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# Analysis of Norm-Referencing Modifiers as a Component of Rating Rubrics

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# Agenda

- ✓ Rationale
- ✓ Research questions
- ✓ Methodology
- ✓ Analysis
- ✓ Conclusion

# Rating Scale Design

- ✓ Empirically informed rating rubric
- ✓ How do modifiers function as a component of rating rubrics?
- ✓ Lack of research in modifiers

# Research Questions

- ✓ Do modifiers correspond to a specific ability range?
- ✓ Will the same modifier attached to different descriptors nonetheless be targeting a similar ability range?

# Descriptors and Modifiers

- ✓ Creates a cohesive text
- ✓ Grammar is correct
- ✓ Punctuation is correct
- ✓ Vocabulary is appropriate
- ✓ Writing is intelligible
- ✓ Partially
- ✓ Sufficiently
- ✓ Mostly

Creates a **partially** cohesive text

Creates a **sufficiently** cohesive text

Creates a **mostly** cohesive text

# Methodology

✓ 30 Samples, 10 experienced raters, 5  
descriptor types, 3 modifiers.

Fully crossed design

✓ Online rating using Fluid Surveys

# Fluid Surveys

## SURVEY

18%

### Test Taker's Response

Dear Sir(Mr.x),

Kindly , my son Albert is one of your student, in the 6th grade class at North elementary school.

I m writing you today to express my concerns, regarding Albert feelings during the last semester.

As You know, the academic program for this year class is charged with technical scientific subject and the children have to prepare and present a lot of projects.

Although , Albert was always interested in the material you presented , he started feeling uncomfortable about the project handling.

He expressed a lot of anxious regarding the subject presentation, and his colleagues

behaviour during the presentation time , especially the interaction, questions and answer parts.

Despite putting a lot of effort in the research and preparation , Albert is always afraid to present his job, in front of audience.

I was trying to help him developing more confidence, by making him do more practices.

If would appreciate if we can meet together , to discuss the best way to follow in order to help Albert overcome his fears.

Your Input regarding the above mentioned issue , will be highly appreciated.

Regards

Check the descriptor below if the response meets the ability described by this descriptor

