

AESOP: Summarization and Metrics

With Neither Sweet *Lemons*
nor Sour *Grapes*

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Outline

- Content based metrics
 - ROSE (ROUGE Optimal Summarization Evaluation).
 - Nouveau ROUGE: measuring what's new.
- AESOP results.
- Uber-baseline: Towards automatic measures of coherence.

Best Linear Combination

- Canonical Correlation: Hotelling 1935
 - Finds optimal linear combination to maximize correlation: a LS problem; more generally an eigenvalue problem.
- ROUGE Optimal Summarization Evaluation. ROSE. [Conroy & Dang 2008]
- Linear combination of *average system scores* *not* document set scores.

Robust Regression

- We aim to predict human metrics:
 - Overall responsiveness or
 - Pyramid evaluation.

$$x = \arg \min \| Ax - b \|$$

A_{2008} system-average-scaled-feature matrix,

b_{2008} is the human metric to predict,

$\| \cdot \|$ a norm that accounts for outliers.

$\hat{b}_{2009} = A_{2009}x$, our estimate for the 2009 metric.

Nouveau ROUGE: Newness Metrics

- For update summaries the summaries should differ from what is already known.
- ROUGE scores that compare **peers** in subset B with **models** in subset A .

$$R_i^{(AB)} \quad i = 1, 2, 3, 4, 5, \text{SU4}, L$$

Classifier

- Predict 2009 *document set* responsiveness scores using a linear classifier with ROUGE [and Nouveau ROUGE] features.
- Responsiveness scores for 2008 are {1,2,3,4,5}.
- Classifier gives posterior probability for each class.
- Expected value computed as score:

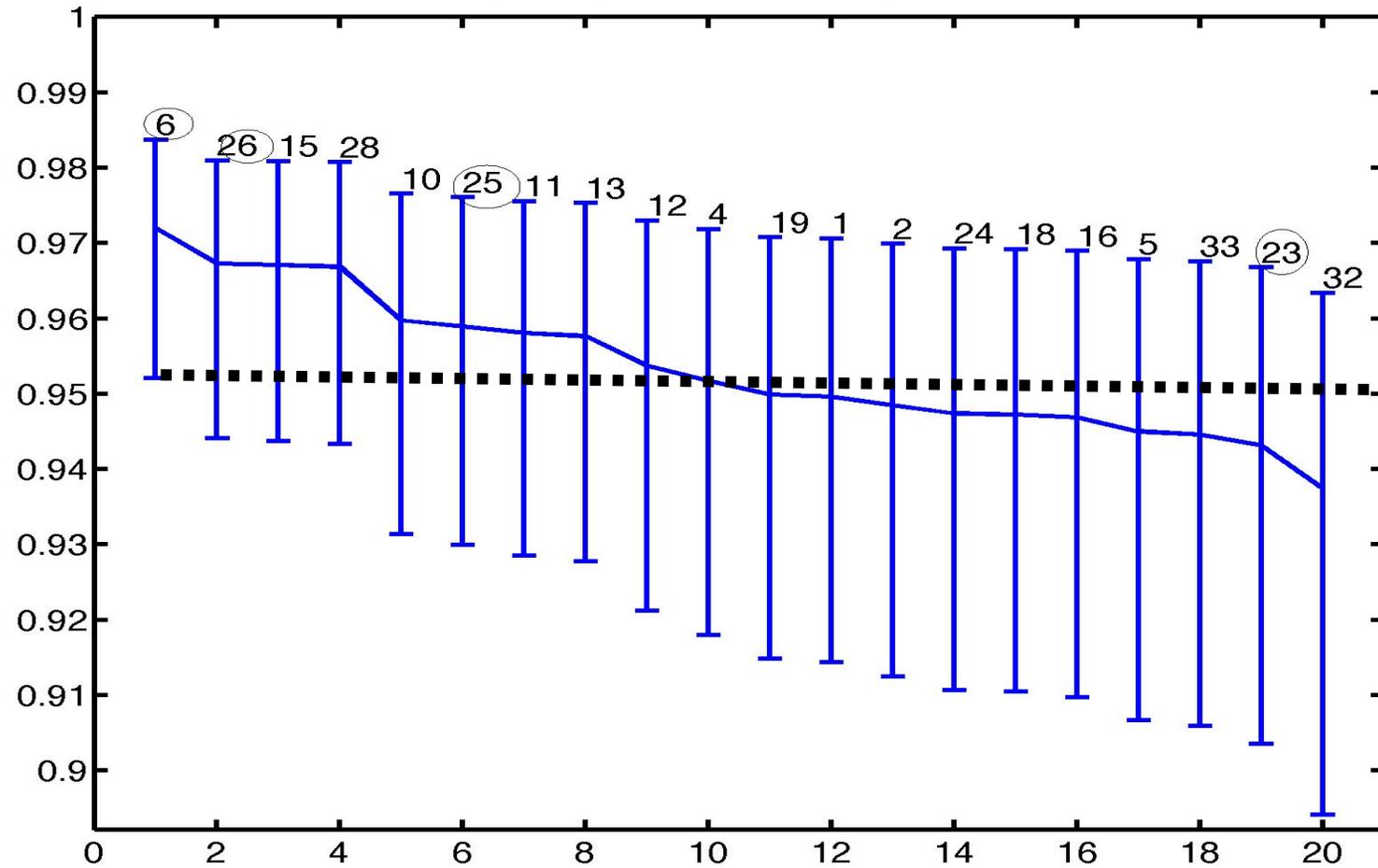
$$s = \sum_{i=1}^5 ip_i$$

AESOP Submissions

| ID | Type | Features | Target |
|----|------------|-------------|---------|
| 25 | Regress. | 1,2,3,L,SU4 | Resp. |
| 6 | Regress. | 2 | Resp. |
| 23 | Regress. | 1,2,3,L,SU4 | Pyramid |
| 26 | Classifier | 2,3 | Resp. |

