# Cue Confusion and Distractor Prominence Can Explain Inconsistent Interference Effects

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Current assumptions about cue-based memory retrieval mechanisms in sentence processing (e.g., Lewis & Vasishth, 2005) (LV05) explain only a subset of interference effects from structurally inaccessible distractors observed in dependency resolution. We present (i) a literature review that compares observed patterns of effects in anaphoric and subject-verb dependencies and (ii) a cue-based retrieval model extended with **Distractor Prominence and Cue Confusion** that offers a principled explanation of hitherto unexplained effects.

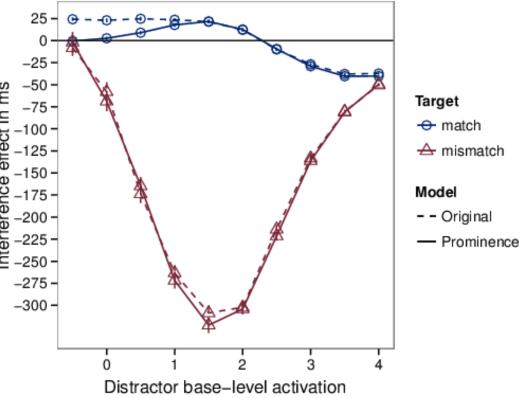
For comparability with other dependency types, we relabeled the comparisons of number agreement studies.

| a. <b>Target-match</b> ; <i>distractor-match</i>   | Target-Match O  |    |
|--|---|----|
| (Reflexive)The surgeon $^{+masc}_{+c-com}$ who treated $Jonathan^{+masc}_{-c-com}$ had pricked himself $^{masc}_{c-com}$ (Agreement)The key $^{+sing}_{+locSubj}$ to the $cabinet^{+sing}_{-locSubj}$ was $^{sing}_{locSubj}$ rusty from many years of disuse.   | Partial feature-overlap between<br>target and distractor.<br>Standard cue-based retrieval (LV05) predicts | •  |
| b. <b>Target-match</b> ; distractor-mismatch<br>(Reflexive) The <b>surgeon</b> <sup>+masc</sup> <sub>+c-com</sub> who treated Jennifer <sup>-masc</sup> <sub>-c-com</sub> had pricked <b>himself</b> <sup>masc</sup> <sub>c-com</sub><br>(Agreement) The <b>key</b> <sup>+sing</sup> <sub>+locSubj</sub> to the cabinets <sup>-sing</sup> <sub>-locSubj</sub> <b>was</b> <sup>sing</sup> <sub>locSubj</sub> rusty from many years of disuse. | similarity-based interference.  | •  |
| c. <b>Target-mismatch</b> ; <i>distractor-match</i>  | Target-Mismatch 🛆   |    |
| (Reflexive)The surgeon $^{-fem}_{+c-com}$ who treated $Jennifer^{+fem}_{-c-com}$ had pricked herself $^{fem}_{c-com}$ (Agreement)The keys $^{-sing}_{+locSubj}$ to the $cabinet^{+sing}_{-locSubj}$ was $^{sing}_{locSubj}$ rusty from many years of disuse.   | No feature-overlap between<br>target and distractor.  | Pı |
| d. Target-mismatch: distractor-mismatch  | Standard cue-based retrieval (LVO5) predicts  | Δ  |

## Principle 1: Distractor Prominence

The strength of similarity-based interference (inhibition) caused by a distractor depends on its activation level in relation to the target (distractor prominence). This predicts:

- Weaker effects in target-match than in target-mismatch ("grammatical ymmetry", Wagers, 2009).
- fects generally increase with higher stractor base-level activation.
- cilitation in target-match for very high stractor activation.



ver

### -175--200--225 -\_250 --275 --300 -

## nciple 2: Cue Confusion

(Reflexive)

