## Critical update on the manuscript "Distributional Effects of Frequency in Pronoun Processing"

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This is a critical update to an unpublished manuscript on a study that we reported at the 24th annual CUNY Human Sentence Processing Conference titled "Distributional Effects of Frequency in Pronoun Processing". In the manuscript we reported that reading times for pronouns are impacted by the frequency of their antecedents: pronouns with infrequent antecedents were read more slowly, suggesting that pronoun processing involves reaccess to the lexical representation of the antecedent. We showed this in two experiments, using both common noun and proper name antecedents, and we also showed that the parallel frequency effect extended to the distribution of reading times in ex-Gaussian analyses. This result was surprising in light of earlier findings by van Gompel and Majid [van Gompel, R.P.G. & Majid, A. (2004). Antecedent frequency effects during the processing of pronouns. Cognition, 90, 255-264], which had argued that pronoun processing showed an inverse frequency effect (a prominence effect in their terms). However, as we tried to further understand the discrepancy between our findings and those of van Gompel and Majid (vG&M), we discovered an error in the script that we had used to process the eyetracking data. This error specifically affected reading times beyond the first line of text in multi-line materials, especially with the configuration that we had used in our studies, following vG&M. After correcting this error, the reanalysis of our two previous experiments and a new experiment that consisted of a full replication of vG&M showed that the problem had systematically affected measurements in critical regions, and that the key claim of our earlier manuscript was incorrect: we find no clear evidence for antecedent frequency effects on pronoun processing. We sincerely apologize for any inconvenience that our error has caused. Meanwhile, since only the reading times in the second line of our two-line experimental items were affected, the results we reported for the antecedent region (which was always located in the first line) are unchanged. Here we summarize briefly the actual findings from our three experiments. In brief:

- Frequency effects at the antecedent nouns were consistent across all three experiments.
- Effects of antecedent frequency following the pronoun were inconsistent across the three experiments, sometimes showing no effect, sometimes a frequency effect, and sometimes a prominence/inverse-frequency effect. We do not consistently find the frequency effect that we previously reported. Nor do we find consistent evidence for the prominence effect that vG&M reported. This includes the new Experiment 3, a direct replication of their study.
- All effects of frequency on fixation distributions at the antecedent are the same as we originally reported.

In what follows we describe the specific results and statistical analyses in more detail.

## **Results Summary**

Previous results (van Gompel and Majid, 2004 Cognition)

In a previous paper in 2004, van Gompel and Majid reported an inverse effect of antecedent lexical frequency in pronoun resolution: pronouns referring to infrequent antecedents had shorter reading times than pronouns referring to frequent antecedents, and this effect was found in first fixation and first pass times at the post-anaphor region. Following their terminology we refer to this effect as a prominence effect.

In contrast, in two eyetracking experiments we reported a rather different pattern. We observed a direct frequency effect: pronouns referring to infrequent antecedents elicited longer reading times than pronouns referring to frequent antecedents. This effect was observed in the post-anaphor region in first fixation, first-pass and total times. In what follows, we will refer to this effect as an *antecedent frequency effect*. We observed this pattern in an experiment that used an extended dataset including vG&M's original materials (*Experiment 1*), and in a follow-up experiment which manipulated antecedent type, and contained both common noun and proper name antecedents (*Experiment 2*). We also performed distributional analysis of first-fixation times in Experiment 1, and reported that the effect of antecedent lexical frequency was only observed on the tail ( $\tau$ ) of the fixation distributions, and that this pattern was strikingly similar in the antecedent and post-anaphor regions.

## Re-analyzed results from previous manuscript

In addition to re-analyzing our two previous experiments, we conducted a full replication of the experiment by vG&M, using the same items and fillers. Below is the summary of the reanalyses and the full replication.