Vocabulary is mostly appropriate

# Analysis

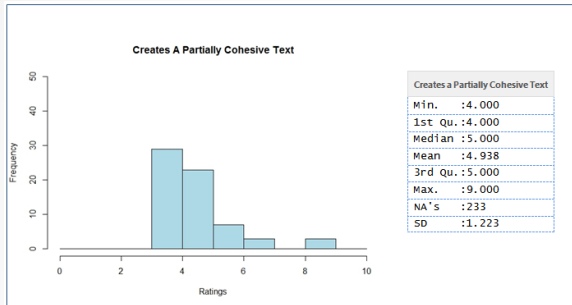
✓ Descriptive statistics

✓ ANOVA

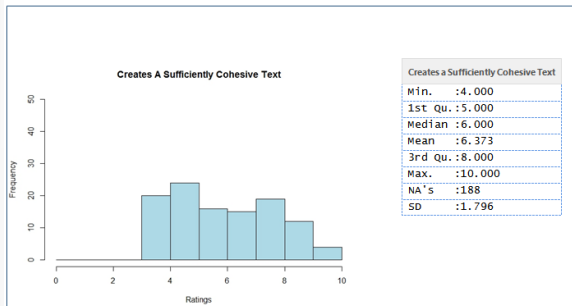
✓ MFRM



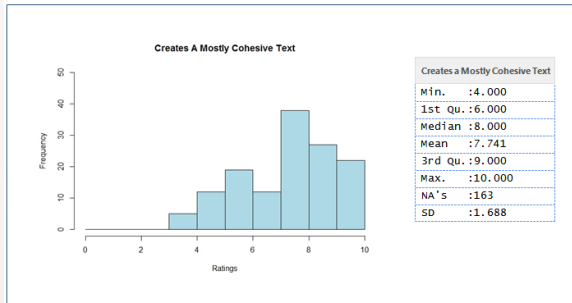
# Analysis: Descriptive Statistics



✓ Creates a **partially** cohesive text

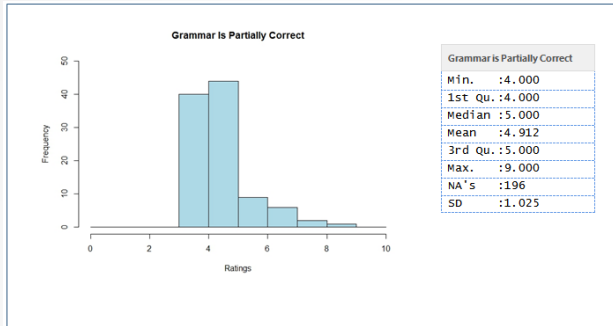


✓ Creates a **sufficiently** cohesive text

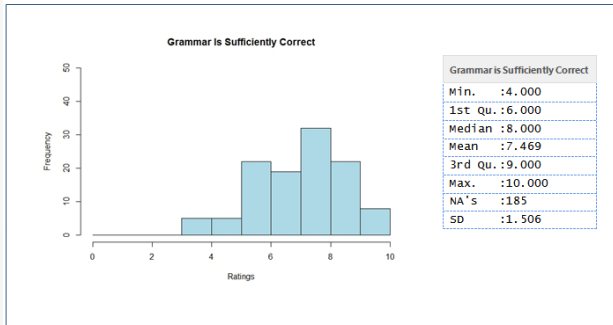


✓ Creates a **mostly** cohesive text

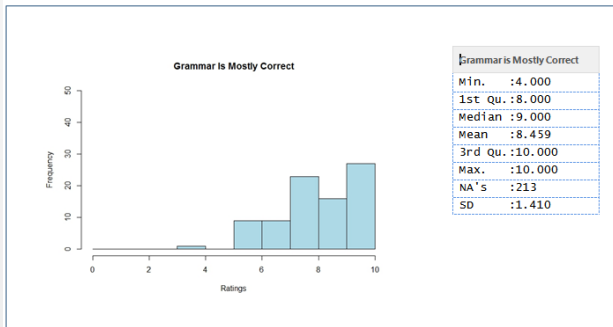
# Analysis: Descriptive Statistics



✓ Grammar is **partially** correct



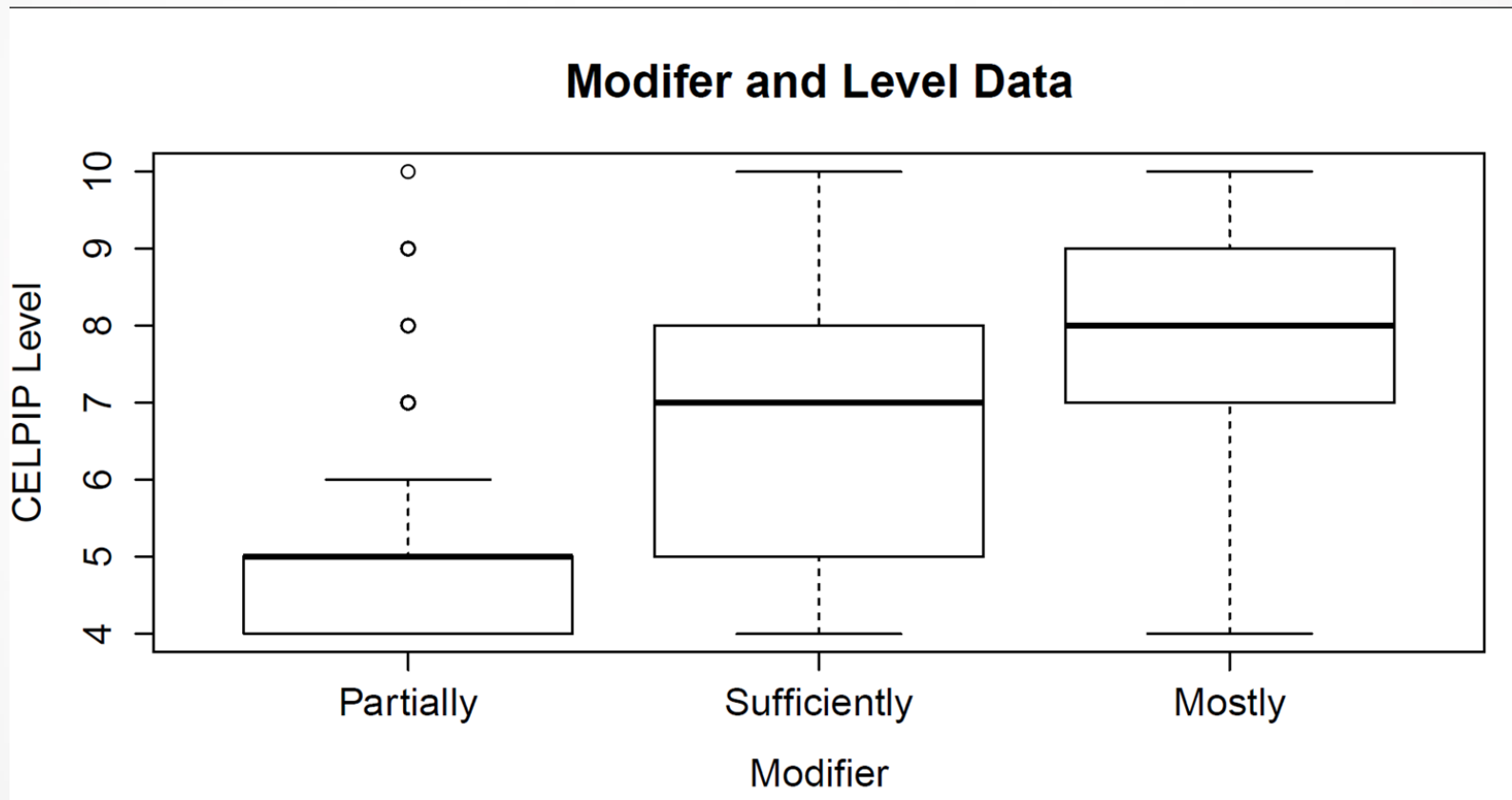
✓ Grammar is **sufficiently** correct



✓ Grammar is **mostly** correct

# Analysis: Box Plots

## (across all descriptors)



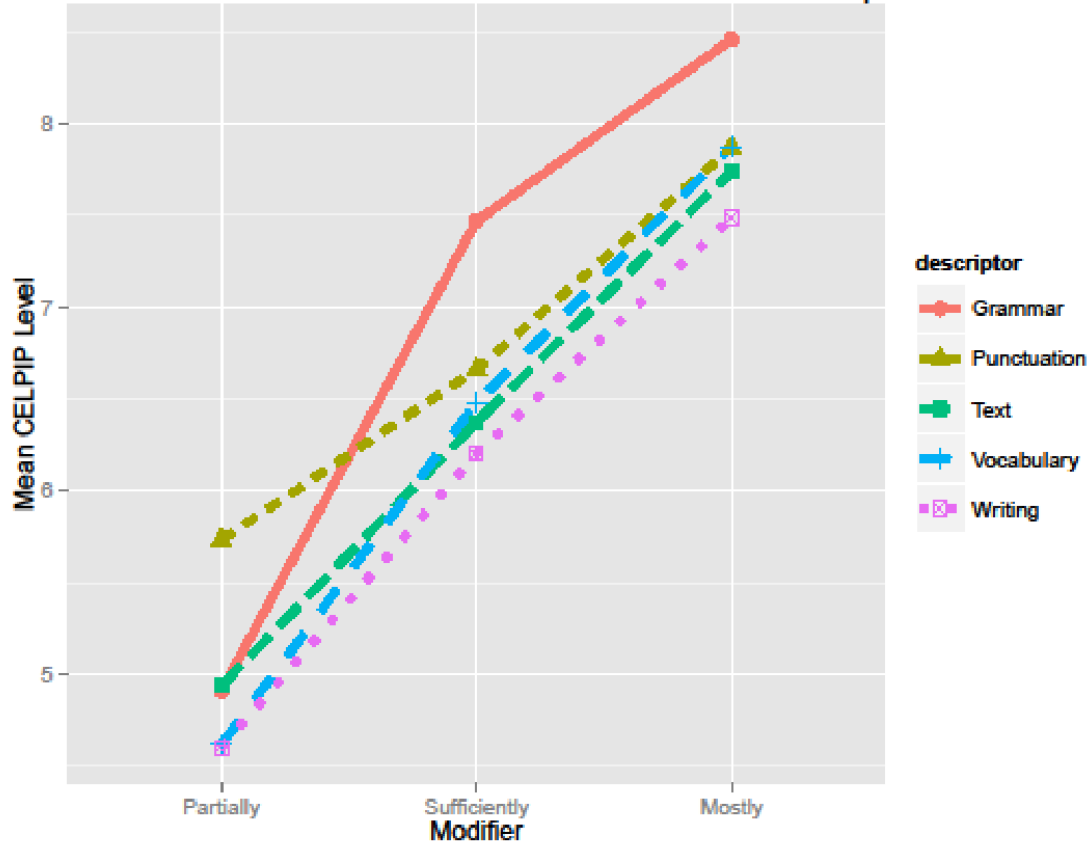
# Analysis: ANOVA

	Sum of Squares	df	Mean Square	F	Sig.
Descriptor	28	4	7.0	2.718	0.028419
Modifier	1945	2	972.5	376.471	0.000000
Descriptor* Modifier	82	8	10.2	3.963	0.000117
Residuals	3895	1508	2.6		

- ✓ Descriptor type
- ✓ Modifier
- ✓ Statistical significance

# Analysis: ANOVA

Interaction Plot of Mean CELPIP Level vs Modifier and Descriptor



# Analysis: MFRM

Measr	+Descriptors	-Raters	LEVEL
1			(10) 9
	Grammar is mostly correct		---
	Punctuation is mostly correct		8
	Creates a mostly cohesive text		---
	Grammar is sufficiently correct		7
0			7
	Punctuation is sufficiently correct		---
	Creates a sufficiently cohesive text		6
	writing is sufficiently intelligible		---
	Punctuation is partially correct		5
	Creates a partially cohesive text		---
	Grammar is partially correct		5
-1			---
	Vocabulary is partially appropriate		---
	writing is partially intelligible		---
-2			(4)
Measr	+Descriptors	-Raters	LEVEL

# Analysis. MFRM

Table 7.1.1 Descriptors Measurement Report (arranged by MN).