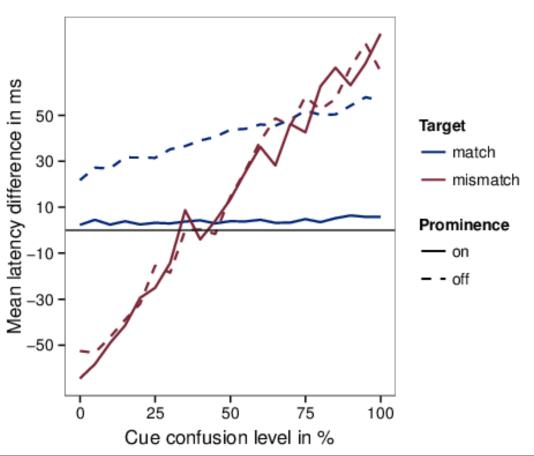
facilitatory misretrievals of the distractor.

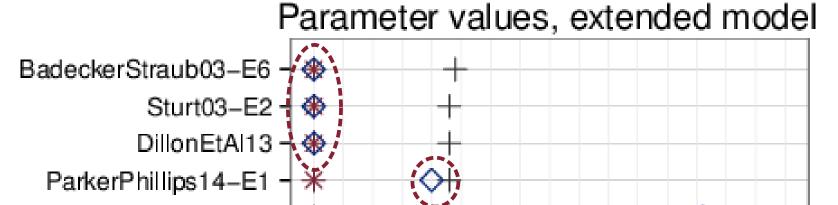
The surgeon  $^{-fem}_{+c-com}$  who treated  $Jonathan ^{-fem}_{-c-com}$  had pricked herself  $^{fem}_{c-com}$  ... The  $\mathbf{keys}_{+locSubj}^{-sing}$  to the cabinets $_{-locSubj}^{-sing}$   $\mathbf{was}_{locSubj}^{sing}$  rusty from many years of disuse. (Agreement)