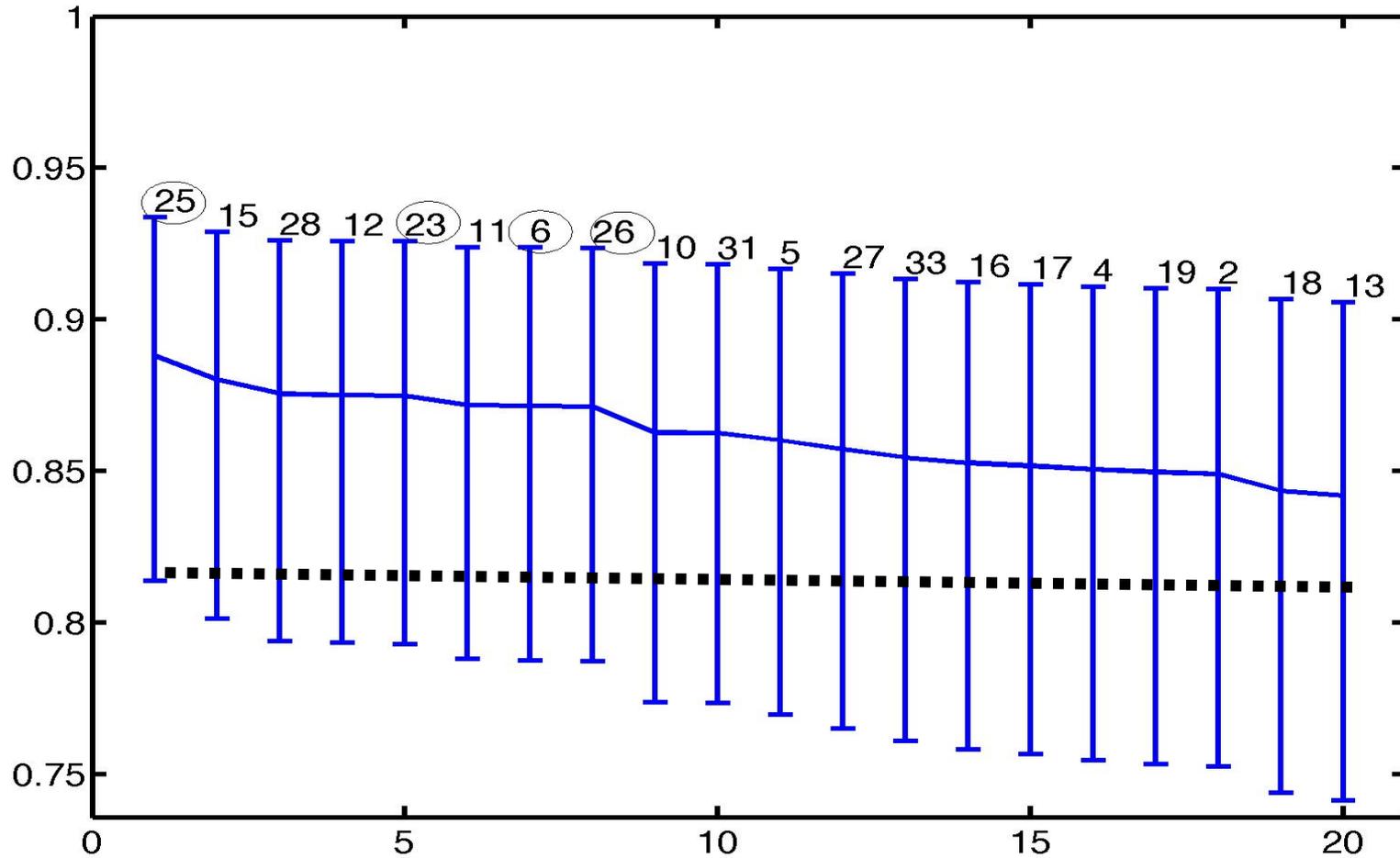
Pyramid Set A: Error Bars

Top 20 Pyramid Correlating Metrics



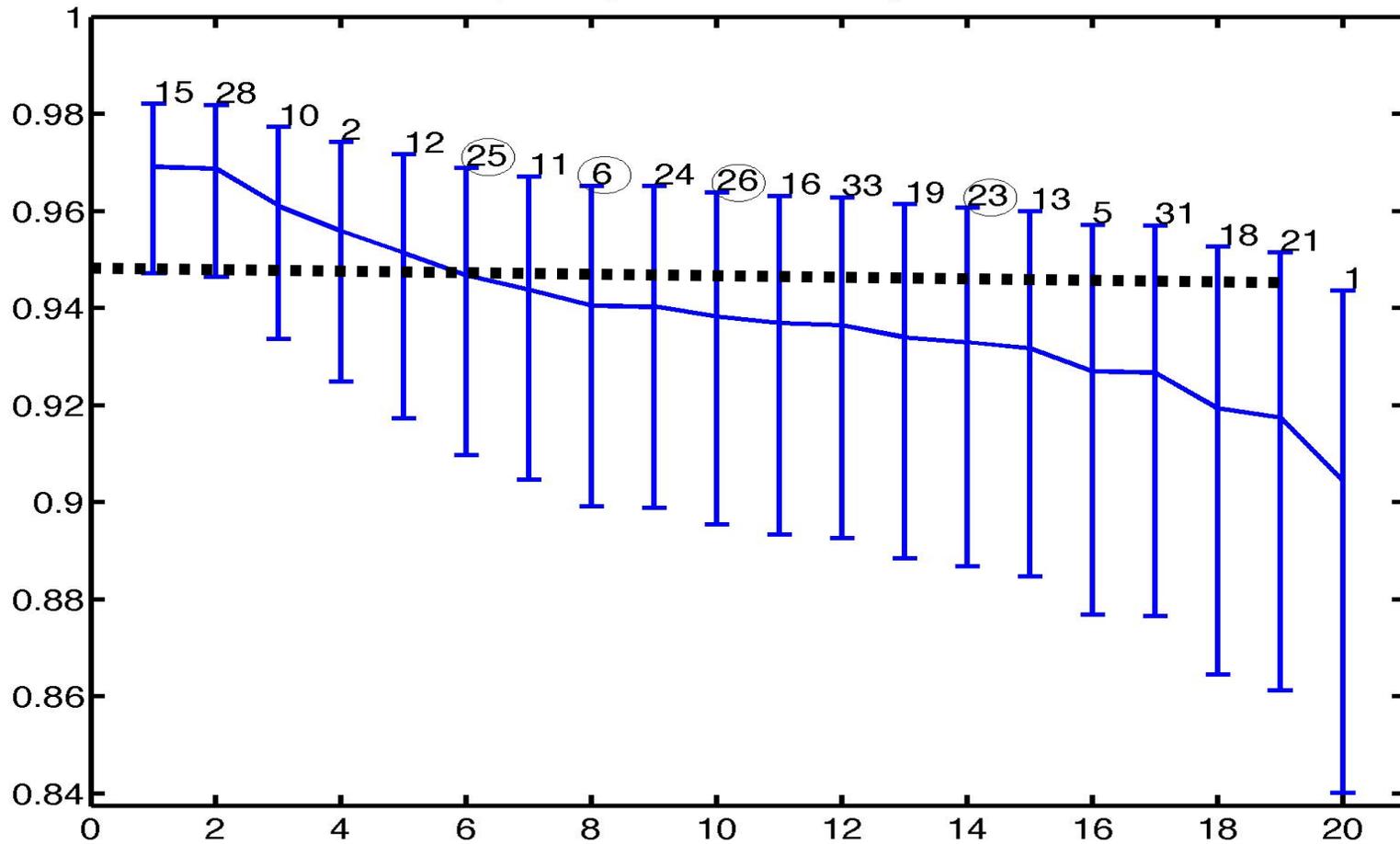
Responsiveness Set A

Top 20 Responsiveness Correlating Metrics



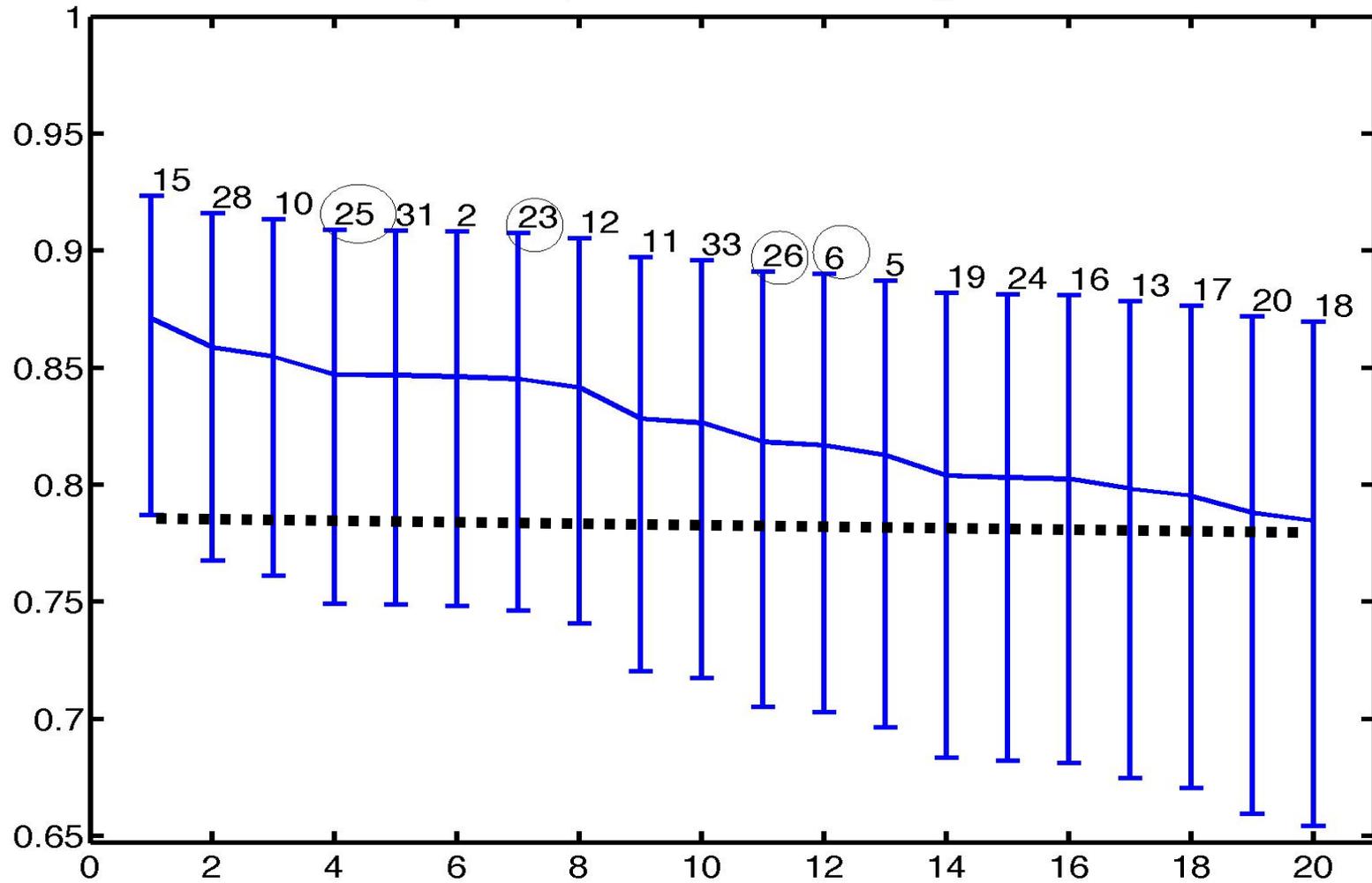
Pyramid Set B: Error Bars