Total Score	Total Count	Obsvd Average	Fair(M) Average	Measure	Model S.E.	Infit Mnsq	Zstd	Outfit Mnsq	ZStd	Estim. Discrm	Correlation PtMea	PtExp	Nu Descriptors
719	85	8.46	8.49	.54	.08	.98	.0	1.02	.1	.95	.07	.16	1 Grammar is mostly correct
1110	141	7.87	7.86	.27	.05	1.11	1.0	1.12	1.1	.87	.08	.18	10 Vocabulary is mostly appropriate
842	107	7.87	7.82	.26	.06	1.13	1.1	1.14	1.1	.86	.12	.20	6 Punctuation is mostly correct
1045	135	7.74	7.72	.22	.05	.99	.0	1.00	.0	1.07	.17	.19	4 Creates a mostly cohesive text
1063	142	7.49	7.48	.14	.05	1.01	.1	1.02	.1	1.00	.26	.20	13 Writing is mostly intelligible
844	113	7.47	7.44	.13	.05	.69	-3.4	.69	-3.4	1.46	.33	.20	3 Grammar is sufficiently correct
786	118	6.66	6.63	-.13	.05	1.22	2.2	1.21	2.1	.49	.07	.21	8 Punctuation is sufficiently correct
726	112	6.48	6.41	-.20	.05	.93	-.7	.92	-.7	1.10	.30	.19	12 Vocabulary is sufficiently appropriate
701	110	6.37	6.27	-.25	.06	1.05	.5	1.06	.5	.92	.15	.18	9 Creates a sufficiently cohesive text
645	104	6.20	6.11	-.30	.06	.93	-.6	.91	-.7	1.15	.36	.17	15 Writing is sufficiently intelligible
407	71	5.73	5.75	-.44	.08	1.14	.9	1.16	1.0	.84	.02	.18	7 Punctuation is partially correct
321	65	4.94	4.91	-.90	.11	1.13	.5	1.11	.5	.99	.18	.14	5 Creates a partially cohesive text
501	102	4.91	4.87	-.94	.09	.81	-.9	.77	-1.1	1.06	.23	.13	2 Grammar is partially correct
291	63	4.62	4.59	-1.24	.14	.79	-.6	.75	-.8	1.03	.19	.10	11 Vocabulary is partially appropriate
253	55	4.60	4.57	-1.27	.16	.77	-.6	.79	-.5	1.02	.07	.11	14 Writing is partially intelligible
683.6	101.5	6.49	6.46	-.27	.08	.98	.0	.98	.0		.17		Mean (Count: 15)
271.2	27.2	1.26	1.27	.56	.03	.15	1.2	.16	1.3		.10		S.D. (Population)
280.7	28.2	1.31	1.31	.58	.03	.16	1.3	.17	1.3		.10		S.D. (Sample)

Model, Populn: RMSE .08 Adj (True) S.D. .55 Separation 6.61 Strata 9.14 Reliability .98  
 Model, Sample: RMSE .08 Adj (True) S.D. .57 Separation 6.84 Strata 9.46 Reliability .98  
 Model, Fixed (all same) chi-square: 532.2 d.f.: 14 significance (probability): .00  
 Model, Random (normal) chi-square: 13.5 d.f.: 13 significance (probability): .41

# Feedback from Raters

- ✓ Even though the raters were not told the purpose of the study, they noticed the systematic use of the modifiers
- ✓ Many raters informed us that limiting the number of modifiers to 3 was very helpful
- ✓ Each rater began to devise heuristics for judging each modifier



# Future work

- ✓ Can training or seminars help raters develop a shared consensus as to how different performance levels correspond with different modifiers?
- ✓ Can we discern a limited and highly descriptive pool of modifiers for systematic application?

# Conclusion

- ✓ Modifiers can be discerning and can have a major effect on raters' perceptions
- ✓ Modifiers should be carefully selected. Some are better targeted at a specific ability range.
- ✓ Using a limited number of modifiers systematically may help with inter-rater reliability

# Thank you!

# Analysis of Norm-Referencing Modifiers as a Component of Rating Rubrics

## Questions?