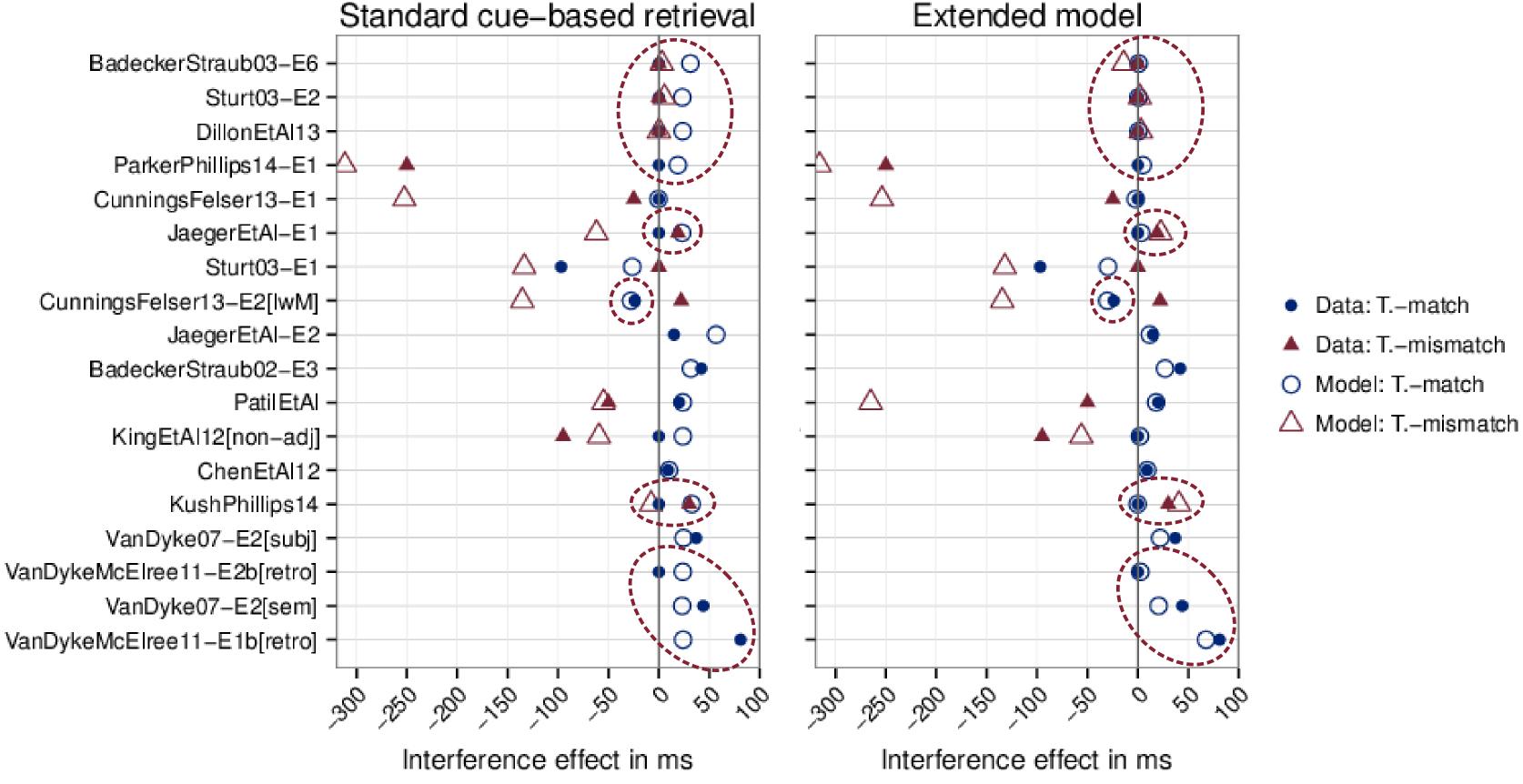
|              | Publication  | Lang.  | Method   | Cue                                    | Interf.                               | Distractor  | Target-match 🔿   | Target-r  | mismatch 📐  | no need to treat them separately.  |  |
|--------------|--|--|--|--|---------------------------------------|---|--|---|---|--|--|
| B<br>S       | Reflexives   |  |  |  | Type                                  | Position  | Effect AOI   | Effect  | AOI   | E.g., the correct target for reciprocals (each   |  |
|              | Nicol&Swinney '89<br>Badecker&Straub '02 Exp5<br>•Badecker&Straub '02 Exp6<br>•Sturt '03 Exp2<br>King et al. '12 adjacent  | ${f EN} {f $ | Primg<br>SPR<br>SPR<br>ET<br>ET  | gend<br>gend<br>gend<br>gend<br>gend   | pro<br>pro<br>pro<br>retro<br>retro   | subj.,obj.<br>Gen.<br>prep.obj.<br>obj.(topic)<br>obj.                | n.s.<br>n.s.<br>n.s.<br>n.s.<br>n.s.<br>n.s.   | n.s.<br>n.s.  |   | <i>other</i> ) invariantly is required to have features<br>+plur and +c-com, while English reflexives<br>( <i>himself / herself / themselves</i> ) vary in their<br>number and gender requirement. |  |
| ende         | <ul> <li>Dillon et al. '13</li> <li>Parker&amp;Phillips '14 Exp1<br/>Exp2<br/>Exp3</li> </ul>  | EN<br>EN   | $\begin{array}{l} \mathrm{ET} \\ \mathrm{ET} \ (\mathrm{TFT}) \\ \mathrm{ET} \ (\mathrm{TFT}) \\ \mathrm{ET} \ (\mathrm{TFT}) \end{array}$ | numb<br>num/gen<br>num/ani<br>gen/anin | im pro                                | obj.<br>subj.<br>subj.<br>subj.                                       | n.s.<br>n.s.<br>n.s.<br>n.s.   |   | crit  | This leads to a crossed association (an increased cue confusion level) between cues and features for +c-com and +plur in reciprocals, $\begin{bmatrix} \frac{10}{50} \\ -30 \\ -50 \end{bmatrix}$  |  |
| )ep          | <ul> <li>Cunnings&amp;Felser '13 Exp1</li> <li>Jäger et al. (subm.) Exp1<br/>Xiang et al. '09</li> <li>Sturt '03 Exp1</li> <li>Cunnings&amp;Felser '13 Exp2 [lwM]</li> </ul> | EN<br>CN<br>EN<br>EN   | ET (FPRT)<br>ET (FPRT)<br>EEG<br>ET (RRT)<br>ET (FFD)  | gend<br>anim<br>gend<br>gend<br>gend   | pro<br>retro<br>retro<br>pro<br>retro | subj.<br>subj.  | $ \begin{array}{c c} n.s. \\ n.s. \\ \hline -97 \text{ ms} \\ -24 \text{ ms} \\ \end{array} \begin{array}{c} \text{Facilitation in} \\ \text{target-match} \\ \text{post} \\ \text{crit} \end{array} $ | (-25  ms)<br>+19 ms<br>(+1.26  µV)<br>n.s.<br>(+22  ms) | post<br>crit<br>\$\$00-1000 ms<br>crit                              | which causes similarity-based interference in<br>target-mismatch conditions and, therefore,<br>predicts inhibitory effects.  |  |
| C            | <ul> <li>Jäger et al. (subm.) Exp2</li> <li>Badecker&amp;Straub '02 Exp3</li> <li>Patil et al. unpublished</li> </ul>  | CN<br>EN<br>EN   | ET (FPRT)<br>SPR<br>ET (FPRP)  | anim<br>gend<br>gend                   | pro<br>pro<br>retro                   | 3MemLd<br>subj.<br>subj.  | $\begin{array}{c} +15 \text{ ms} & \text{crit} \\ +42 \text{ ms} & \text{post} \\ +6.74\% & \text{crit} \end{array}$   | n.s.  | Inhibition in<br>target-mismatch                                    | Simulation Parameters  |  |
