

# PP Extrapolation in Spoken Dutch, a production experiment

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# Introduction

- What is an extrapolation?
- Why do we have extrapolations?
- The experiment
- Statistical analysis
  - Production Time
  - Extrapolations
  - Production Time & Extrapolations

# What is an extraposition?

**Ik heb een brief op duur briefpapier geschreven**

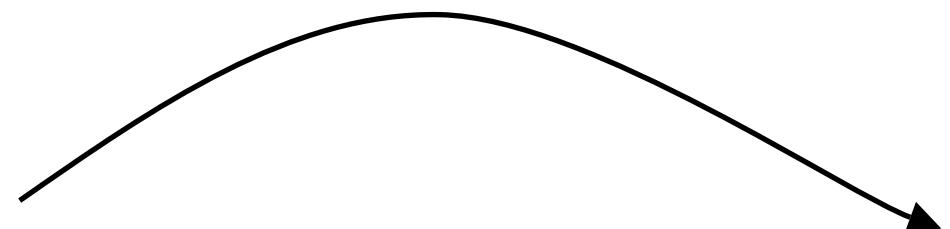
# What is an extraposition?

Ik heb een brief op duur briefpapier geschreven

VP Brace

# What is an extraposition?

PP over V movement



Ik heb een brief op duur briefpapier **geschreven**

# What is an extraposition?

Ik heb een brief geschreven op duur briefpapier

# What is an extraposition?

Ik heb een brief geschreven op duur briefpapier

VP Brace

Exbraciated /  
Extraposed PP

# What is an extraposition?

Definition of brace construction:

«a particular **discontinuous pattern**,  
whereby elements that belong together  
semantically are separated structurally»

(Van Canegem-Ardijns, 2006)

# What is an extraposition?

Other typical Dutch brace constructions:

Ik schrijf me morgen voor de wedstrijd **in**

... dat **ik** me morgen **inschrijf**

# Why do we have extrapositions?

- «a speaker doesn't like brace constructions and wants to say together elements that belong together»  
(Van Haeringen, 1947)
- «Can't our computational brain count up to three?»  
(Jansen, 1979)

# Why do we have extrapositions?

- Extraposition as a **product of proximity preference** among elements that belong together semantically
- Extraposition as a **result of limitations** in speech production

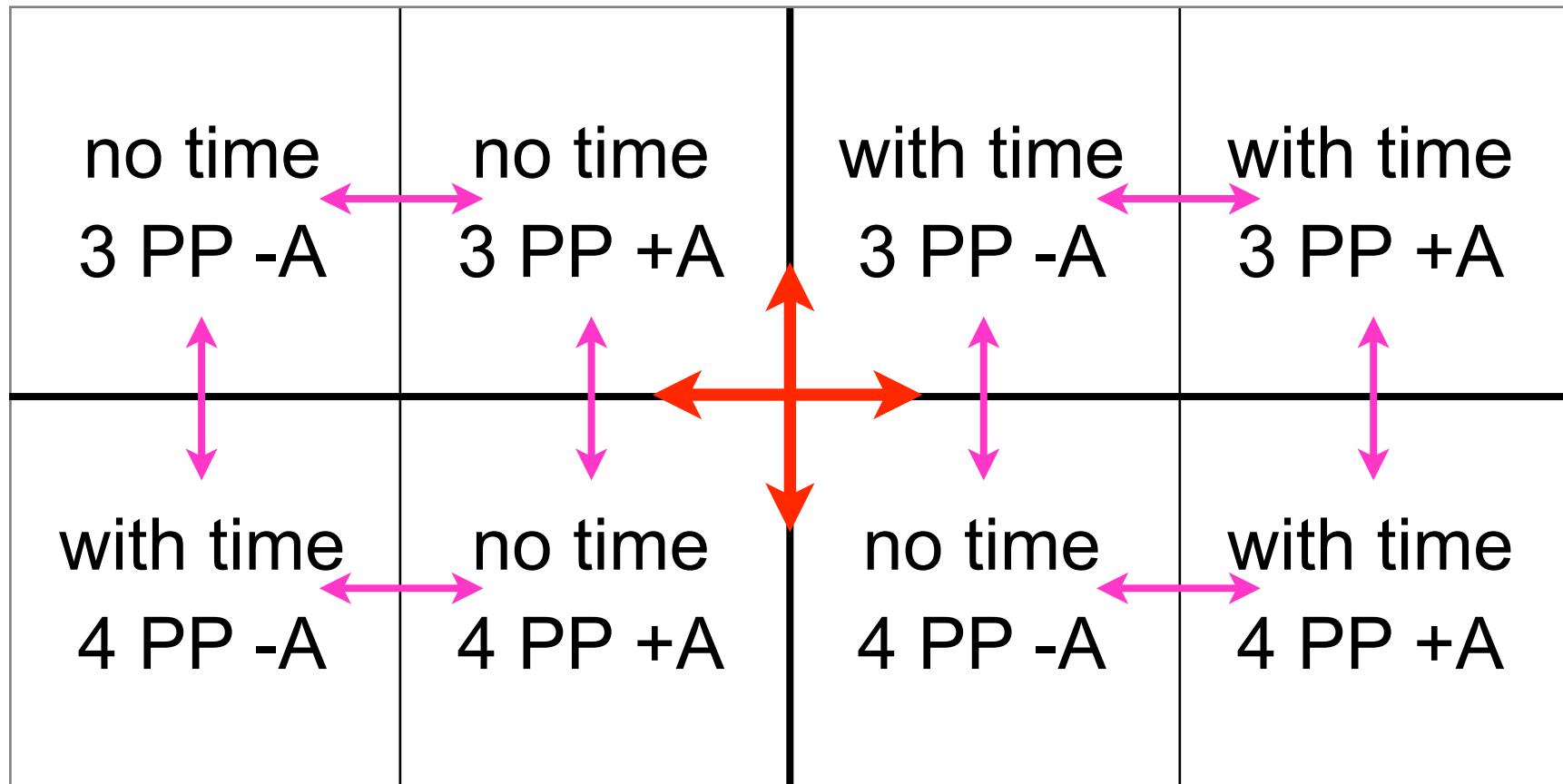
# The experiment

- How do we get people into producing extrapolations?
- How do we limit their resources in speech production?
- Can the resource limit effects be emphasized by using a between-subjects factor?

# The experiment

- **Anagram task**  $\Rightarrow$  no more relationship between content and syntactic structure
- **Resource limitation**  $\Rightarrow$  time limit, length increase, adjective factor
- **Between-subjects factor**  $\Rightarrow$  Subjects with different working memory spans

# The Experiment: Orthogonality



# The Experiment: Latin square

← Patterns from “1” to “5” →

↑  
Lists from “A” to “E” (what a  
subject sees)

↓

3PP	3PP A	4 PP	4PP A	Check
Check	3PP	3PP A	4 PP	4PP A
4PP A	Check	3PP	3PP A	4 PP
4 PP	4PP A	Check	3PP	3PP A
3PP A	4 PP	4PP A	Check	3PP

# The Experiment: sentences

**3PP:** Ik heb maandagochtend onder begeleiding van een fysiotherapeut gesport

**3PPA:** Ik heb maandagochtend vroeg onder strenge begeleiding van een goede fysiotherapeut gesport

**4PP:** Ik heb maandagochtend onder begeleiding van een fysiotherapeut in de fitnessruimte gesport

**4PPA:** Ik heb maandagochtend vroeg onder strenge begeleiding van een goede fysiotherapeut in de nieuwe fitnessruimte gesport

**Check:** Ik heb maandagochtend vroeg onder strenge begeleiding van een goede fysiotherapeut in de fitnessruimte gesport

# The Experiment: anagram patterns

		3	
	2		
5			
	6	4	1

# The Experiment: anagram patterns

maandagochtend  
vroeg

heb

van een goede  
fysiotherapeut

gesport

onder strenge  
begeleiding

ik

# The Experiment: production

Low span 11.6 sec  
(voice ~5.7 sec)



High span 11.1 sec  
(voice ~5.1 sec)



