

1.1.(i)

$$\frac{\partial y_i}{\partial \gamma} = \hat{x}_i$$

$$\frac{\partial y_i}{\partial \beta} = 1$$

1.1.(ii)

$$\frac{\partial y_j}{\partial x_i} = \begin{cases} 0, i \neq j \vee r_j < p \\ 1/(1-p), i = j \wedge r_j \geq p \end{cases}$$

1.1.(iii)

$$\frac{\partial g(z)_j}{\partial z_i} = \begin{cases} \frac{e^{z_i}(\sum_{j=1}^k e^{z_j}) - e^{2z_i}}{(\sum_{j=1}^k e^{z_j})^2}, i = j \\ -\frac{e^{z_i+z_j}}{(\sum_{j=1}^k e^{z_j})^2}, i \neq j \end{cases}$$

1.2.(i)

$$\begin{aligned} z_{FC_{1a}} &= \theta_{1a}x + b_{1a} \\ a_{FC_{1a}} &= ReLU(z_{FC_{1a}}) \\ a_{DP_{1a}} &= M \odot a_{FC_{1a}} \\ \hat{y}_a &= a_{FC_{2a}} = \theta_{2a}a_{DP_{1a}} + b_{2a} \\ z_{FC_{1b}} &= \theta_{1b}x + b_{1b} \\ a_{FC_{1b}} &= ReLU(z_{FC_{1b}}) \\ a_{BN_{1b}} &= BN_{\gamma,\beta}(a_{FC_{1b}}) \\ z_{FC_{2b}} &= \theta_{2b}(a_{BN_{1b}} \bigoplus a_{FC_{2a}}) + b_{2b} \\ \hat{y}_b &= a_{FC_{2b}} = Softmax(z_{FC_{2b}}) \\ L(x, y_a, y_b; \theta) &= \frac{1}{m} \sum_{i=1}^m [\frac{1}{2} \|(\hat{y}_{ai} - y_{ai})\|_2^2 - \sum_{j=1}^{n_{yb}} y_{bi}^j \log(\hat{y}_{bi}^j)] \end{aligned}$$

1.2.(ii)

$$\frac{\partial L}{\partial z_{FC_{2b}}} = \frac{1}{m} \sum_{i=1}^m (\hat{y}_b^{(i)} - y_b^{(i)}), \text{得到残差 } \delta^{(FC_{2b})}$$

$$\frac{\partial L}{\partial \theta_{2b}} = \delta^{(FC_{2b})} (a_{BN_{1b}} \oplus \hat{y}_a)^T$$

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$\frac{\partial L}{\partial a_{BN_{1b}}} = \theta_{2b}^T \delta^{(FC_{2b})}$,得到残差
 $\delta^{(BN_{1b})}$ tag
 $\frac{\partial L}{\partial \gamma} = \delta^{(BN_{1b})} \hat{a}_{FC_{1b}}^T$
 $\frac{\partial L}{\partial \beta} = \sum_{i=1}^n y_{ai} \delta^{(BN_{1b})}_i$
 对于BN层, 记输出 $a_{BN_{1b}}$ 为 y , 记输入 $a_{FC_{1b}}$ 为 x , 则有
 $\frac{\partial y_j}{\partial x_i} =$
 $\left\{ \begin{aligned} &\frac{1}{(\sigma_b^2 + \epsilon)^{3/2}} ((1 - \frac{1}{m})(\sigma_b^2 + \epsilon) - \frac{1}{m} \\ &(x_j - \sigma_B) \cdot (x_i - \sigma_B)), i = j \\ &\frac{1}{(\sigma_b^2 + \epsilon)^{3/2}} (-\frac{1}{m})(\sigma_b^2 + \epsilon) - \frac{1}{m} (x_j - \\ &\sigma_B) \cdot (x_i - \sigma_B)), i \neq j \end{aligned} \right.$

$$\frac{\partial L}{\partial a_{FC_{1b}i}} = \sum_{j=1}^m \delta^{(BN_{1b})} \frac{\partial y_j}{\partial x_i}$$

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$$\begin{aligned} \frac{\partial L}{\partial a_{BN_{1b}}} &= \theta_{2b}^T \delta^{(FC_{2b})}, \text{得到残差} \delta^{(BN_{1b})} \frac{\partial L}{\partial \gamma} = \delta^{(BN_{1b})} \hat{a}_{FC_{1b}}^T \\ \frac{\partial L}{\partial \beta} &= \sum_{i=1}^{n_{ya}} \delta_i^{(BN_{1b})} \\ \text{对于} BN \text{层, 记输出} a_{BN_{1b}} \text{为} y, \text{记输入} a_{FC_{1b}} \text{为} x, \text{则有} \\ \frac{\partial y_j}{\partial x_i} &= \begin{cases} \gamma(\sigma_b^2 + \epsilon)^{-3/2}((1 - \frac{1}{m})(\sigma_b^2 + \epsilon) - \frac{1}{m}(x_j - \sigma_B) \odot (x_i - \sigma_B)), i = j \\ \gamma(\sigma_b^2 + \epsilon)^{-3/2}(-\frac{1}{m}(\sigma_b^2 + \epsilon) - \frac{1}{2}(x_j - \sigma_B) \odot (x_i - \sigma_B)), i \neq j \end{cases} \\ \frac{\partial L}{\partial a_{FC_{1b}i}} &= \sum_{j=1}^m \delta^{(BN_{1b})} \frac{\partial y_j}{\partial x_i} \end{aligned}$$

$$\begin{aligned} \frac{\partial a_{FC_{1b}i}}{\partial z_{FC_{1b}i}} &= sgn(z_{FC_{1b}i}) \\ \frac{\partial L}{\partial z_{FC_{1b}i}} &= \sum_{j=1}^m \delta^{(BN_{1b})} \frac{\partial y_j}{\partial x_i} \odot sgn(z_{FC_{1b}i}), \text{记为残差} \delta^{(FC_{1b})} \\ \frac{\partial L}{\partial \theta_{1b}} &= \delta^{(FC_{1b})} x^T \\ \frac{\partial L}{\partial \hat{y}_a} &= \frac{1}{m} \sum_{i=1}^m (\hat{y}_a^{(i)} - y_a^{(i)}) + \theta_{2b}^T \delta^{(FC_{2b})}, \text{组合得到残差} \delta^{(ya)} \\ \frac{\partial L}{\partial \theta_{2a}} &= \delta^{(ya)} a_{DP_{1a}}^T \\ \frac{\partial L}{\partial a_{DP_{1a}}} &= \theta_{2a}^T \delta^{(ya)}, \text{组合得到残差} \delta^{(dp)} \\ \frac{\partial L}{\partial a_{FC_{1a}i}} &= \begin{cases} 0, r_i < p \\ \frac{1}{1-p} \delta_i^{(dp)}, r_i \geq p \end{cases} \\ \frac{\partial L}{\partial z_{FC_{1a}i}} &= \frac{\partial L}{\partial a_{FC_{1a}i}} * Relu'(z_{FC_{1a}i}) = \begin{cases} 0, r_i < p \\ \frac{1}{1-p} \delta_i^{(dp)} sgn(z_{FC_{1a}i}), r_i \geq p \end{cases}, \text{组合得到残差} \delta^{(FC_{1a})} \\ \frac{\partial L}{\partial \theta_{1a}} &= \delta^{(FC_{1a})} x^T \end{aligned}$$