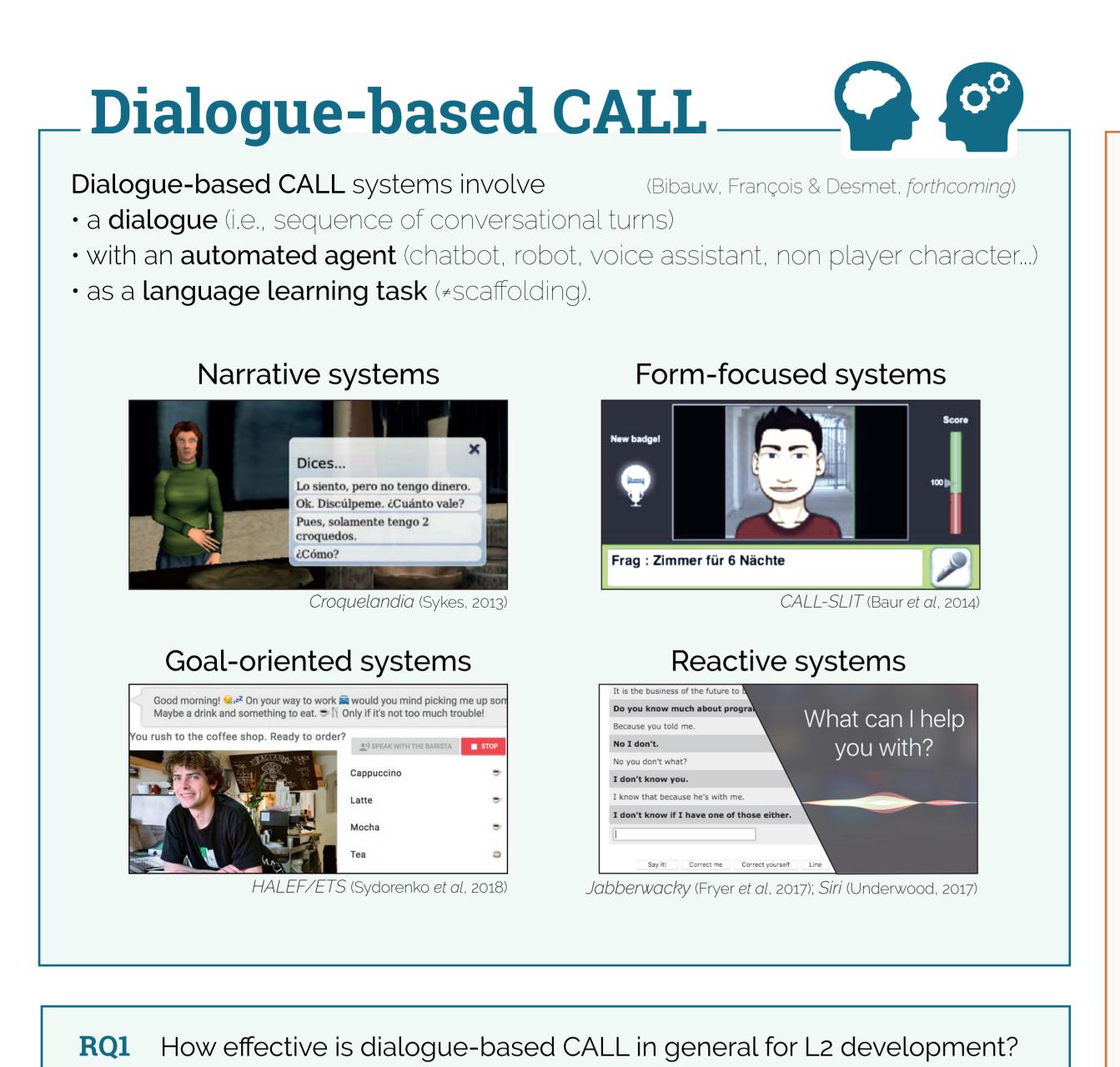
# "Hey Siri, can I learn English by talking to you?"