# The Experiment: production



Low span ~5.7 sec

# The Experiment: production



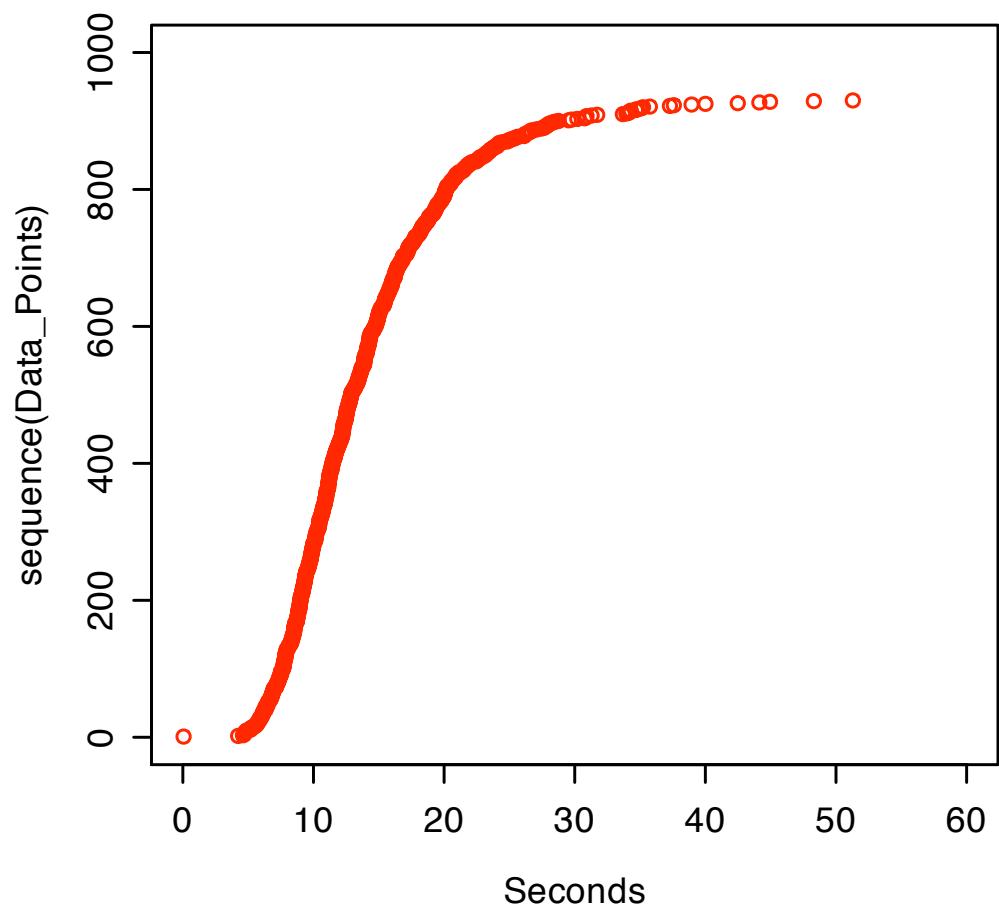
High span ~5.1 sec

# Statistical Analysis

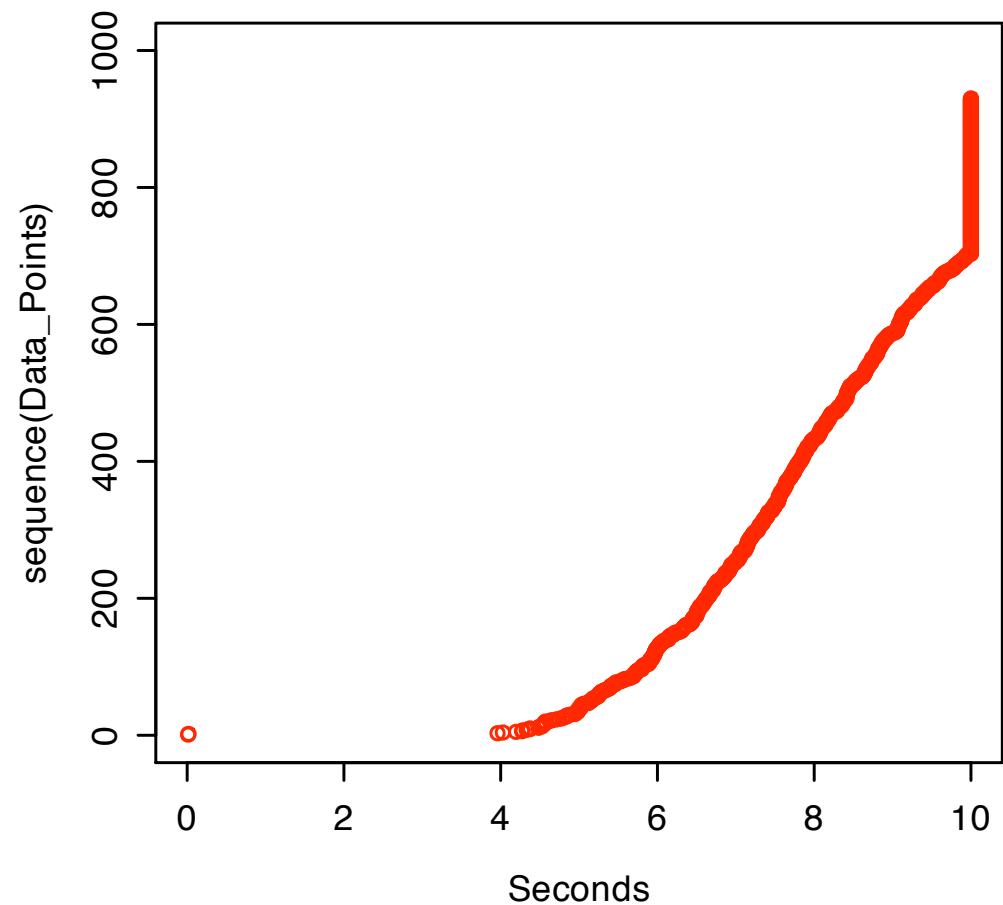
- What variables do we collect from the experiment?
  - number of extraposed PP's per sentence
  - production time (time in between two button pressures: from the moment they first see a slide to the moment they move on to the next)
  - work in progress! :-)
- What variables do we derive from the data
  - binary count of the sentences showing extraposed PP's (extraposition 1|0)
  - work in progress here as well! :-)

# Analysis: Production Time

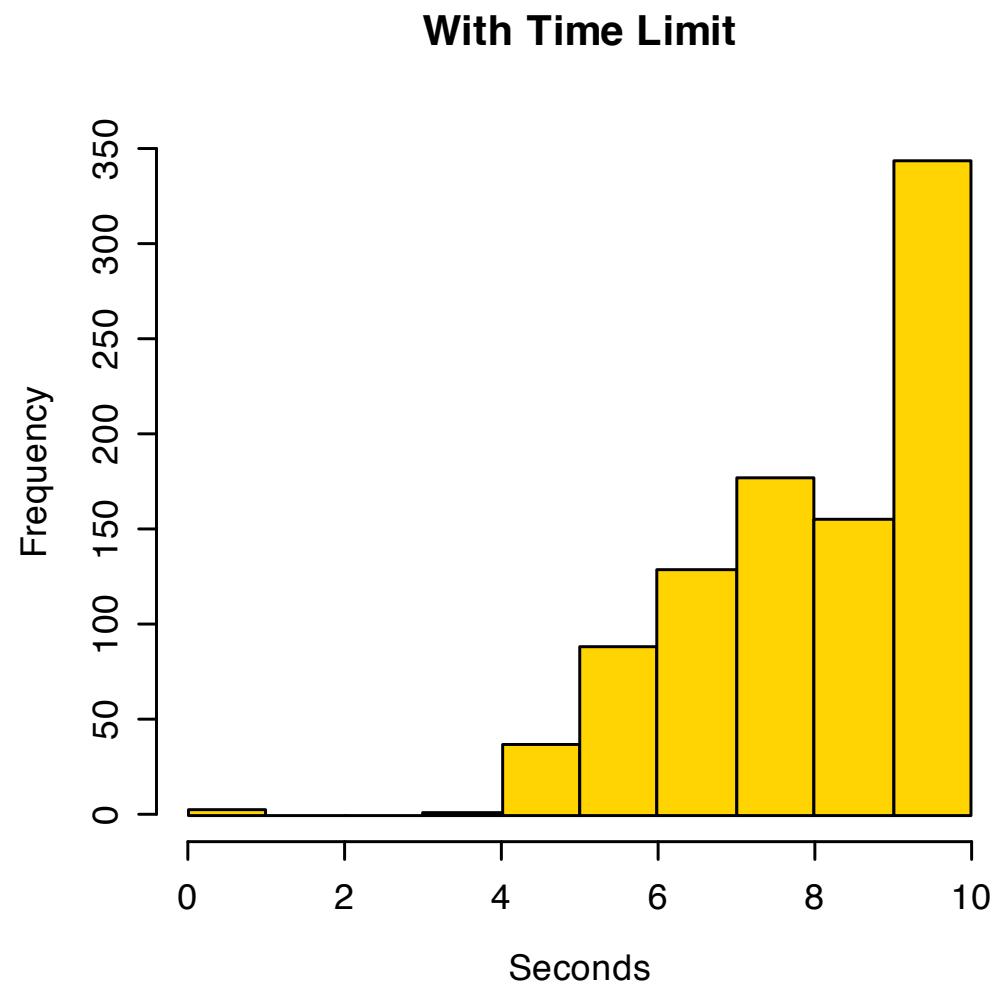
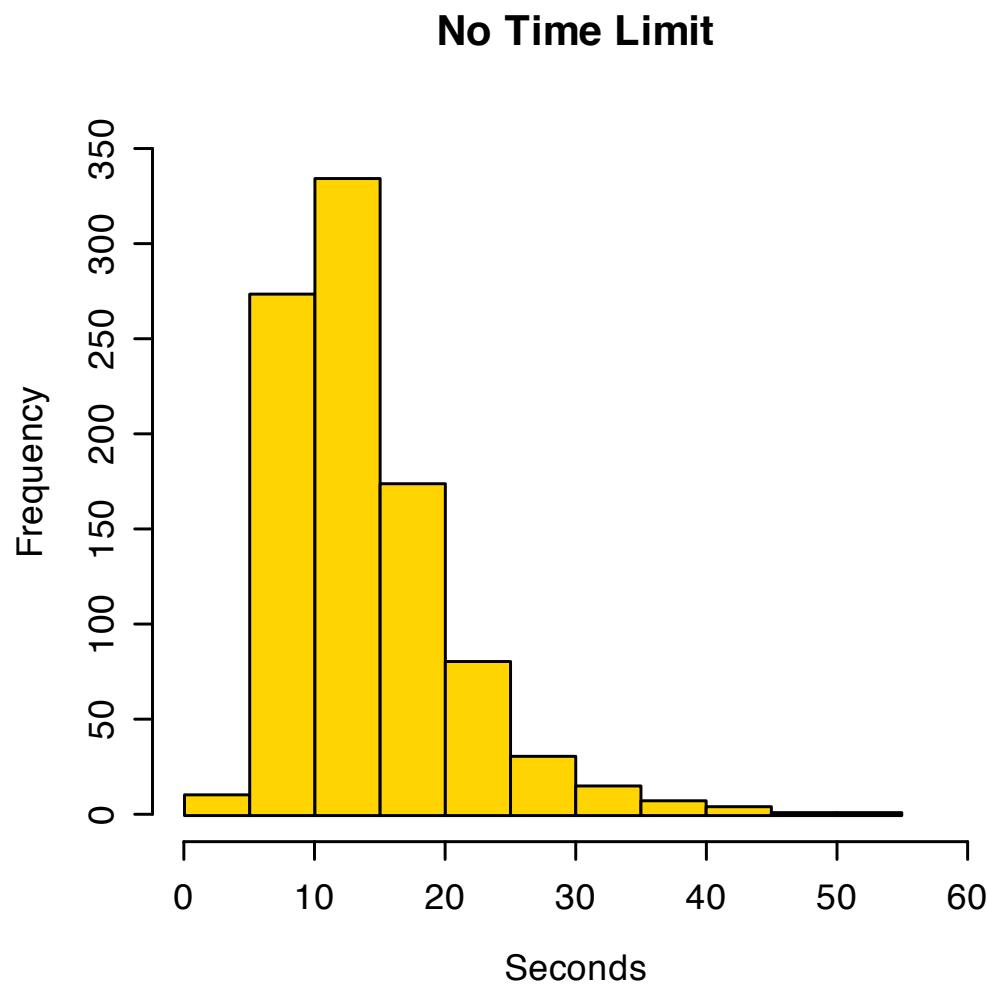
No Time Limit