In the re-analyzed results from Experiment 1 we found an effect of lexical frequency at the antecedent region (significant in first-fixation, first-pass and total times), consistently with our manuscript and the results of vG&M. However, there were no effects of lexical frequency in either the anaphor or the post-anaphor region. Therefore, we did not observe either an antecedent frequency effect or the prominence effect that was reported by vG&M. Table 1 shows the mean reading times by condition, and Table 2 shows the statistics calculated using linear mixed effects modeling. To be consistent with our manuscript, we split the experimental items into those taken from vG&M, the new items we created, and the results from the first 10 items in each condition, to rule out effects of having a large number of trials per condition (n=40). Lastly, we also re-did the distributional analyses of firstfixation times at the antecedent and post-anaphor region. Since only the reading times in the second line of our 2-line experimental items were affected by the script error, the distributional results we reported for the antecedent region (which was always located in the first line) are unchanged: lexical frequency only affects the tail of the first-fixation distributions. The results in the post-anaphor region, however, were different from our previous report - we did not observe an effect of antecedent frequency either in the non-parametric vincentiles (Figure 1) or the parameters resulting from fitting the ex-Gaussian distribution (Table 3).

In Experiment 2 we used a  $2 \times 2$  design with antecedent type (common noun vs. proper name) and antecedent frequency (high vs. low) as within-subjects factors. Each frequency pair of common nouns used in Experiment 1 was paired with a pair of proper names. After re-analyzing our results, we found a lexical frequency effect at the antecedent, both in the common noun and proper name conditions, and it was again significant in the three measures of interest. Unlike our previous report, we now found a prominence effect consistent with vG&M in the post-anaphor region: the region was read more quickly when the antecedent was an infrequent word. This effect was only significant in first-fixation times and was obtained both in the combined analysis of the proper noun and common name conditions and also when they were analyzed separately. To be consistent with our manuscript, we also analyzed reading times in the pronoun+2 region, and this revealed a marginally significant antecedent frequency effect consistent with our previous results. This effect, however, was only present in first-fixation times in the proper name condition. Therefore, there was a contrast between the effects we observed in the immediate post-anaphor region (where we found a prominence effect) and the pronoun+2 region (where we found a frequency effect). The means for Experiment 2 are shown in Table 4, and the statistical analysis in Table 5.

Finally, we conducted a full replication of vG&M's original experiment (n=32). (We are grateful to Roger van Gompel for sharing the materials from his study with us.) Following vG&M's study, we used a 2 × 2 design with antecedent frequency (high vs. low) and anaphor type (repeated NP vs. pronoun) as within-subjects factors. At the antecedent region, infrequent words were read more slowly than frequent words, and this was significant in the three measures of interest. Also, the results of this experiment replicated vG&M's previous findings in the repeated noun conditions, where we found clear frequency effects in the anaphor and post-anaphor regions. This was significant in first-pass and total times (although the effect was only marginal in first-pass in the post-anaphor region); consistent with vG&M's previous findings, the repeated name frequency effect was smaller than the antecedent frequency effect. In the pronoun conditions in the post-anaphor region, however, there were no effects of frequency in any of the three measures, contrary to vG&M's main finding. Therefore, the results of the third experiment showed neither a prominence effect nor an antecedent frequency effect. The only effect found in the pronoun conditions was obtained at the pronoun region itself, and showed the direction of an antecedent frequency effect: pronouns with infrequent antecedents had longer first-fixation times than pronouns with frequent antecedents. The effect, however, was only marginally significant. The means for Experiment 3 are shown in Table 6, and the statistical analysis in Table 7.

To summarize: (1) the reanalyzed results do not change the previously described effects of noun antecedent frequency while reading sentences, and the new results from the full replication are consistent qualitatively and quantitatively. (2) The reanalyzed and new results on the effect of antecedent frequency on pronoun reading times show little consistency with either our previous reports or with vG&M's, and do not clearly point to consistent effects of antecedent frequency on reading times during coreference resolution: only one of the three experiments shows a prominence-type effect similar to vG&M, while a different experiment shows a marginal antecedent frequency effect similar to our previous report. (3) Finally, we found that repeated NPs show attenuated frequency effects in their reading times, consistent with vG&M.

