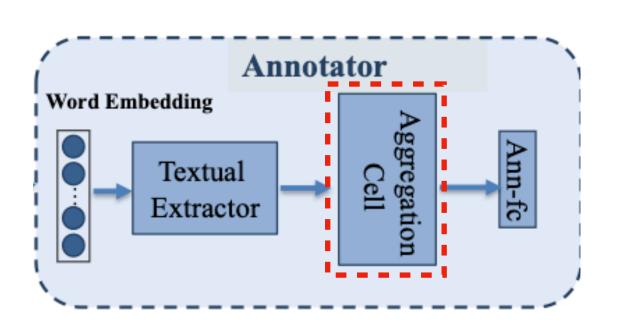
## Methodology

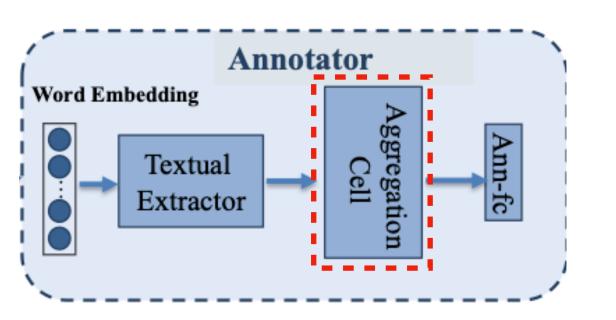
## **Automatic Annotation based on Reports**



- One news article may have reports from multiple users
- Propose to aggregate features obtained from different reports for one sample.
- Design an aggregation cell consisting of a <u>commutative aggregation function</u> and a fully-connected layer
- The commutative aggregation function, like sum, mean and max-pooling, can combine the permutation invariant input set

## Methodology

## Automatic Annotation based on Reports



- Take the i-th sample as an example, and the j-th report message:  $r_j^{(i)}$
- . The corresponding report message set is denoted as  $R^{(i)} = \{r_1^{(i)}, r_2^{(i)}, \cdots, r_{|R^{(i)}|}^{(i)}\}$ 
  - $\left|R^{(i)}\right|$  : number of report messages of i-th sample
- $r_j^{(i)} \in R^{(i)}$  is first fed into the textual feature extractor to obtain  $\mathbf{h}_j^{(i)}$
- Use the aggregation cell to combine  $R^{(i)}$  to learn the hidden feature representation  $\mathbf{h}^{(i)}$

Procedure of aggregation cell: 
$$\mathbf{h}^{(i)} = \text{ReLU}\left(\mathbf{w}_r \cdot \sum_{j=1}^{\left|R^{(i)}\right|} \frac{\mathbf{h}_j^{(i)}}{\left|R^{(i)}\right|}\right)$$
,  $\mathbf{w}_r$ : weight of the fully-connected layer