With Time Limit



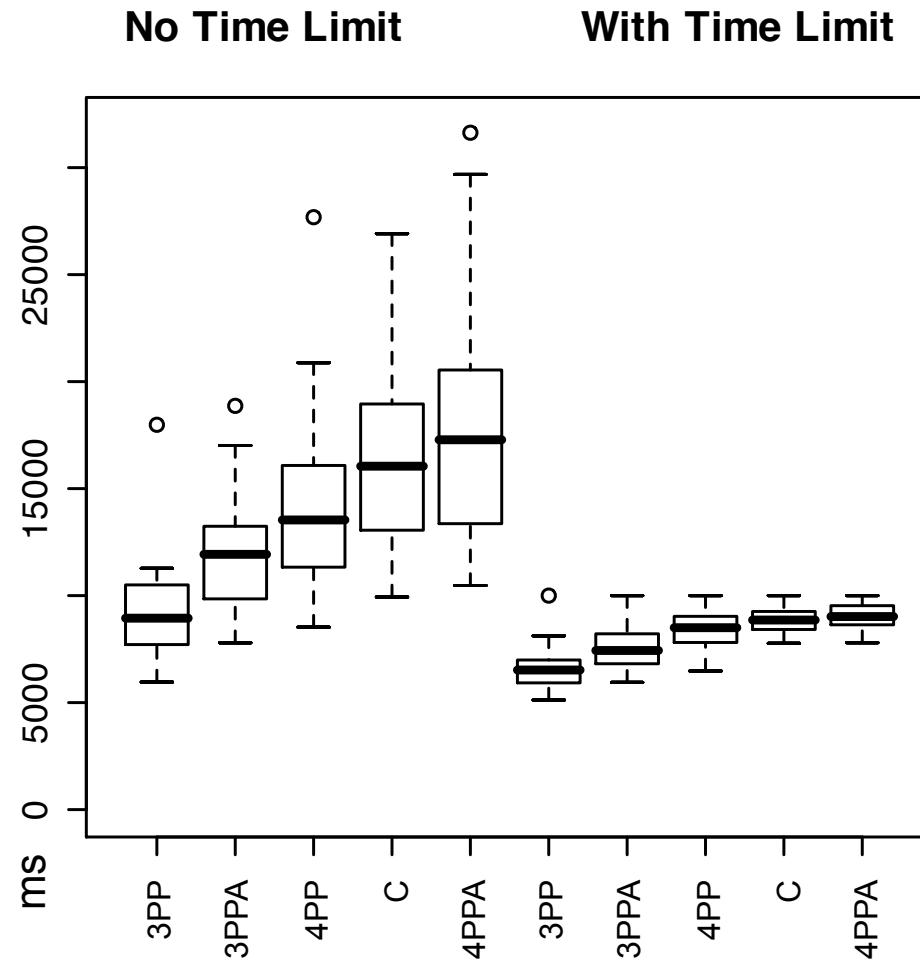
# Analysis: Production Time



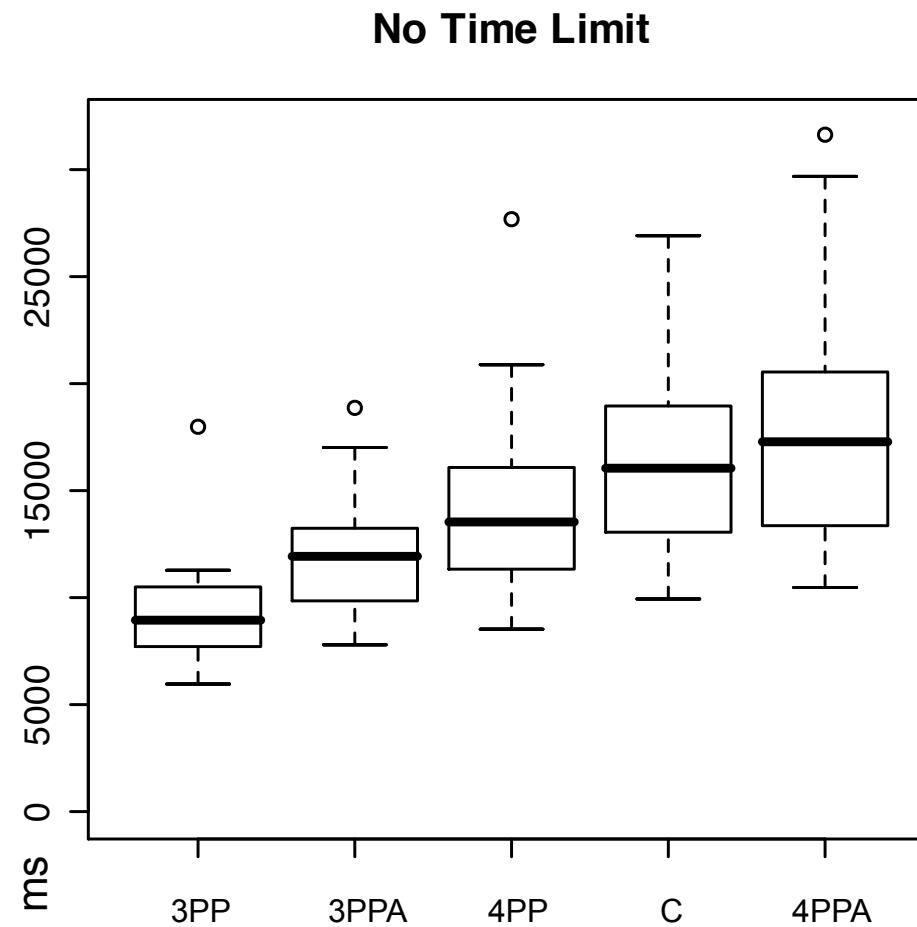
# Analysis: Production Time

- We would have liked to use a repeated measures ANOVA test.
- We can't because the data set doesn't meet some of the assumptions
- The ratio  $\sigma_{\text{Max}}/\sigma_{\text{Min}}$  should be 2 or less, in any case absolutely not higher than 3.
- The  $\sigma_{\text{Max}}/\sigma_{\text{Min}}$  ratio of our data set is higher than 16

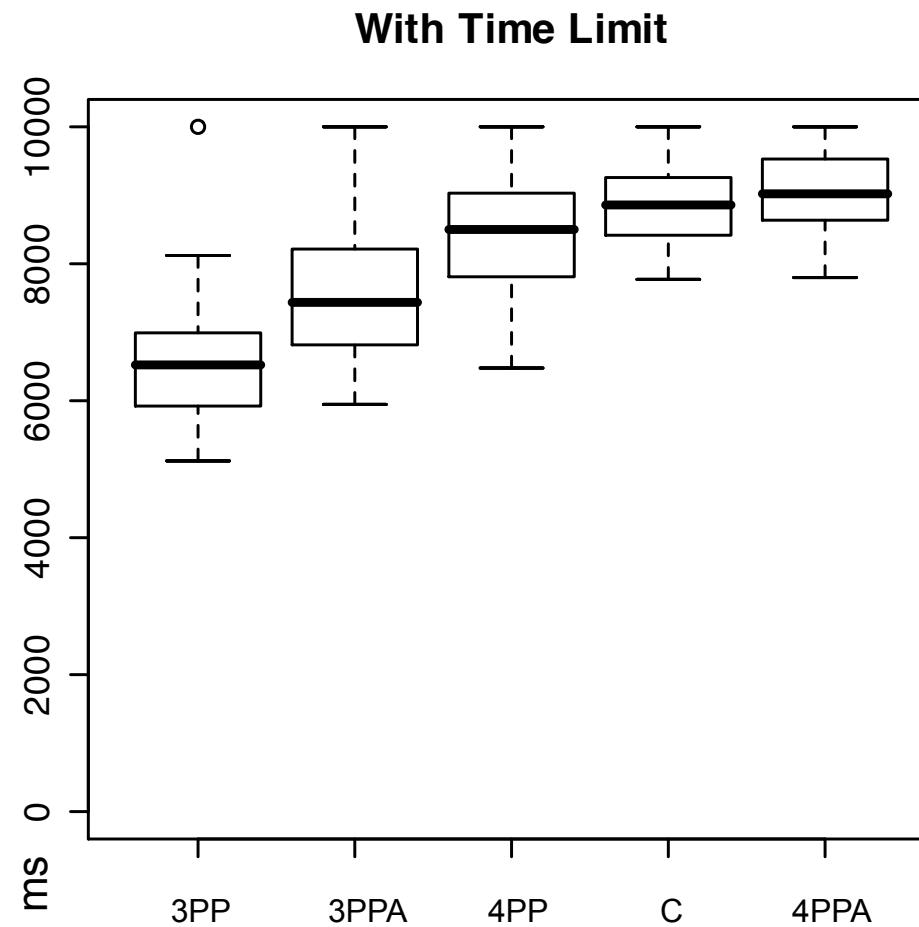
# Analysis: Production Time



# Analysis: Production Time



# Analysis: Production Time



# Analysis: Production Time

- We use a non parametric test as a fall-back to prove that there is a significant difference between the production times in the different conditions of the experiment.
- We deal with related samples and therefore we used the Wilcoxon signed rank test
- ... But: **how do we deal with the orthogonality of the design underlying our data?**

# Wilcoxon signed rank test

We compare two related groups

Subject	X1	X2
1	78	68
2	30	25
3	52	56
4	84	68
5	64	62
6	45	48
7	22	36
8	72	32
9	78	78
10	64	68
11	50	40
12	50	44
13	24	24
14	64	56
15	90	58
16	40	20

# Wilcoxon signed rank test

Calculate the difference between the two groups

Subject	X1	X2	X1 - X2
1	78	68	10
2	30	25	5
3	52	56	-4
4	84	68	16
5	64	62	2
6	45	48	-3
7	22	36	-14
8	72	32	40
9	78	78	0
10	64	68	-4
11	50	40	10
12	50	44	6
13	24	24	0
14	64	56	8
15	90	58	32
16	40	20	20

Mark the **positive** values  
in order to be able to  
keep track of them later

# Wilcoxon signed rank test

Assume the absolute magnitude of the differences and order them from the smallest to the largest

Subject	X1	X2	X1 - X2	absolute X1 - X2
9	78	78	0	0
13	24	24	0	0
5	64	62	2	2
6	45	48	-3	3
3	52	56	-4	4
10	64	68	-4	4
2	30	25	5	5
12	50	44	6	6
14	64	56	8	8
1	78	68	10	10
11	50	40	10	10
7	22	36	-14	14
4	84	68	16	16
16	40	20	20	20
15	90	58	32	32
8	72	32	40	40