## Updated tables and figures

|                |            | First-fixation duration |      | First-pas | s duration | Total time |      |  |
|----------------|------------|-------------------------|------|-----------|------------|------------|------|--|
|                | Region     | Low                     | High | Low       | High       | Low        | High |  |
| All items      | Antecedent | 244                     | 229  | 329       | 270        | 542        | 413  |  |
|                | Pronoun    | 221                     | 229  | 247       | 259        | 335        | 338  |  |
|                | Pronoun+1  | 217                     | 222  | 252       | 262        | 358        | 362  |  |
| VG&M items     | Antecedent | 249                     | 224  | 339       | 256        | 583        | 405  |  |
|                | Pronoun    | 217                     | 223  | 239       | 254        | 325        | 337  |  |
|                | Pronoun+1  | 216                     | 224  | 244       | 257        | 359        | 362  |  |
| New items      | Antecedent | 241                     | 233  | 323       | 280        | 512        | 420  |  |
|                | Pronoun    | 223                     | 233  | 252       | 264        | 342        | 340  |  |
|                | Pronoun+1  | 218                     | 221  | 259       | 267        | 358        | 362  |  |
| First 10 items | Antecedent | 247                     | 228  | 356       | 279        | 631        | 477  |  |
|                | Pronoun    | 222                     | 232  | 254       | 274        | 356        | 376  |  |
|                | Pronoun+1  | 217                     | 217  | 258       | 259        | 376        | 409  |  |

Table 1. Averages in first fixation duration, first-pass duration, and total time across critical regions in **Experiment 1.** 

|                |            | First- | fixation d | uration | Firs       | First-pass duration |         |        | Total time |         |  |  |
|----------------|------------|--------|------------|---------|------------|---------------------|---------|--------|------------|---------|--|--|
|                | Region     | β (ms) | CI (ms)    | Pr(β<0) | β (ms)     | CI (ms)             | Pr(β<0) | β (ms) | CI (ms)    | Pr(β<0) |  |  |
| 411            | A . 1 .    | 16     | [0.22]     | - 01    | <i>c</i> 1 | [46.76]             | - 01    | 127    | [110 162]  | - 01    |  |  |
| All items      | Antecedent | 16     | [9,23]     | <.01    | 61         | [46,76]             | <.01    | 137    | [110,163]  | <.01    |  |  |
|                | Pronoun    | -9     | [-18,0]    | 0.97    | -14        | [-28,0]             | 0.97    | -3     | [-24,18]   | 0.61    |  |  |
|                | Pronoun+1  | -6     | [-12,1]    | 0.96    | -12        | [-26,1]             | 0.96    | -4     | [-25,18]   | 0.65    |  |  |
| vG&M items     | Antecedent | 26     | [14,37]    | <.01    | 81         | [59,105]            | <.01    | 179    | [137,220]  | <.01    |  |  |
|                | Pronoun    | -7     | [-20,6]    | 0.86    | -17        | [-37,5]             | 0.94    | -10    | [-41,23]   | 0.73    |  |  |
|                | Pronoun+1  | -8     | [-18,2]    | 0.94    | -12        | [-29,4]             | 0.93    | -1     | [-34,31]   | 0.53    |  |  |
| New items      | Antecedent | 9      | [-1,18]    | <.05    | 48         | [27,69]             | <.01    | 105    | [69,138]   | <.01    |  |  |
|                | Pronoun    | -10    | [-22,4]    | 0.92    | -12        | [-31,7]             | 0.89    | 3      | [-25,30]   | 0.41    |  |  |
|                | Pronoun+1  | -4     | [-13,4]    | 0.83    | -12        | [-32,7]             | 0.89    | -7     | [-36,22]   | 0.69    |  |  |
| First 10 items | Antecedent | 18     | [3,33]     | <.01    | 79         | [47,113]            | <.01    | 170    | [107,220]  | <.01    |  |  |
|                | Pronoun    | -11    | [-30,6]    | 0.91    | -24        | [-52,5]             | 0.95    | -19    | [-66,28]   | 0.80    |  |  |
|                | Pronoun+1  | 1      | [-12,12]   | 0.47    | 3          | [-26,29]            | 0.47    | -29    | [-79,16]   | 0.90    |  |  |

Table 2. Statistics for first fixation, first-pass and total time measures in **Experiment 1.** Reliable effects are in bold font, marginal effects with .05 are in bold and italic font.

| Region     | Variable         | Mean | μ   | σ  | τ   |
|------------|------------------|------|-----|----|-----|
|            | Low              | 244  | 171 | 28 | 76  |
| Antecedent | High             | 229  | 180 | 35 | 50  |
|            | Frequency effect | 15   | -9  | -7 | 26  |
|            | Low              | 221  | 162 | 27 | 57  |
| Pronoun    | High             | 229  | 162 | 25 | 58  |
|            | Frequency effect | -8   | 0   | 2  | -1  |
|            | Low              | 217  | 166 | 32 | 50  |
| Pronoun+1  | High             | 222  | 175 | 35 | 37  |
|            | Frequency effect | 5    | 9   | 3  | -13 |

Table 3. Fitted ex-Gaussian parameter values in **Experiment 1**, along with the sample means for comparison. Reliable differences are in bold.