Top 20 Pyramid Correlating Metrics



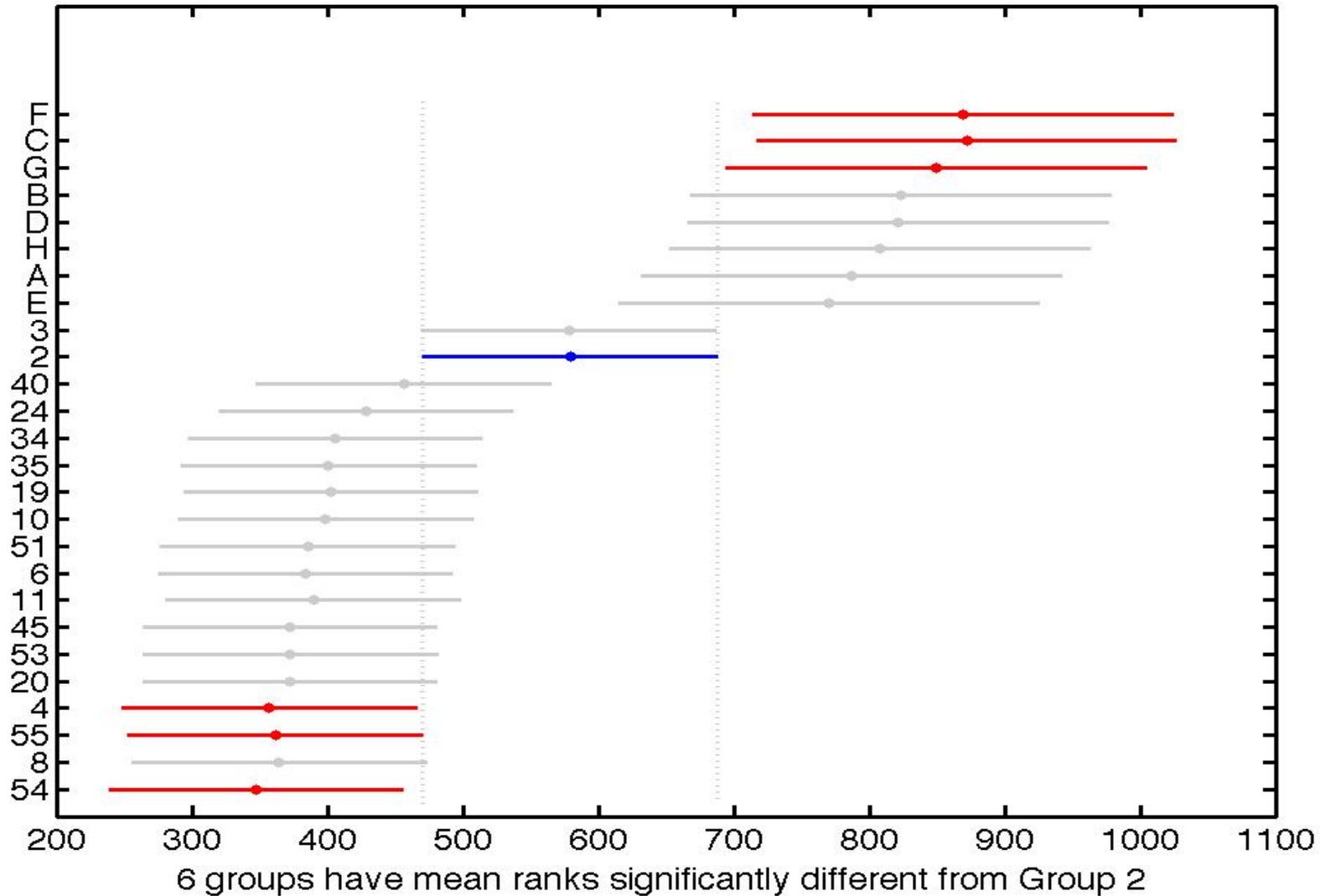
Responsiveness Set B

Top 20 Responsiveness Correlating Metrics



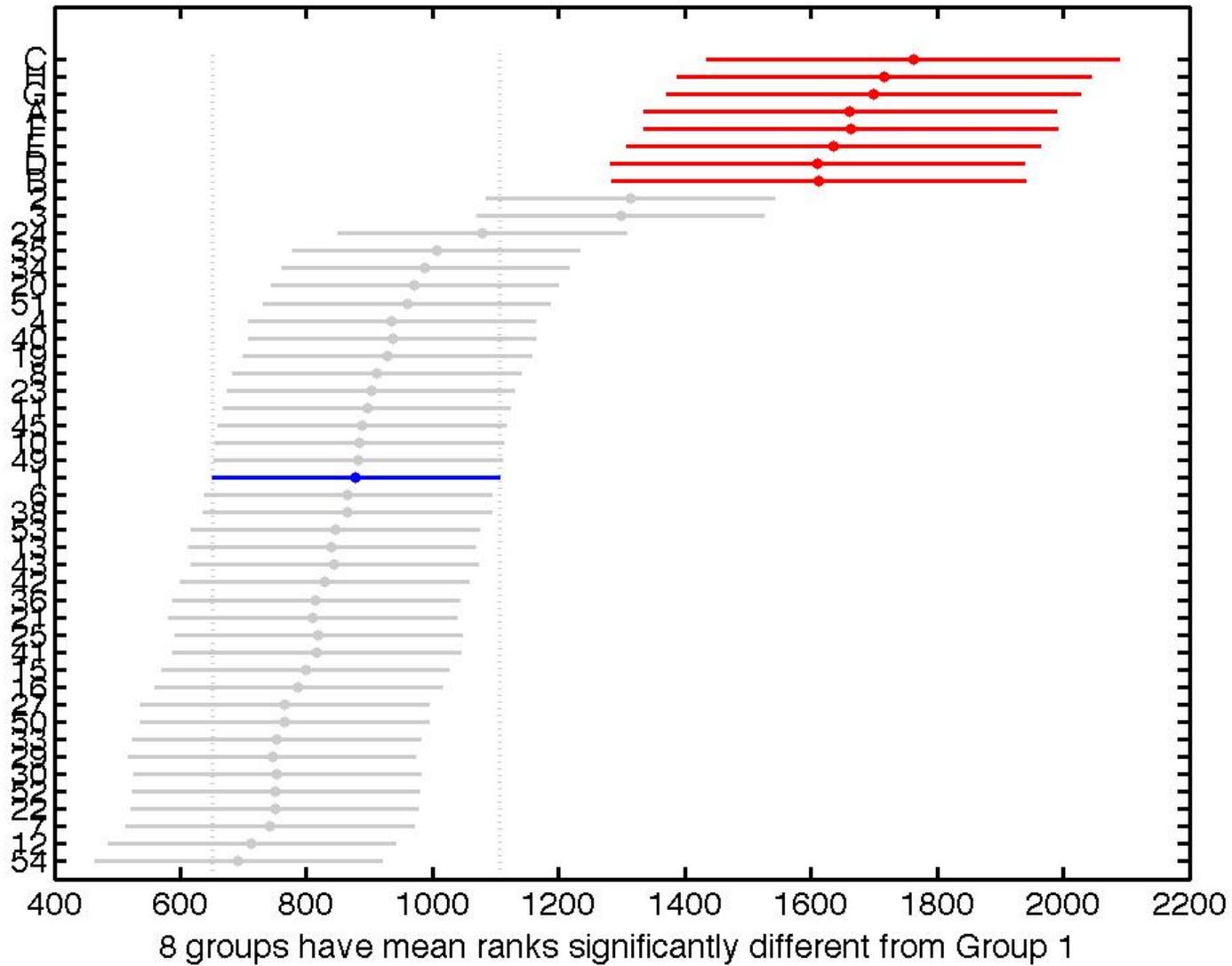
Responsiveness: Set A

Tukey HSD Test: Subset A of Summarization Task



Responsiveness: Set B