# Wilcoxon signed rank test

Rank (1...2...3...4...n...) the ordered values

Subject	X1	X2	X1 - X2	absolute X1 - X2	rank of absolute
9	78	78	0	0	xxx
13	24	24	0	0	xxx
5	64	62	2	2	1
6	45	48	-3	3	2
3	52	56	-4	4	3,5
10	64	68	-4	4	3,5
2	30	25	5	5	5
12	50	44	6	6	6
14	64	56	8	8	7
1	78	68	10	10	8,5
11	50	40	10	10	8,5
7	22	36	-14	14	10
4	84	68	16	16	11
16	40	20	20	20	12
15	90	58	32	32	13
8	72	32	40	40	14

**Tied values** receive the **average** of their ranks and if there are **differences which give 0** as a result they are **discarded** (e.g. N - 2) before ranking the list

# Wilcoxon signed rank test

Put the positive and negative signs back where they belong in the rank

Subject	X1	X2	X1 - X2	absolute	rank of absolute	signed rank
9	78	78	0	0	xxx	xxx
13	24	24	0	0	xxx	xxx
5	64	62	2	2	1	+1
6	45	48	-3	3	2	-2
3	52	56	-4	4	3,5	-3,5
10	64	68	-4	4	3,5	-3,5
2	30	25	5	5	5	+5
12	50	44	6	6	6	+6
14	64	56	8	8	7	+7
1	78	68	10	10	8,5	+8,5
11	50	40	10	10	8,5	+8,5
7	22	36	-14	14	10	-10
4	84	68	16	16	11	+11
16	40	20	20	20	12	+12
15	90	58	32	32	13	+13
8	72	32	40	40	14	+14

# Wilcoxon signed rank test

The test statistic ( $W+$ ) is the sum of the ranks of the **positive differences**

Subject	X1	X2	X1 - X2	absolute	rank of absolute	signed rank
9	78	78	0	0	xxx	xxx
13	24	24	0	0	xxx	xxx
5	64	62	2	2	1	+1
6	45	48	-3	3	2	-2
3	52	56	-4	4	3,5	-3,5
10	64	68	-4	4	3,5	-3,5
2	30	25	5	5	5	+5
12	50	44	6	6	6	+6
14	64	56	8	8	7	+7
1	78	68	10	10	8,5	+8,5
11	50	40	10	10	8,5	+8,5
7	22	36	-14	14	10	-10
4	84	68	16	16	11	+11
16	40	20	20	20	12	+12
15	90	58	32	32	13	+13
8	72	32	40	40	14	+14

**W+ = 86**

**N = 14**

# Wilcoxon signed rank test

<b>W+ = 86</b>
<b>N = 14</b>

To determine the significance-levels belonging to the **W+** value, the number of ranked cases is important

With the **W+** and **N**, we can find the belonging significance in statistical tables, in this case :

two-tailed  $p = .035$

one-tailed  $p = .018$

# Wilcoxon signed rank test

More importantly: where do we find the Wilcoxon Signed Rank Test in SPSS?

The screenshot shows the SPSS Data Editor interface. On the left, there is a data view window containing a table with columns labeled 'subject' and 'x1'. The 'Analyze' menu is open, and the 'Nonparametric Tests' option is selected, revealing a submenu with options like Chi-Square..., Binomial..., Runs..., 1-Sample K-S..., 2 Independent Samples..., K Independent Samples..., 2 Related Samples..., and K Related Samples... The '2 Related Samples...' option is highlighted with a blue selection bar. To the right of the menu, a 'Two-Related-Samples Tests' dialog box is displayed. It contains fields for 'Test Pair(s) List' (with variables '# subject', '# x1', and '# x2'), 'Current Selections' (Variable 1: and Variable 2:), and 'Test Type' (checkboxes for Wilcoxon, Sign, McNemar, and Marginal Homogeneity, with 'Wilcoxon' checked). Buttons for OK, Paste, Reset, Cancel, and Help are also present. A callout box in the bottom right corner of the dialog box contains the text: 'Tick the box 'Wilcoxon' and select the two groups'.

# Analysis: saving the Orthogonality

Main effect Time:

$$(3PP_{NTL} + 3PPA_{NTL} + 4PP_{NTL} + 4PPA_{NTL}) - (3PP_{WTL} + 3PPA_{WTL} + 4PP_{WTL} + 4PPA_{WTL})$$

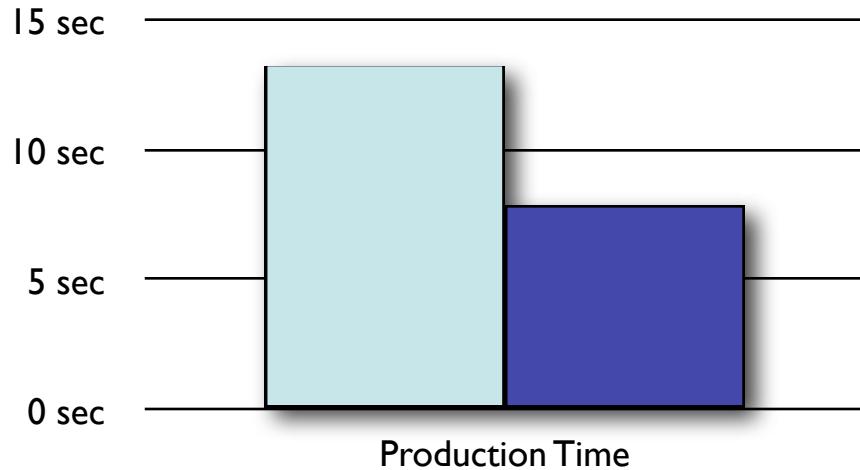
Main effect Length:

$$(3PP_{NTL} + 3PPA_{NTL} + 3PP_{WTL} + 3PPA_{WTL}) - (4PP_{NTL} + 4PPA_{NTL} + 4PP_{WTL} + 4PPA_{WTL})$$

Main effect Adjectives:

$$(3PP_{NTL} + 3PP_{WTL} + 4PP_{NTL} + 4PP_{WTL}) - (3PPA_{NTL} + 3PPA_{WTL} + 4PPA_{NTL} + 4PPA_{WTL})$$

# Analysis: main effect Time



No Time Limit  
 With Time Limit

Descriptive Statistics

	N	Mean	Std. Deviation	Minimum	Maximum
AVGnt	31	13359,68	3373,49487	8718,71	23554,42
AVGwt	31	7884,2594	703,36814	6652,21	10000,00

Ranks

	N	Mean Rank	Sum of Ranks
AVGwt - AVGnt			
Negative Ranks	31 <sup>a</sup>	16,00	496,00
Positive Ranks	0 <sup>b</sup>	,00	,00
Ties	0 <sup>c</sup>		
Total	31		

a. AVGwt < AVGnt

b. AVGwt > AVGnt

c. AVGwt = AVGnt

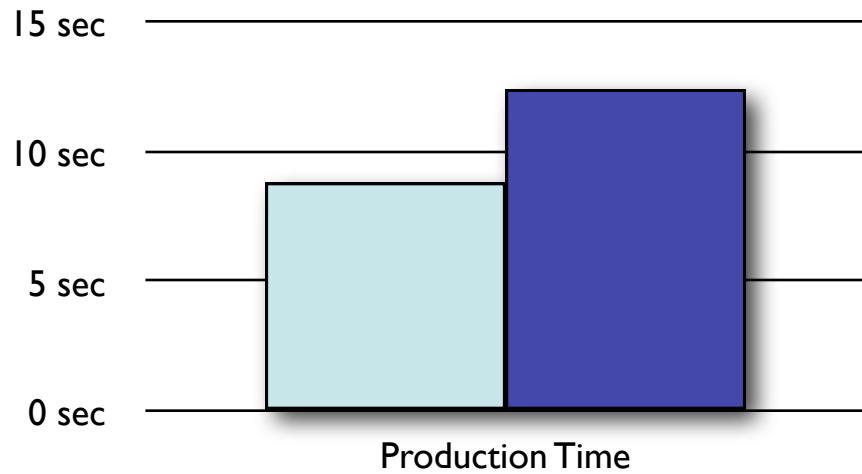
Test Statistics<sup>b</sup>

	AVGwt - AVGnt
Z	-4,860 <sup>a</sup>
Asymp. Sig. (2-tailed)	,000

a. Based on positive ranks.

b. Wilcoxon Signed Ranks Test

# Analysis: main effect Length



3PP       4PP

**Descriptive Statistics**

	N	Mean	Std. Deviation	Minimum	Maximum
AVG3	31	8846,0914	1506,36689	6447,25	13359,21
AVG4	31	12397,85	2396,17346	8923,67	18847,63

**Ranks**

	N	Mean Rank	Sum of Ranks
AVG4 - AVG3 Negative Ranks	0 <sup>a</sup>	,00	,00
Positive Ranks	31 <sup>b</sup>	16,00	496,00
Ties	0 <sup>c</sup>		
Total	31		

a. AVG4 < AVG3

b. AVG4 > AVG3

c. AVG4 = AVG3

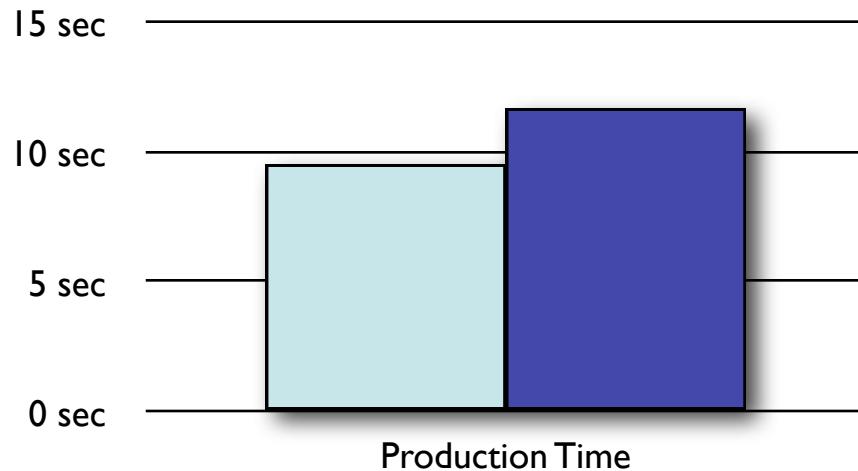
**Test Statistics<sup>b</sup>**

	AVG4 - AVG3
Z	-4,860 <sup>a</sup>
Asymp. Sig. (2-tailed)	,000

a. Based on negative ranks.

b. Wilcoxon Signed Ranks Test

# Analysis: main effect Adjectives



Without Adjectives  
With Adjectives

Descriptive Statistics					
	N	Mean	Std. Deviation	Minimum	Maximum
AVGna	31	9525,1505	1778,02369	6831,46	15392,83
AVGwa	31	11718,79	2157,00985	8539,46	16814,00