| )T           | Prepositional Reflexives   |  |  | -                                      |                                       | -   |  |   |   | Retrieval latency factor was in both models adjusted for experimental method.  |  |
| bhc          | •King et al. '12 non-adjacent<br>Clackson&Heyer '14  | EN<br>EN   | ET (FPRT)<br>VW (target ident.)  | gend<br>) gend                         | retro<br>pro                          | prep.obj.<br>subj.(topic)   | <i>n.s.</i><br><i>inhib</i> 200-600 ms   | $\approx -95$   | crit/   | <b>Distractor base-level activation</b> was in both models adjusted for <b>distractor position</b> :<br>obj. < subj. < discourse-marked subj.  |  |
| nal          | Possessive Reflexives<br>•Chen et al. '12  | CN   | SPR  | anim                                   | retro                                 | subj.   | +9 ms post   |   |   | <b>Cue Confusion level</b> in extended model was adjusted for <b>feature-co-occurrence</b> (reciprocals and Mandarin reflexive <i>ziji</i> ).  |  |
| A            | RECIPROCALS<br>•Kush&Phillips '14  | HI   | SPR  | numb                                   | retro                                 | prep.obj.   | <i>n.s.</i>  | (+30  ms)   | post  | Selected studies marked with • (Number agreement was not included in simulations.)   |  |
|              | Badecker&Straub '02 Exp4   | EN   | SPR  | numb                                   | pro                                   | subj.   | +48  ms  post  |   |   | Parameter values, extended model   |  |
|              | Publication  | La   | ang. Method  |  | Distractor<br>Position                | Sing<br>gram<br><i>Effect</i>   | gular Verb<br>Jungram A<br>AOI Effect AOI  | Plus<br>gram O<br>Effect AOI                            | verb       ungram       I       Effect                              | BadeckerStraub03–E6 + Sturt03–E2 + H   |  |
|              | NUMBER AGREEMENTPearlmutter '00 Exp2[1st distr.]Nicol et al. '97 Exp5[lw-attchmt]  | EI   |  |  | PP,PP<br>obj[lwRC]                    | n.s.  |  | -19  ms crit  |   | DillonEtAl13 + +<br>ParkerPhillips14–E1 - +  |  |
| S            | Wagers et al. '09 $Exp2$   | EI   | N SPR  | pro s                                  | subj                                  | n.s.  |  |   | -58 post  | CunningsFelser13-E1 + C  |  |
| Ū<br>Ū       | Wagers et al. '09 Exp3<br>Dillon et al. '13 Exp1   | EI<br>EI   | N SPR<br>N ET  | *                                      | subj<br>obj                           | n.s.<br>n.s.  | n.s.   | n.s.  | $ \begin{array}{c c} (facil) & post \\ -118 ms & crit \end{array} $ | JaegerEtAl-E1 - (*) OH   |  |
| •            | Lago et al. ' $15 \text{ Exp1}$  | SF   | P SPR  |  | subj                                  | n.s. Distinc  | ctive pattern for  |   | -39  ms  post   | Sturt03–E1 – * Parameters  |  |
| <b>1</b>     | Lago et al. '15 Exp2<br>Lago et al. '15 Exp2   | EI<br>SH   | N SPR<br>P SPR   | -                                      | subj                                  |   | er agreement   |   | -36  ms  post   |  |  |