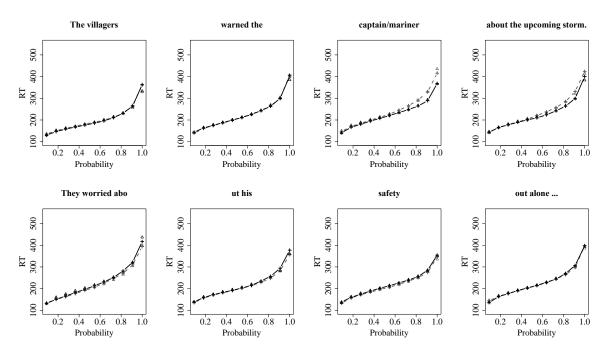


Figure 1. Predicted ex-Gaussian density plots based on parameter values averaged across participants from **Experiment 1.** The high frequency condition is plotted as a solid line, and the low frequency condition is plotted as a dashed line. The regions of interest are the antecedent (*captain/mariner*), anaphor (*ut his*) and post-anaphor (*safety*) regions.

|             | First fixation duration |      | First-pas | s duration | Total time |      |  |
|-------------|-------------------------|------|-----------|------------|------------|------|--|
| Region      | Low                     | High | Low       | High       | Low        | High |  |
| Common noun |                         |      |           |            |            |      |  |
| Antecedent  | 265                     | 239  | 345       | 278        | 612        | 459  |  |
| Pronoun     | 253                     | 260  | 281       | 295        | 375        | 389  |  |
| Pronoun+1   | 235                     | 247  | 275       | 278        | 382        | 368  |  |
| Pronoun+2   | 260                     | 254  | 302       | 305        | 420        | 432  |  |
| Proper name |                         |      |           |            |            |      |  |
| Antecedent  | 260                     | 240  | 289       | 257        | 480        | 399  |  |
| Pronoun     | 254                     | 257  | 286       | 290        | 401        | 401  |  |
| Pronoun+1   | 234                     | 244  | 265       | 273        | 400        | 400  |  |
| Pronoun+2   | 259                     | 249  | 309       | 300        | 449        | 450  |  |

Table 4. Averages in first fixation duration, first-pass duration, and total time across critical regions in Experiment 2.

|             | First fixation duration |          |         | Firs   | First-pass duration |         |        | Total time |         |  |
|-------------|-------------------------|----------|---------|--------|---------------------|---------|--------|------------|---------|--|
| Region      | β (ms)                  | CI (ms)  | Pr(β<0) | β (ms) | CI (ms)             | Pr(β<0) | β (ms) | CI (ms)    | Pr(β<0) |  |
| Common noun |                         |          |         |        |                     |         |        |            |         |  |
| Antecedent  | 26                      | [13,38]  | <.01    | 67     | [47,88]             | <.01    | 157    | [114,200]  | <.01    |  |
| Pronoun     | -5                      | [-21,10] | 0.26    | -11    | [-32,11]            | 0.15    | -11    | [-45,22]   | 0.26    |  |
| Pronoun+1   | -10                     | [-22,1]  | <.05    | -1     | [-21,18]            | 0.46    | 11     | [-19,43]   | 0.24    |  |
| Pronoun+2   | 5                       | [-8,18]  | 0.22    | -4     | [-21,14]            | 0.34    | -12    | [-36,21]   | 0.25    |  |
| Proper name |                         |          |         |        |                     |         |        |            |         |  |
| Antecedent  | 21                      | [8,34]   | <.01    | 33     | [16,49]             | <.01    | 87     | [49,123]   | <.01    |  |
| Pronoun     | -2                      | [-16,13] | 0.40    | -3     | [-22,18]            | 0.42    | 0      | [-34,34]   | 0.49    |  |
| Pronoun+1   | -8                      | [-19,1]  | <.05    | -6     | [-23,12]            | 0.25    | 4      | [-34,41]   | 0.43    |  |
| Pronoun+2   | 10                      | [-3,22]  | 0.06    | 11     | [-9,31]             | 0.14    | -3     | [-45,35]   | 0.43    |  |

