_0^W (K-1)}{K} + F - \sum_t S_{fk}^W \right)$
- end for

## Derivations

$$p(W_{fk} | X_f, Z_f, \dots) \propto p(W_{fk}, X, Z, S^W, S^H, H, \pi^W, \pi^H)$$

$$\propto p(W_{fk}) \cdot p(Z_f | W_f, H, S_f^W, S^H)$$

$\uparrow$  gamma prior                       $\uparrow$  poisson

see SSVI derivation

$$= p \left( a + \sum_t \dots, b + S_{fk}^W \sum_t \dots \right)$$

basically all derivations are like SSVI, just have prior in front.  
 (for  $p(H_{kt} | \dots)$ ,  $p(\pi_{tk}^H | \dots)$ ,  $p(\pi_{tk}^W | \dots)$ )