|              | Lago et al. '15 Exp3B<br>Nicol et al. '97 Exp1   | EI   | N maze   |  | subj<br>PP                            | n.s. $-70  ms$  | crit   | n.s.  | -21  ms  post   |  |  |
|              | Nicol et al. '97 $Exp2$  | EI   |  | _                                      | PP                                    | $-124 \mathrm{ms}$  | sent   | n.s.  |   | BadeckerStraub02–E3 – $*$ + $\diamond$ * Cue conf. level *   |  |
| ld           | Nicol et al. '97 Exp4<br>Nicol et al. '97 Exp5[hg-attchmt]   | EI<br>EI   |  |  | PP<br>obj[hgRC]                       | $\begin{array}{c} -60 \ \mathrm{ms} \\ -67 \ \mathrm{ms} \end{array}$ | sent sent  |   |   | PatilEtAl - + O Distr. activation  |  |
|              | Pearlmutter et al. '99 Exp1  | EI   |  |  | PP                                    | -35  ms   | crit   |   | +19  ms crit  | KingEtAl12[non_adj] - * OF   |  |
| $\Theta$     |  | ירד  |  | 4 T                                    |                                       | -36  ms   | post   |   | -26  ms  post   | ChenEtAl12 + *<br>KushPhillips14 - * * +   |  |
|              | Pearlmutter et al. '99 Exp2<br>Pearlmutter et al. '99 Exp3   | EI<br>EI   |  |  | PP<br>PP                              | $\begin{array}{c} -49 \text{ ms} \\ -36 \text{ ms} \end{array}$       | post<br>crit   | +24  ms  post   | -106  ms crit   |  |  |
| $\mathbf{O}$ | Pearlmutter '00 Exp1[2 distractors   |  |  |  | PP,PP                                 | $-23 \mathrm{ms}$   | crit   | F   |   | VanDyke07–E2[subj] + + O<br>VanDykeMcElree11–E2b[retro] + + O  |  |
|              | Wagers et al. '09 Exp4 $\Lambda$ are $\tilde{a}$ at al. '14  | EI   |  | _                                      | PP<br>DD                              | -17  ms   | crit   |   | -32  ms  post   | VanDykeivicEiree H = E20[retro] + VanDyke07-E2[sem] + +  |  |
| $\frown$     | Acuña et al. '14<br>Lago et al. '15 Exp3A  | SE<br>SE   |  |  | PP<br>subj                            | $-15 \mathrm{~ms}$<br>$-12 \mathrm{~ms}$                              | crit<br>post   | -32  ms crit  | -15  ms  post   | VanDyke0/=E2[sem] - *  |  |
|              |  |  |  | 1                                      | 5                                     | ii  |  |   |   |  |  |
| /e]          | STRUCTURAL CUES (SUBJ.)Van Dyke & Lewis '03 Exp4   | EI   |  |  | PP/subj                               | $+56 \mathrm{ms}$   | crit   |   |   | 0.0000000000000000000000000000000000000  |  |
|              | VanDyke '07 Exp1[LoSem]<br>•VanDyke '07 Exp2[LoSem]  | EI<br>EI   |  |  | PP/subj<br>PP/subj                    | $  \begin{array}{c} n.s. \\ +37 \text{ ms} \end{array}  $             | crit   |   |   |  |  |
|              | VanDyke '07 Exp3[LoSem]  | EI   |  |  | PP/subj                               | +20ms   | crit   |   |   | Parameter values   |  |
|              | *Cue cc<br>SEMANTIC CUES   |  |  |  |                                       |   |  |   |   |  |  |
| j.           | VanDyke & McElree '11 Exp2a[pre  | -  | N SAT  | pro o                                  | obj                                   | n.s. correl   | ated with<br>ctor position?  |   |   | Conclusions  |  |