# A meta-analysis of dialogue-based CALL

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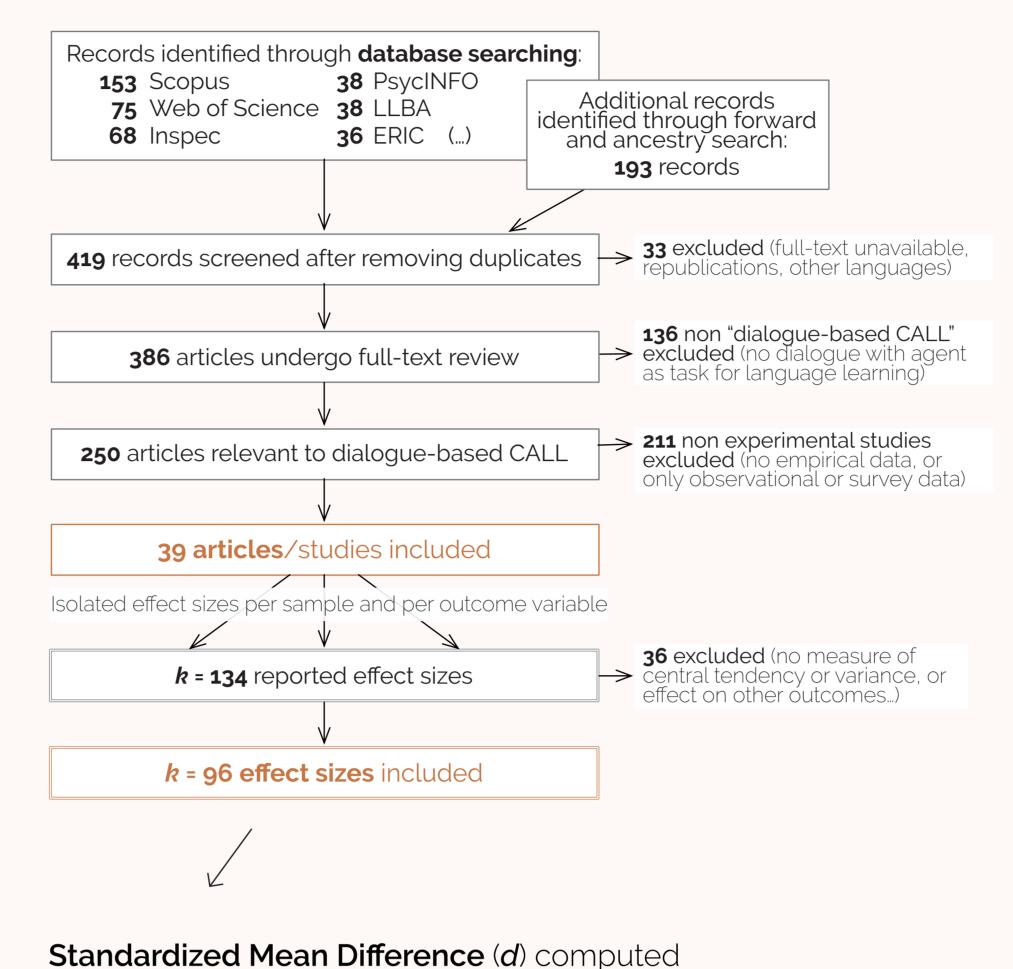


How different implementations of dialogue-based CALL, distinguished

by characteristics of instructional and system design, compare to each

other in terms of effectiveness on diverse language learning outcomes?

Methods



**Meta-analysis**: statistical summary of studies, aggregat-ing all compatible effects to compute a summary effect.

### Multilevel meta-analysis

 every measurement of effect on each outcome variable for each sample is included as a single effect size.