Ranks		N	Mean Rank	Sum of Ranks
AVGwa - AVGna	Negative Ranks	0 <sup>a</sup>	,00	,00
	Positive Ranks	31 <sup>b</sup>	16,00	496,00
	Ties	0 <sup>c</sup>		
	Total	31		

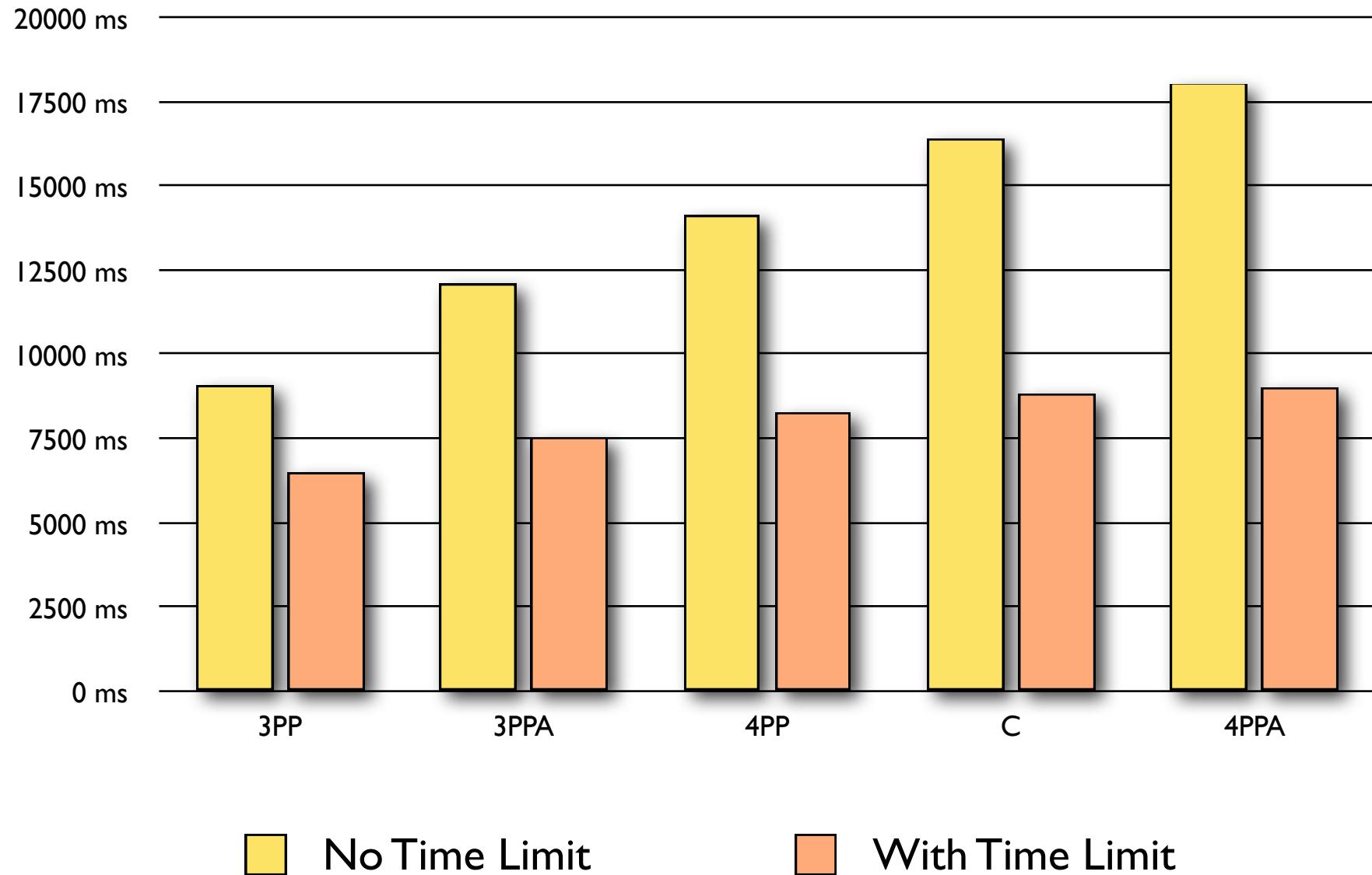
- a. AVGwa < AVGna
- b. AVGwa > AVGna
- c. AVGwa = AVGna

Test Statistics<sup>b</sup>

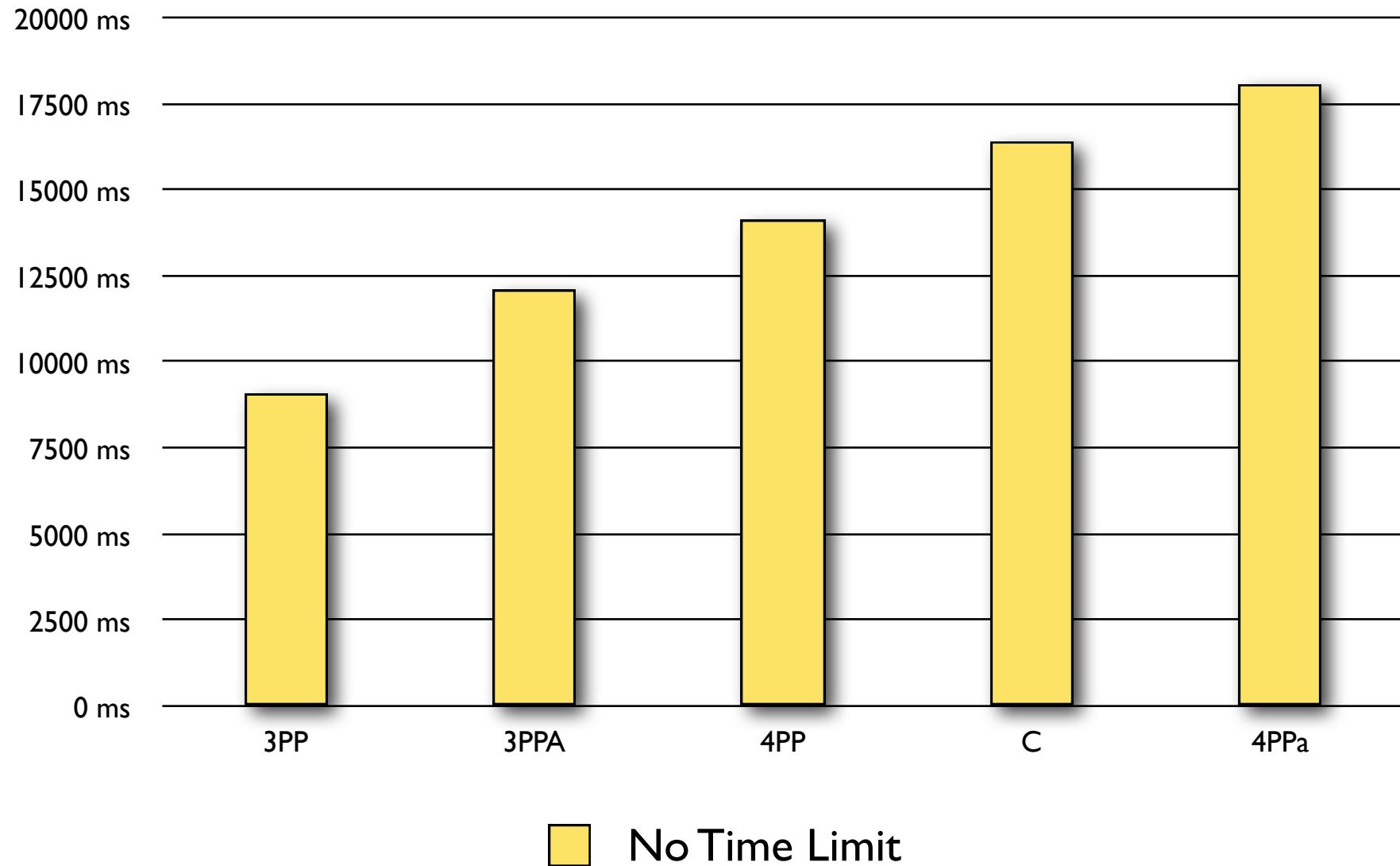
	AVGwa - AVGna
Z	-4,860 <sup>a</sup>
Asymp. Sig. (2-tailed)	,000