| 11           | VanDyke & McElree '11 Exp2a[ <i>ret</i><br>VanDyke & McElree '11 Exp2b[ <i>pr</i>  | v] EI  | N = ET(TFT)  | pro o                                  | obj<br>obj                            | n.s.  |  |   |   | CONCIUSIONS  |  |
| S            | •VanDyke & McElree '11 Exp2b[ <i>rev</i><br>VanDyke & McElree '06  | Ē  | N SPR  |  | obj<br>3MemLd                         | $+38 \mathrm{ms}$   | crit   |   |   | The relabeling of conditions in number agreement reveals consistent  |  |
|              | VanDyke '07 Exp1[LoSyn]<br>•VanDyke '07 Exp2[LoSyn]  | EI<br>EI   |  | retro F<br>retro F                     | PP<br>PP                              | +54  ms<br>+44  ms  | crit<br>post   |   |   | facilitatory interference effects in target-match, contrary to the   |  |
|              | VanDyke & McElree '11 Exp1a[pre  | o] EI  | N SAT(d')  |  | subj                                  | inhib -0.16   | <b>^</b>   |   |   | predictions of cue-based retrieval (standard or extended). This  |  |
|              | VanDyke & McElree '11 Exp1a[ret  | -  |  |  | subj                                  |   | crit   |   |   | suggests that number attraction experiments demonstrate a different  |  |
|              | VanDyke & McElree '11 Exp1b[pre-<br>VanDyke & McElree '11 Exp1b[real   | -  |  | -                                      | subj<br>subj                          | +20  ms<br>+81  ms  | crit<br>crit   |   |   | mechanism than other subject-verb dependencies and anaphoric   |  |
|              | VanDyke '07 $Exp3[LoSyn]$  | EI   |  |  | PP                                    |   | post   |   |   | dependencies.  |  |
|              |  |  |  |  |                                       |   |  |   |   | Distractor base-level activation in the extended model is correlated with  |  |

A retrieval cue can be associated with multiple features to different degrees. The associative strength between a cue and a feature is learned by experience. If two features co-occur frequently in target items for a

certain type of dependency, the parser has







different anaphoric

**Distractor base-level activation** in the extended model is correlated with distractor position (obj. / subj. / discourse-marked subj.).

Consequently, **Distractor Prominence** can explain the absence of effects, increased effect sizes for prominent distractor positions, and cases of facilitatory interference in target-match conditions (Cunnings & Felser, 2013; Sturt, 2003).



Try out the simulations yourself at https://engelmann.shinyapps.io/ACTRInterference

Cue Confusion predicts inhibitory interference in target-mismatch conditions for reciprocals (Kush & Phillips, 2014) and Mandarin reflexives (Jäger et al, subm.).

A high cue confusion level could potentially explain inhibitory interference in target-mismatch conditions for low-span readers (Cunnings & Felser, 2013).

**Limitations:** With increased distractor prominence, the extended model overestimates the magnitude of facilitatory target-mismatch effects.

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