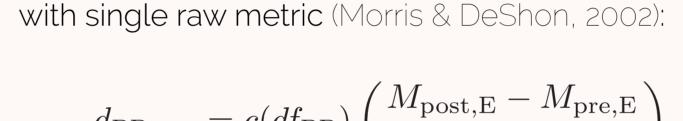
- lack of independence between effects from the same study taken into account by layer of random variation at the study level;
- allows high granularity in study of moderator variables.

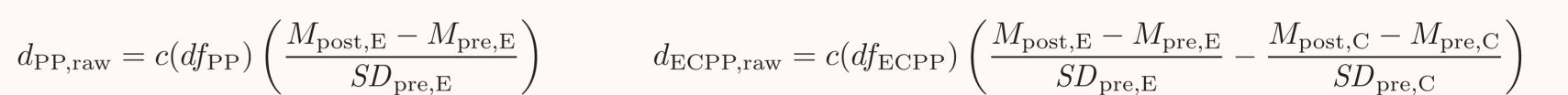
  (see Van den Noortgate et al 2012)

| Level of aggregation      | Items/clusters                               | Remaining variation   |
|---------------------------|--|---|
| Study Effect size Subject | $k_{\text{studies}} = 17$ $k = 96$ $n = 803$ | Variation between-studies Variation between-subjects Random sampling variance |

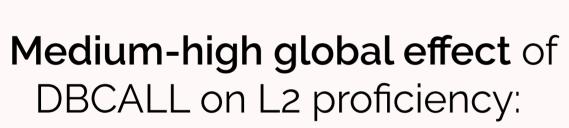
#### Mixed-effects model:

- random between-studies effect
- random between-subjects effect
- fixed effects for covariates and moderator variables









 $d_{
m raw}\!=\!$  .61

High **heterogeneity** and limited statistical power in existing studies: Q(df = 95) = 301.3

| Reference                           | Negative effect $\leftarrow$ | → Positi   | ve effect on I | _2 proficiency         |     | $d_{\sf raw}$ [95% CI] |
|-------------------------------------|------------------------------|------------|----------------|------------------------|-----|------------------------|
| Harless et al 1999                  |                              | -          | -              |                        |     | 1.25 [ 0.15, 2.35]     |
| Chiu et al 2007                     |                              |            | I              |                        |     | 0.33 [ 0.00, 0.67]     |
| Petersen 2010                       |                              | <u> </u>   | _              | <b>-</b>               |     | 0.85 [ 0.08, 1.61]     |
| Wolska & Wilske 2010a               | -                            | -          |                | —                      |     | 0.62 [-0.51, 1.74]     |
| Wolska & Wilske 2010b               | <b>—</b>                     | -          |                |                        |     | 0.31 [-0.56, 1.18]     |
| Bouillon et al 2011                 |                              | <u> </u>   |                | •                      | ——— | 1.51 [ 0.29, 2.74]     |
| Lee et al 2011a                     |                              | <b>——</b>  |                |                        |     | 1.09 [ 0.11, 2.07]     |
| Wilske & Wolska 2011                | -                            | -          |                |                        |     | 0.59 [-0.13, 1.32]     |
| Wolska & Wilske 2011                | -                            |            |                | ——                     |     | 0.67 [-0.62, 1.95]     |
| Noh et al 2012                      |                              |            | <b>——</b>      | ——                     |     | 1.36 [ 0.93, 1.79]     |
| Jia et al 2013                      | H                            | •          | $\dashv$       |                        |     | 0.32 [-0.10, 0.74]     |
| Lee et al 2014a                     | <b>—</b>                     | =          |                |                        |     | 0.12 [-0.28, 0.52]     |
| Wilske 2014                         | <b>—</b>                     | -          |                |                        |     | 0.57 [-0.23, 1.36]     |
| Hassani et al 2016                  | <b>I</b>                     | -          | —              |                        |     | 0.22 [-0.43, 0.88]     |
| Kim 2016                            |                              | <u> </u>   |                |                        |     | 1.19 [ 0.25, 2.13]     |
| Rosenthal-von der Putten et al 2016 | 6 ⊢                          |            |                |                        |     | -0.19 [-0.60, 0.22]    |
| Taguchi et al 2017                  |                              |            | <b>——</b>      | -                      |     | 1.63 [ 1.06, 2.20]     |
| Multilevel random-effects model     |                              | 4          | <b>•</b>       |                        |     | 0.61 [ 0.38, 0.83]     |
|                                     |                              | İ          |                |                        |     |                        |
|                                     | <b>-1</b>                    | 0          | 1              | 2                      | 3   |                        |
|                                     | Sta                          | andardized | Mean Differe   | ence ( $d_{\sf raw}$ ) |     |                        |