- a. Based on negative ranks.
- b. Wilcoxon Signed Ranks Test

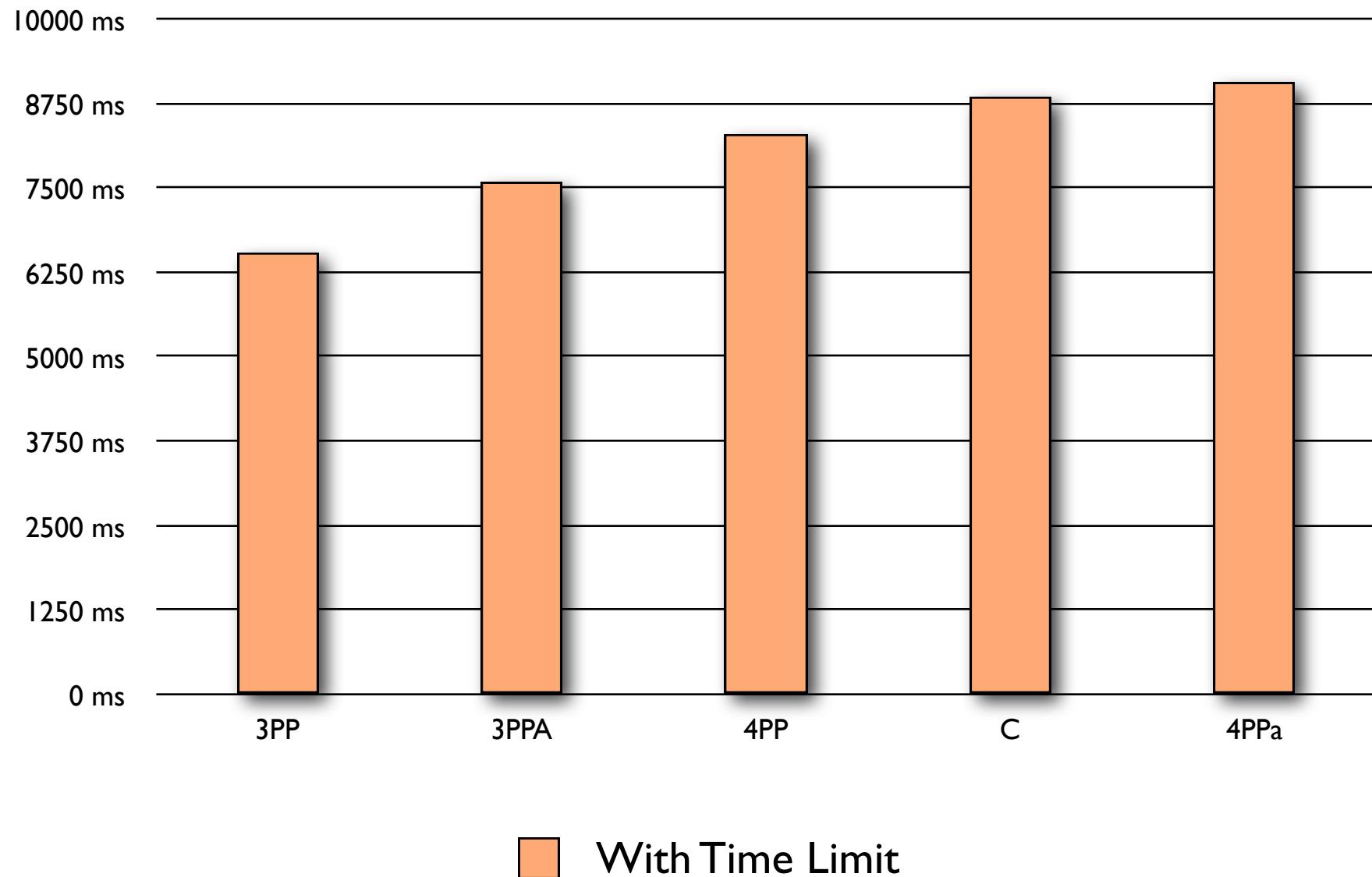
# Analysis: Production Time



# Analysis: Production Time



# Analysis: Production Time



# Analysis: saving the Orthogonality

An interaction is the difference of differences

In a hypothetical scenario where we would have had an interaction on length for the main effect of time, we would have used the following formula before computing the Wilcoxon test statistic:

$$(3PP_{NTL} + 3PPA_{NTL} - 4PP_{NTL} - 4PPA_{NTL}) - (3PP_{WTL} + 3PPA_{WTL} - 4PP_{WTL} - 4PPA_{WTL})$$

# Analysis: Extrapolations

Descriptive Statistics

	N	Mean	Std. Deviation
NT_3	25	,4269	,19906
NT_3A	25	,4531	,15627
NT_4	25	,5355	,27426
NT_C	25	,4691	,18528
NT_4A	25	,4661	,23046
WT_3	25	,3532	,22732
WT_3A	25	,4361	,24020
WT_4	25	,4905	,25981
WT_C	25	,4345	,25798
WT_4A	25	,4795	,26289
tNT_3	31	9104,9194	2287,58431
tNT_3A	31	12132,19	2798,94298
tNT_4	31	14129,28	4096,21171
tNT_C	31	16411,18	4260,66288
tNT_4A	31	18072,33	5404,30409
tWT_3	31	6549,4247	952,40346
tWT_3A	31	7597,8333	1002,76396
tWT_4	31	8316,9785	929,82306
tWT_C	31	8853,0215	669,52479
tWT_4A	31	9072,8011	589,08713
Valid N (listwise)	25		

$$\sigma_{\max} / \sigma_{\min} = 1.75$$

Within-Subjects Factors

Measure: MEASURE\_1

time	length	adj	Dependent Variable
1	1	1	NT_3
		2	NT_3A
2	1	1	NT_4
		2	NT_4A
2	1	1	WT_3
		2	WT_3A
2	1	1	WT_4
		2	WT_4A

Between-Subjects Factors

	N
Span H	11
L	13
M	1

# Analysis: Extrapolations

## Tests of Within-Subjects Contrasts

Measure: MEASURE\_1

Source	time	length	adj	Type III Sum of Squares	df	Mean Square	F	Sig.
time	Linear			,007	1	,007	,221	,643
time * Span	Linear			,026	2	,013	,386	,684
Error(time)	Linear			,740	22	,034		
length	Linear			,162	1	,162	6,161	,021
length * Span	Linear			,017	2	,009	,330	,722
Error(length)	Linear			,580	22	,026		
adj	Linear			,099	1	,099	2,495	,129
adj * Span	Linear			,154	2	,077	1,951	,166
Error(adj)	Linear			,869	22	,039		
time * length	Linear	Linear		,023	1	,023	,845	,368
time * length * Span	Linear	Linear		,095	2	,047	1,750	,197
Error(time*length)	Linear	Linear		,597	22	,027		
time * adj	Linear	Linear		,006	1	,006	,108	,745
time * adj * Span	Linear	Linear		,002	2	,001	,022	,978
Error(time*adj)	Linear	Linear		1,221	22	,055		
length * adj	Linear	Linear		,017	1	,017	,882	,358
length * adj * Span	Linear	Linear		,005	2	,003	,137	,873
Error(length*adj)	Linear	Linear		,421	22	,019		
time * length * adj	Linear	Linear	Linear	,085	1	,085	2,054	,166
time * length * adj * Span	Linear	Linear	Linear	,186	2	,093	2,251	,129
Error(time*length*adj)	Linear	Linear	Linear	,910	22	,041		

## Tests of Between-Subjects Effects

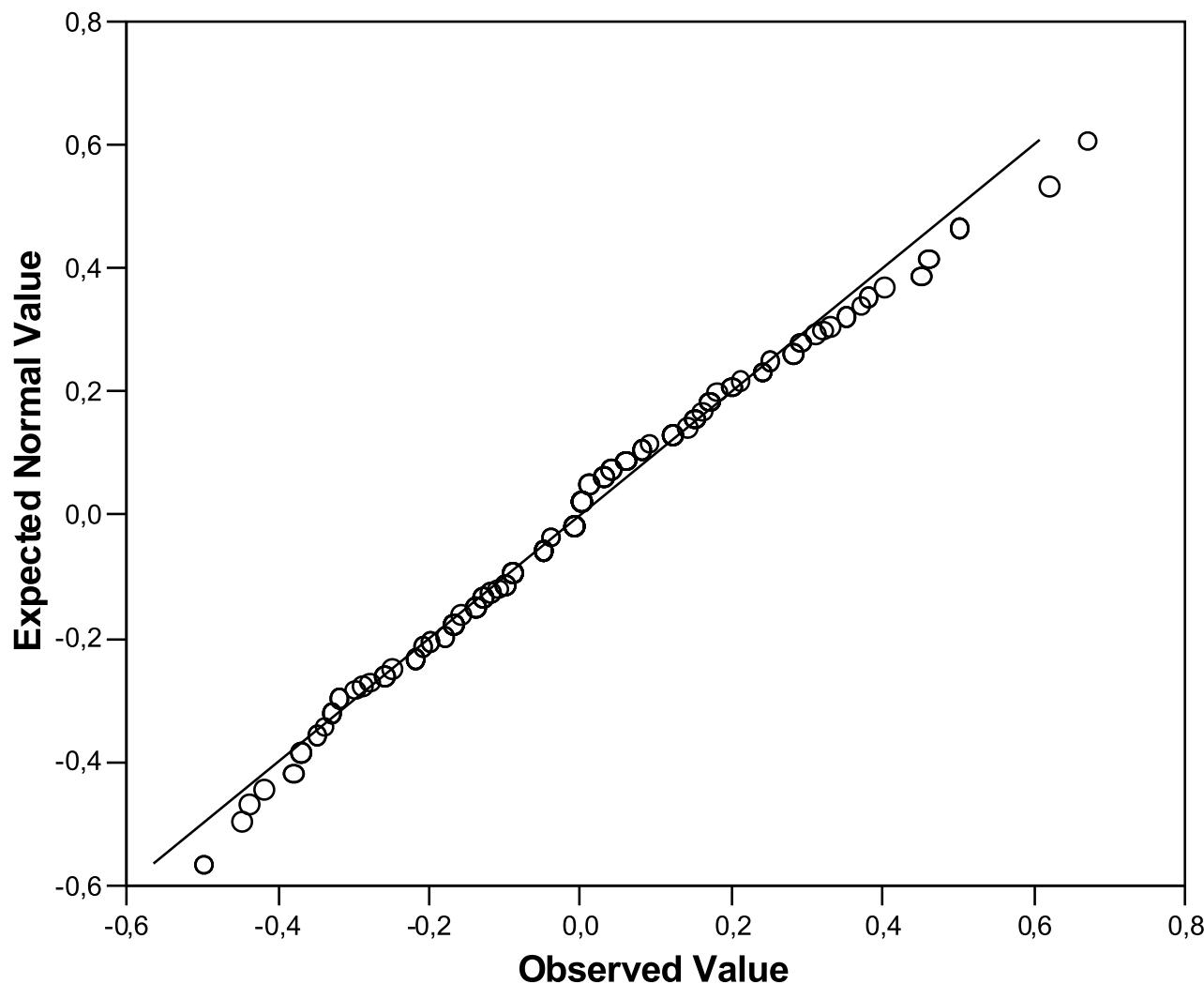
Measure: MEASURE\_1

Transformed Variable: Average

Source	Type III Sum of Squares	df	Mean Square	F	Sig.
Intercept	14,199	1	14,199	69,222	,000
Span	,184	2	,092	,449	,644
Error	4,513	22	,205		