Tukey HSD Test: Subset B of Summarization Task



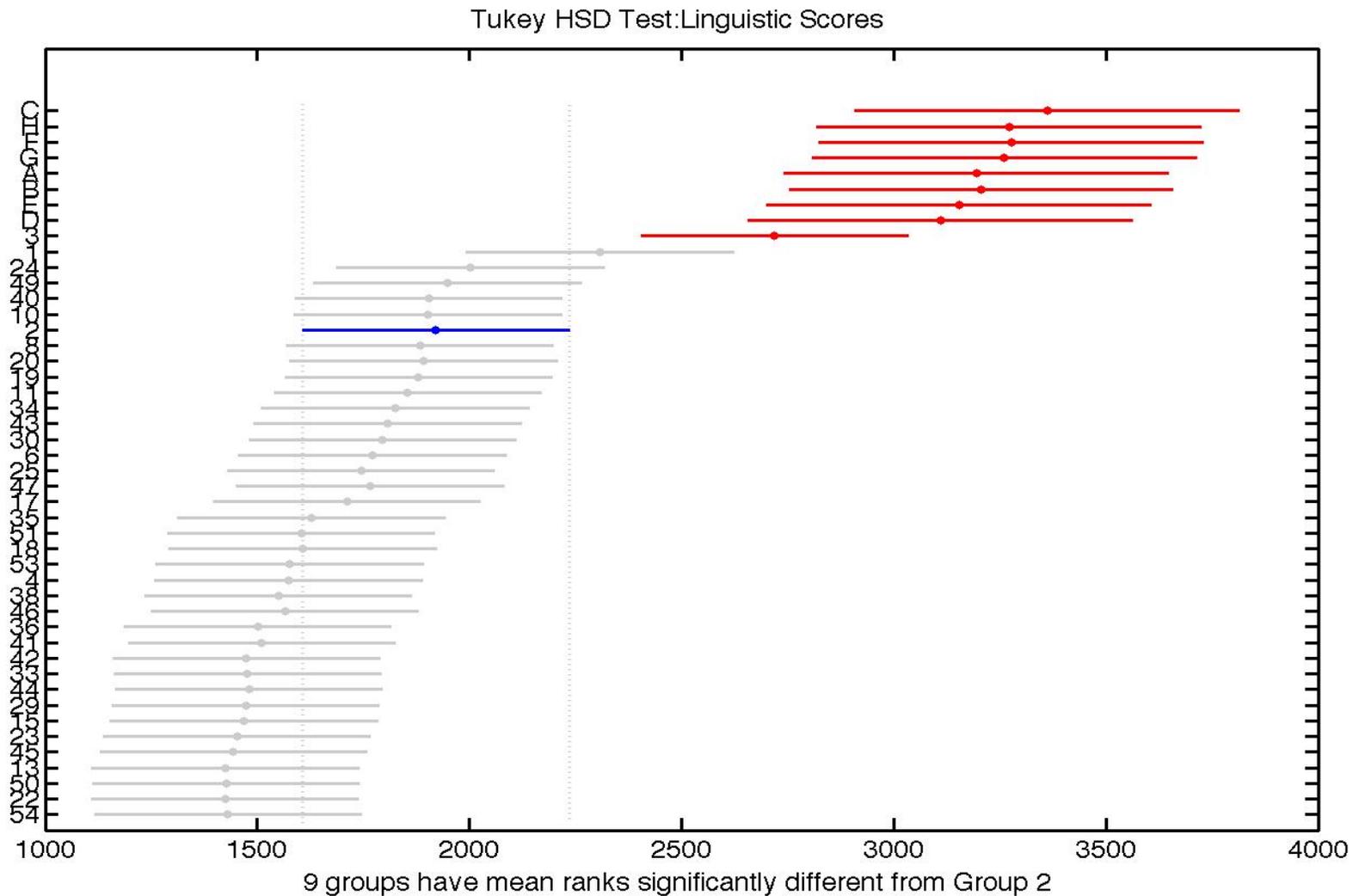
Uber-Baseline

- **Idea:** Test to what extent sentence order affects linguistic quality and responsiveness.
- **Execution:** Permute sentences from a human summary (not the assessor for the topic set.)

Metrics on the Uber-Baseline

| Metric | Uber | Human | p-value |
|---------|-------|-------|----------|
| pyr | 0.656 | 0.662 | 9.40e-01 |
| ling | 5.682 | 8.773 | 5.92e-14 |
| overall | 6.273 | 8.591 | 6.04e-13 |

Uber vs The Top



Conclusions

- While ROSE/Nouveau ROUGE and others had higher correlation than baseline metrics, none exceeded ROUGE-2 for predicting responsiveness.
- Linguistic quality of uber-baselines comparable to top performing systems; however, *significantly* less than human counterpart!
- Underscores need for coherence metrics.