| Type       | Variable               | df | F     | p     | Values               | k  | d     | SE   | CI                 |
|------------|------------------------|----|-------|-------|----------------------|----|-------|------|--------------------|
| Population | L2 proficiency*        | 4  | 9.55  | .049  | intercept            |    | 0.69  | 0.38 | [-0.049, 1.436]    |
| -          | •                      |    |       |       | A1                   | 38 | 0.36  | 0.21 | [-0.056, 0.775]    |
|            |                        |    |       |       | A2                   | 89 | 0.18  | 0.30 | [-0.416, 0.769]    |
|            |                        |    |       |       | B1                   | 77 | -0.42 | 0.25 | [-0.910, 0.066]    |
|            |                        |    |       |       | B2                   | 28 | -0.41 | 0.28 | [-0.962, 0.150]    |
|            | Context                | 2  | 1.03  | .599  | school               | 18 | 0.68  | 0.23 | [ 0.235, 1.121]**  |
|            |                        |    |       |       | university           | 75 | 0.54  | 0.15 | [ 0.259, 0.830]*** |
|            |                        |    |       |       | military             | 3  | 1.08  | 0.55 | [0.002, 2.160]*    |
| Treatment  | Duration*              | 4  | 10.29 | .036  | intercept            |    | 0.09  | 0.20 | [-0.300, 0.484]    |
|            |                        |    |       |       | +1 hour on task      |    | 0.15  | 0.05 | [0.049, 0.256]**   |
|            |                        |    |       |       | +1 session           |    | 0.31  | 0.11 | [ 0.094, 0.523]**  |
|            |                        |    |       |       | +1 week              |    | -0.19 | 0.08 | [-0.338, -0.037]*  |
|            | Type of system         | 3  | 1.38  | .710  | narrative            | 4  | 0.31  | 0.49 | [-0.643, 1.261]    |
|            |                        |    |       |       | form-focused         | 15 | 0.86  | 0.27 | [ 0.336, 1.392]**  |
|            |                        |    |       |       | goal-oriented        | 71 | 0.56  | 0.16 | [0.244, 0.877]***  |
|            |                        |    |       |       | reactive             | 6  | 0.57  | 0.37 | [-0.156, 1.287]    |
|            | Type of interaction    | 2  | 0.46  | .794  | goal-oriented        | 66 | 0.64  | 0.14 | [0.373, 0.907]***  |
|            | · -                    |    |       |       | open-ended           | 6  | 0.56  | 0.36 | [-0.146, 1.276]    |
|            |                        |    |       |       | system-guided        | 4  | 0.31  | 0.48 | [-0.627, 1.245]    |
|            | System modality        | 1  | 0.03  | .873  | spoken               | 25 | 0.59  | 0.17 | [0.256, 0.920]***  |
|            |                        |    |       |       | written              | 61 | 0.63  | 0.17 | [ 0.293, 0.960]*** |
|            | Corrective feedback    | 2  | 2.53  | .283  | explicit             | 36 | 0.75  | 0.16 | [0.447, 1.059]***  |
|            |                        |    |       |       | implicit             | 37 | 0.71  | 0.15 | [0.415, 1.005]***  |
|            |                        |    |       |       | none                 | 23 | 0.37  | 0.18 | [0.013, 0.732]*    |
| Outcome    | Test modality          | 1  | 1.72  | .190  | spoken               | 35 | 0.74  | 0.16 | [0.427, 1.054]***  |
|            |                        |    |       |       | written              | 61 | 0.52  | 0.14 | [0.249, 0.799]***  |
|            | Matching modality      | 1  | 2.52  | .113  | true                 | 72 | 0.68  | 0.13 | [0.428, 0.923]***  |
|            | (treatment=test)       |    |       |       | false                | 24 | 0.40  | 0.17 | [0.063, 0.745]*    |
|            | Outcome type***        | 2  | 16.32 | <.001 | comprehension        | 4  | -0.45 | 0.33 | [-1.095, 0.201]    |
|            |                        |    |       |       | production           | 80 | 0.76  | 0.16 | [0.453, 1.069]***  |
|            |                        |    |       |       | vocabulary           | 12 | 0.41  | 0.25 | [-0.083, 0.899]    |
|            | Outcome dimension**    | 6  | 18.68 | .005  | holistic proficiency | 11 | 0.76  | 0.26 | [ 0.263, 1.265]**  |
|            |                        |    |       |       | complexity           | 1  | 0.68  | 0.48 | [-0.262, 1.614]    |
|            |                        |    |       |       | accuracy             | 49 | 0.52  | 0.18 | [ 0.176, 0.871]**  |
|            |                        |    |       |       | lexicon              | 17 | 0.83  | 0.23 | [0.375, 1.292]***  |
|            |                        |    |       |       | fluency              | 14 | 0.65  | 0.23 | [ 0.207, 1.097]**  |
|            | Type of test           | 3  | 7.75  | .051  | metaling. judgment   | 20 | 0.58  | 0.20 | [ 0.184, 0.969]**  |
|            |                        |    |       |       | selected response    | 9  | 0.17  | 0.23 | [-0.280, 0.621]    |
|            |                        |    |       |       | constrained resp.    | 32 | 0.71  |      | [ 0.355, 1.064]*** |
|            |                        |    |       |       | free response        | 35 | 0.76  | 0.18 | [ 0.412, 1.109]*** |
|            | Temporality of effects | 1  | 0.60  | .439  | short-term           | 73 | 0.62  | 0.12 | [ 0.388, 0.860]*** |
|            |                        |    |       |       | long-term            | 23 | 0.52  | 0.16 | [ 0.202, 0.838]**  |