# Analysis: Extrapolations

Normal Q-Q Plot of RESIDUALS



# Analysis: Extrapolations

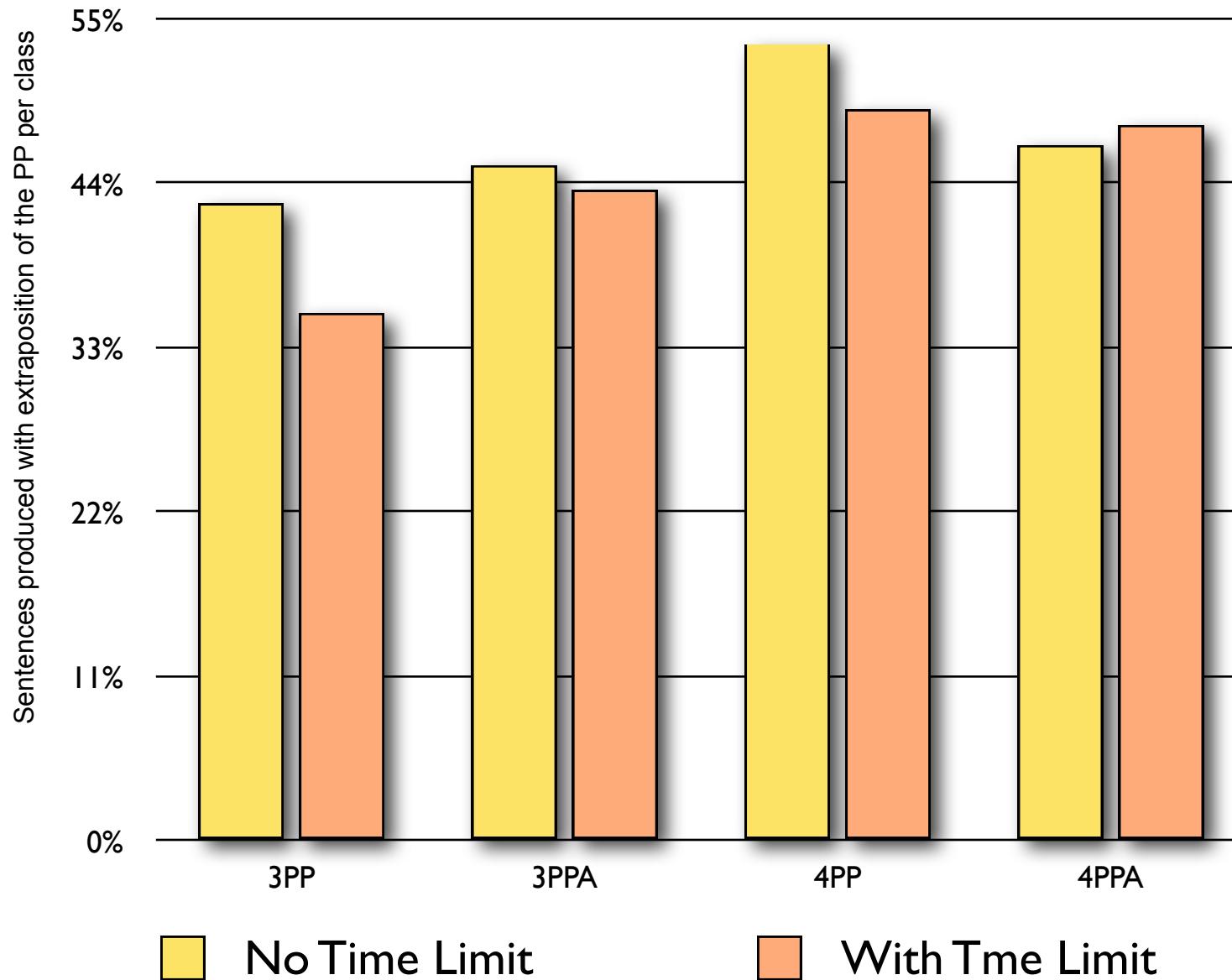
## Tests of Within-Subjects Contrasts

Measure: MEASURE\_1

Source	time	length	adj	Type III Sum of Squares	df	Mean Square	F	Sig.
time	Linear			,047	1	,047	1,463	,238
Error(time)	Linear			,766	24	,032		
length	Linear			,286	1	,286	11,467	,002
Error(length)	Linear			,598	24	,025		
adj	Linear			,003	1	,003	,060	,808
Error(adj)	Linear			1,023	24	,043		
time * length	Linear	Linear		,011	1	,011	,378	,544
Error(time*length)	Linear	Linear		,692	24	,029		
time * adj	Linear	Linear		,041	1	,041	,812	,377
Error(time*adj)	Linear	Linear		1,223	24	,051		
length * adj	Linear	Linear		,112	1	,112	6,317	,019
Error(length*adj)	Linear	Linear		,426	24	,018		
time * length * adj	Linear	Linear	Linear	6,722E-06	1	6,722E-06	,000	,990
Error(time*length*adj)	Linear	Linear	Linear	1,096	24	,046		



# Analysis: Extrapolations



# Analysis: Time & Extrapolations

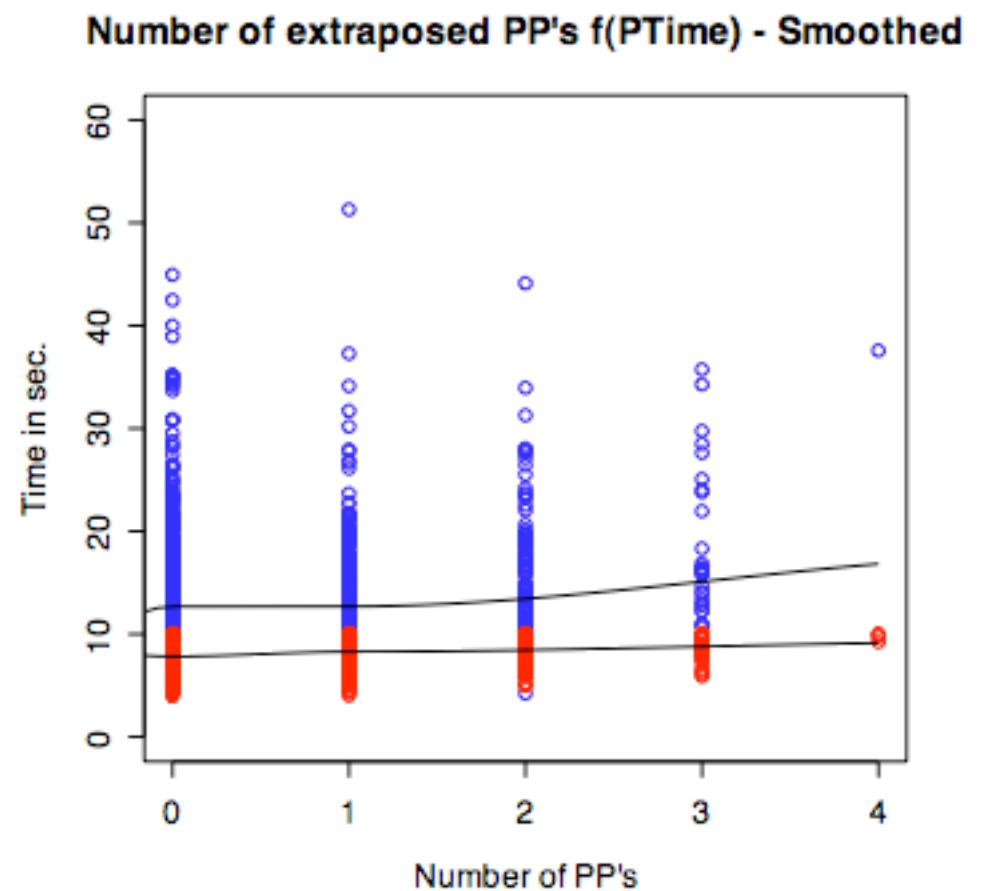
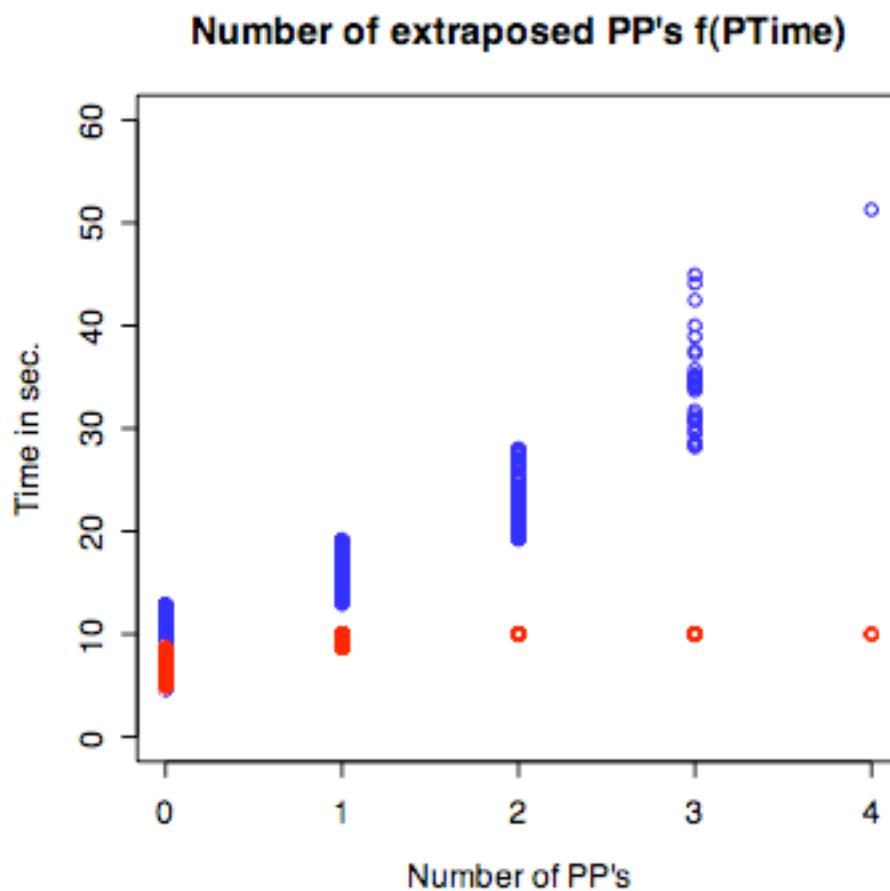
Production time and amount of the extrapolations in the sentences correlate

