

NUKL at the NTCIR-15  
QA Lab-PoliInfo-2 Task  
*-Dialog Summarization-*

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# Our Summarization System

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Consists of three modules

- Segmentation
  - using cue phrases
- Sentence Extraction
  - using progressive ensemble random forest
- Sentence Reduction
  - using progressive ensemble random forest

# Segmentation

## 1. Segment text into paragraphs

### ➤ Using cue phrases

| Pattern | Regular expressions   |
|---------|---|
| Opening | <code>^まず ^最初に ^初めに ^次に ^次いで ^最後に ^終わりに</code><br><code> ^[一三五六七八九十]+点目</code><br><code> ^[^,]+についてです あります ございます)(が けれど)</code><br><code> ^終わり(ま です。 ^以上で ^ありがとうございます</code><br><code> 他の質問に(ついて つきまして)は</code> |
| Closing | <code>伺い[^,]*ます。 お尋ね[^,]*します お答えください。</code><br><code> (見解 所見 答弁)を求め[^,]*ます。</code><br><code> (いかがで どうで)(しょうか すか)。</code><br><code> . +質問を(終わります 終了します)。</code>   |

From K. Kanasaki et al.: Cue-Phrase-Based Text Segmentation and Optimal Segment Concatenation for the NTCIR-14 QA Lab-PoliInfo Task (2019)

# Segmentation

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1. Segment text into paragraphs
  - Using cue phrases
2. Choose one paragraph for each subtopic
  - Paragraph including the subtopic
    - ✧ Or similar paragraph based on BERT vectorization
  - Considering the orders of the subtopics

# Sentence Extraction

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- Using Progressive Ensemble Random Forest (PERF)
  - developed at NTCIR-14 QA Lab-PoliInfo
  - uses multiple RF classifiers trained on different-sized data step by step

# PERF (Progressive Ensemble Random Forest)

|                |     |   |   |
|----------------|-----|---|---|
| Document ID    | 111 |   |   |
| # of sentences | 45  |   |   |
| N              | P   | 1 | 1 |

# of extracted sentences

Undersampling  
same-sized negative and positive data

# PERF (Progressive Ensemble Random Forest)

|                |       |     |
|----------------|-------|-----|
| Document ID    | 111   | 106 |
| # of sentences | 45    | 11  |
|                | N P 1 | 1 9 |

too many

# PERF (Progressive Ensemble Random Forest)

|                |         |     |
|----------------|---------|-----|
| Document ID    | 111     | 106 |
| # of sentences | 45      | 11  |
|                | N P 1   | 1 9 |
|                | N N P 2 | 0 5 |

Undersampling  
double-sized negative data




# PERF (Progressive Ensemble Random Forest)

| Document ID    | 111       | 106 |
|----------------|-----------|-----|
| # of sentences | 45        | 11  |
|                | N P 1     | 1 9 |
|                | N N P 2   | 0 5 |
|                | N N N P 3 | 0 2 |

better

Undersampling  
triple-sized negative data

# PERF (Progressive Ensemble Random Forest)



| Document ID    | 111 | 106 | 23 | 19 | 92 |
|----------------|-----|-----|----|----|----|
| # of sentences | 45  | 11  | 34 | 8  | 13 |
| N P 1          | 1   | 9   | 3  | 7  | 5  |
| N N P 2        | 0   | 5   | 2  | 3  | 3  |
| N N N P 3      | 0   | 2   | 1  | 3  | 1  |
| N N N N P 4    | 0   | 0   | 0  | 1  | 1  |
| N N N N N P 5  | 0   | 0   | 0  | 0  | 1  |

Which classifier should we use?

All classifiers step by step

# Sentence Reduction

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- At NTCIR-14 QA Lab-PoliInfo
  - rule based approach
- At NTCIR-15 QA Lab-PoliInfo
  - **PERF**

# Evaluation

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| ID  | Team | Training data | Sentence reduction | ROUGE  |
|-----|------|---------------|--------------------|--------|
| 148 | TO   | PoliInfo      | Rule               | 0.2346 |
| 216 | NUKL | PoliInfo-2    | PERF               | 0.2518 |

Applying PERF to sentence reduction improved the score

# Evaluation

| ID  | Team  | Training data | Sentence reduction | ROUGE  |
|-----|-------|---------------|--------------------|--------|
| 148 | TO    | PoliInfo      | Rule               | 0.2346 |
| 216 | NUKL  | PoliInfo-2    | PERF               | 0.2518 |
| 189 | JRIRD | -             | -                  | 0.3208 |



neural network model

# Quality Question Scores

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| ID  | team  | Content |       | Well-formed | Sentence goodness | Dialog goodness |
|-----|-------|---------|-------|-------------|-------------------|-----------------|
|     |       | X=2     | X=0   |             |                   |                 |
| 148 | TO    | 0.748   | 0.671 | 1.582       | 0.730             | 0.488           |
| 216 | NUKL  | 0.829   | 0.747 | 1.681       | 0.836             | 0.616           |
| 189 | JRIRD | 1.082   | 0.975 | 1.858       | 1.129             | 0.937           |

# Conclusion

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- Dialog Summarization task using **progressive ensemble random forest**
  - for sentence extraction and reduction
  - better results than TO but worth than NN