### **Moderator analysis**

Differenciated effects across levels: beginners tend to benefit more

Tentative modelization of effects of treatment duration:

Time on task + #Session - Time between sessions

Goal/task-oriented interaction seems to provide more learning oppportunities than open-ended (e.g., small talk) or system-guided interactions

Spoken and written practice seem to have very similar effects

...but effects could be slightly stronger

or more visible on speaking

Learning effects are much stronger on production outcomes, and could be close to zero regarding an improvement in comprehension

All 4 CALF dimensions seem to benefit from DBCALL, but the effects seem **stronger on vocabulary & fluency** (and possibly complexity)

Effects are higher when tested through free or constrained production tasks than in other types of instruments

## 15s-Summary



Dialogue-based CALL includes all chatbots, conversational agents, voice assistants, robots and talking NPCs for language learning.

We conducted a **multilevel meta-analysis** on all the effectiveness studies ever conducted on such systems (250 articles initially), collecting **96 effect sizes**.

Innovative statistical formulas and models were implemented to integrate the results.

The general effect of dialogue-based CALL practice on L2 proficiency development is **medium-high**, at  $d_{raw}$  = .61. It is comparable, although logically inferior, to the effect of human-human interaction as measured by other meta-analyses (Mackey & Goo, 2007:  $d_{raw}$  = .75).

Insights from the moderator analysis include a differenciated effect across proficiency levels (beginners benefit more than advanced learners), and stronger effects on production tasks, particularly on vocabulary and fluency measures.



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