Correlations

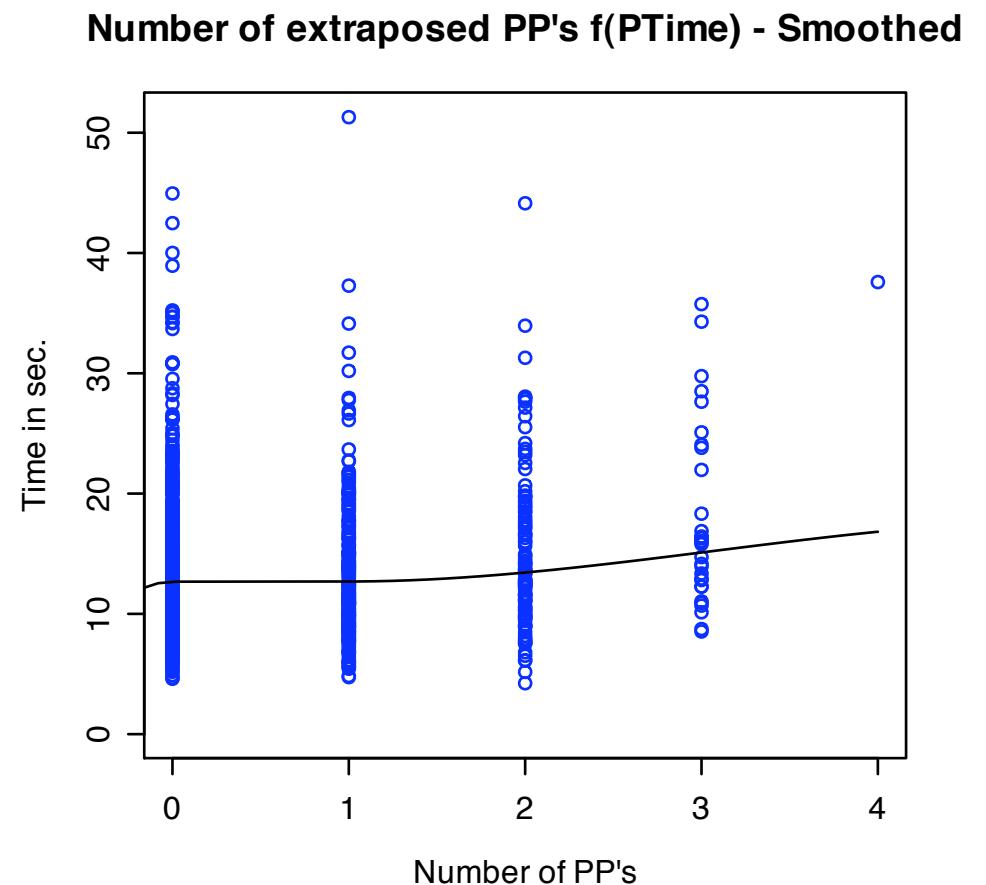
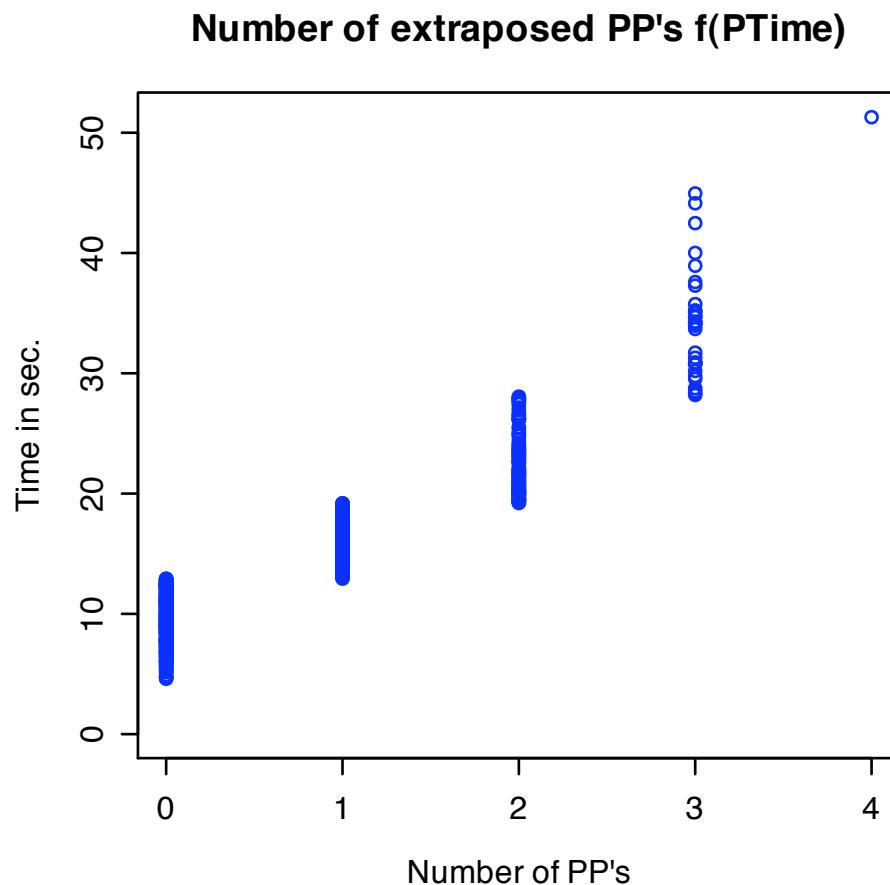
		Number of extrapolated PP's	Sentence Production Time
Number of extrapolated PP's	Pearson Correlation	1	,094**
	Sig. (2-tailed)		,000
	N	1477	1477
Sentence Production Time	Pearson Correlation	,094**	1
	Sig. (2-tailed)	,000	
	N	1477	1860

\*\*. Correlation is significant at the 0.01 level (2-tailed).

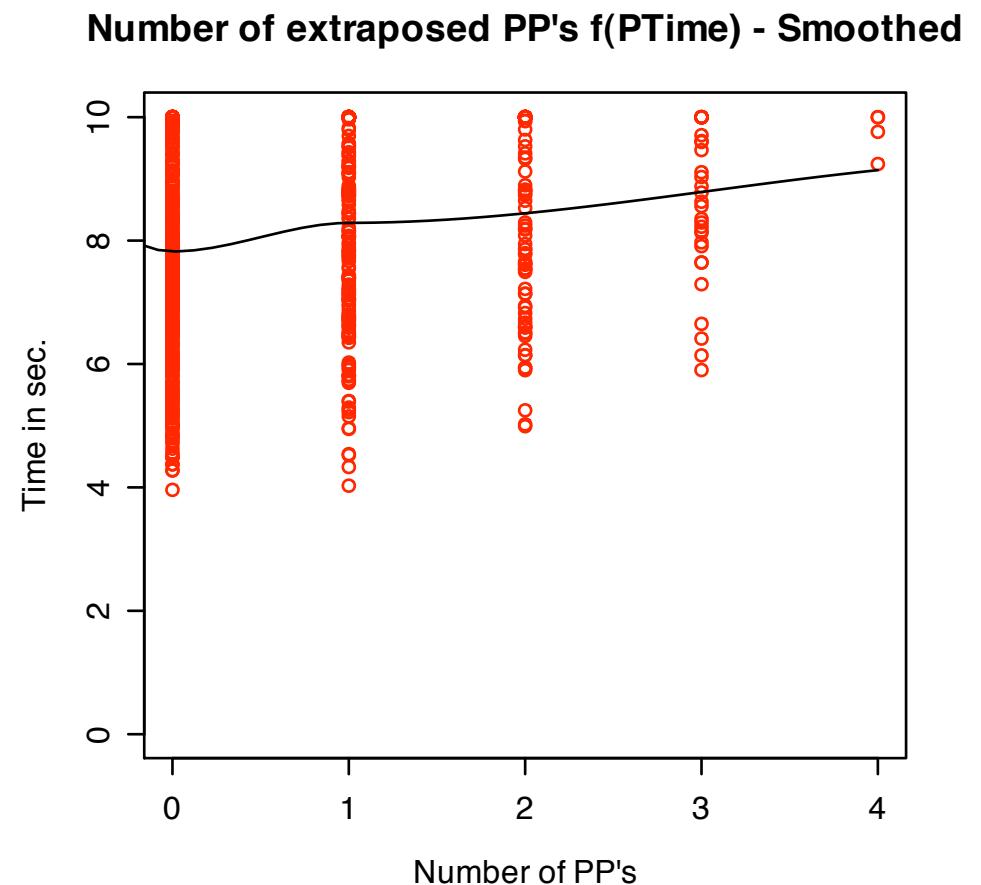
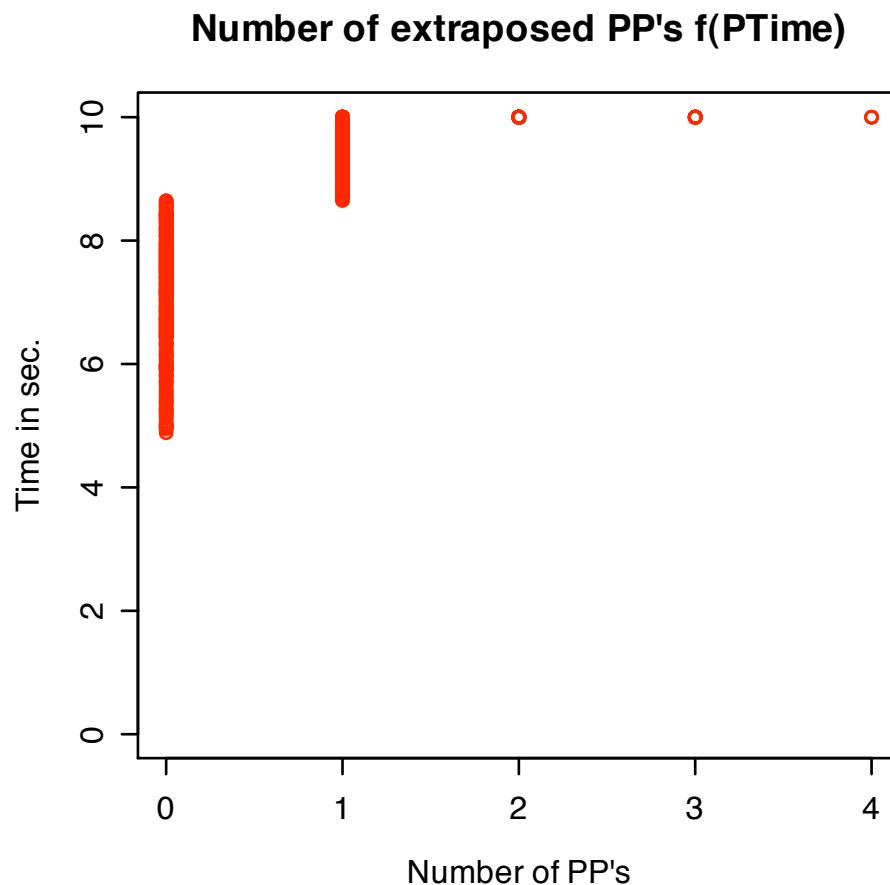
# Analysis: Time & Extrapolations



# Analysis: Time & Extrapolations



# Analysis: Time & Extrapolations



# Conclusion

Work in progress:

- Complete the latin square
- Transcribe the sentences produced
- Statistical analysis of the Check vs. the 4PPA
- Statistical analysis of the kind of PP's extraposed
- Many more exploratory statistics possible...
  - NTL version + WTL version of 8 sec.
  - Topicalized PP's within our actual dataset
  - Any suggestion?