Table 5. Statistics for first fixation, first-pass and total time measures in **Experiment 2.** Reliable effects are in bold font, marginal effects with .05 are in bold and italic font.

|                                    | Region     |          |              |
|------------------------------------|------------|----------|--------------|
|                                    | Antecedent | Anaphor  | Post-anaphor |
| First fixation times               |            |          |              |
| Pronoun- frequent antecedent       | 241�(6)    | 247 (5)  | 233頃5)       |
| Pronoun- infrequent antecedent     | 2721(7)    | 255 (7)  | 240頃5)       |
| Repeated NP- frequent antecedent   | 249�(6)    | 234 (5)  | 24545)       |
| Repeated NP- infrequent antecedent | 2781(8)    | 239 (5)  | 2521(5)      |
| First pass times                   |            |          |              |
| Pronoun- frequent antecedent       | 2931(9)    | 2723(7)  | 2691(8)      |
| Pronoun- infrequent antecedent     | 3741(13)   | 2891(10) | 268頃8)       |
| Repeated NP- frequent antecedent   | 29449)     | 30749)   | 275頃8)       |
| Repeated NP- infrequent antecedent | 3811(15)   | 3281(10) | 2901(10)     |
| Total times                        |            |          |              |
| Pronoun- frequent antecedent       | 488421)    | 4111(18) | 3944118)     |
| Pronoun- infrequent antecedent     | 637422)    | 4191(19) | 408🗓17)      |
| Repeated NP- frequent antecedent   | 486421)    | 4641(21) | 390415)      |
| Repeated NP- infrequent antecedent | 6451(25)   | 515[[22] | 4281(24)     |

Table 6. Averages in first fixation duration, first-pass duration, and total time across critical regions in **Experiment 3.** 

| First fixation duration |                      |  | Firs   | First-pass duration   |   |   | Total time   |  |  |
|-------------------------|----------------------|--|--|---|---|---|--|--|--|
| β (ms)                  | CI (ms)              | Pr(β<0)  | β (ms)   | CI (ms)   | Pr(β<0)   | β (ms)  | CI (ms)  | Pr(β<0)  |  |
|                         |                      |  |  |   |   |   |  |  |  |
| 31                      | [13,48]              | <.01   | 80   | [50,110]  | <.01  | 149   | [94,203]   | <.01   |  |
| 8                       | [-7,23]              | 0.16   | 17   | [-7,40]   | <.08  | 3   | [-41,48]   | 0.44   |  |
| 7                       | [-8,21]              | 0.18   | 0  | [-21,20]  | 0.51  | 15  | [-28,59]   | 0.25   |  |
|                         |                      |  |  |   |   |   |  |  |  |
| 28                      | [10,47]              | <.01   | 87   | [55,117]  | <.01  | 161   | [101,221]  | <.01   |  |
| 5                       | [-7,17]              | 0.20   | 23   | [-1,46]   | <.05  | 52  | [4,102]  | <.05   |  |
| 6                       | [-7,20]              | 0.18   | 18   | [-5,39]   | <07   | 44  | [-4,90]  | <.05   |  |
|                         | β (ms)  31 8 7  28 5 | β (ms) CI (ms)  31 [13,48] 8 [-7,23] 7 [-8,21]  28 [10,47] 5 [-7,17] | 31 [13,48] <.01<br>8 [-7,23] 0.16<br>7 [-8,21] 0.18<br>28 [10,47] <.01<br>5 [-7,17] 0.20 | β (ms)     CI (ms)     Pr(β<0)     β (ms)       31     [13,48]     <.01 | β (ms)         CI (ms)         Pr(β<0)         β (ms)         CI (ms)           31         [13,48]         <.01 | β (ms)         CI (ms)         Pr(β<0)         β (ms)         CI (ms)         Pr(β<0)           31         [13,48]         <.01 | β (ms)         CI (ms)         Pr(β<0)         β (ms)         CI (ms)         Pr(β<0)         β (ms)           31         [13,48]         <.01 | β (ms)         CI (ms)         Pr(β<0)         β (ms)         CI (ms)         Pr(β<0)         β (ms)         CI (ms)           31         [13,48]         <.01 |  |

Table 7. Statistics for first fixation, first-pass and total time measures in **Experiment 3.** Reliable effects are in bold font, marginal effects with .05 are in bold and italic font.