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Luz Rello, Susana Bautista, Ricardo Baeza-Yates, Pablo Gervás, Raquel Hervás, et al.. One Half or 50%? An Eye-Tracking Study of Number Representation Readability. David Hutchison; Takeo Kanade; Madhu Sudan; Demetri Terzopoulos; Doug Tygar; Moshe Y. Vardi; Gerhard Weikum; Paula Kotzé; Gary Marsden; Gitte Lindgaard; Janet Wesson; Marco Winckler; Josef Kittler; Jon M. Kleinberg; Friedemann Mattern; John C. Mitchell; Moni Naor; Oscar Nierstrasz; C. Pandu Rangan; Bernhard Steffen. 14th International Conference on Human-Computer Interaction (INTERACT), Sep 2013, Cape Town, South Africa. Springer, Lecture Notes in Computer Science, LNCS-8120 (Part IV), pp.229-245, 2013, Human-Computer Interaction – INTERACT 2013. <10.1007/978-3-642-40498-6_17>. <hal-01510564>

HAL Id: hal-01510564

<https://hal.inria.fr/hal-01510564>

Submitted on 19 Apr 2017

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One Half or 50%?

An Eye-Tracking Study of Number Representation Readability

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Abstract. Are numbers expressed as digits easier to read and understand than written with letters? What about fractions and percentages? Exact or rounded values? We present an eye-tracking study that attempts to answer these questions for Spanish, using fixation and reading time to measure readability as well as comprehension questions to score understandability. We find that digits are faster to read but do not help comprehension. Fractions help understandability while percentages help readability. No significant results were found concerning the influence of rounding. Our experiments were performed by 72 persons, half of them with dyslexia. To the best of our knowledge, this is the first study that addresses the cognitive load of number representation in any language, even more for people with dyslexia.

Keywords: textual accessibility, dyslexia, user testing, eye-tracking, readability, comprehension, number representation.

1 Introduction

Worldwide, around 15-20% of the population has a language-based disability; where 70-80% of it is likely dyslexic [27]. Some of these disabilities make more difficult the comprehension of texts written for a generic public. For this reason, United Nations [36] recommend that all public information services and documents should be accessible to the widest possible readership. Given this, there are different initiatives that propose guidelines to help rewriting a text to make it more comprehensive. Some

of them are *Plain Language*¹ and the *European Guidelines for the Production of Easy-to-Read Information* [21].

In addition, a large percentage of information expressed in daily news or reports contain numerical expressions (economical statistics, demographic data, etc.), but many people have problems understanding complex expressions, including non-native speakers, and people with limited education or some kind of social or cognitive disability, such as dyslexia. Numerical information can have different representations such as: using digits or words, rounded numbers or decimals, fractions instead of percentages, etc. According to cognitive studies, numbers in a text are processed in a different way than words [13], and the presence of numbers in the text impacts the reading process [34].

Dyslexia is a neurological reading disability characterized by difficulties with accurate and/or fluent word recognition and by poor spelling and decoding abilities [50]. Depending on the language, the estimation of the prevalence of dyslexia varies from 10-17.5% for the population in the U.S.A. [26] to 8.6-11% for the Spanish speaking population [8, 29, 42]. People with dyslexia find problems to recognize and recollect not only letters but also numbers [11, 37]. Although dyscalculia² and dyslexia are two different disabilities, they are comorbid [33]³ and people with dyslexia are more likely to have Math learning difficulties [32]. For this reason we are particularly interested in studying how the complexity of numerical expressions affects the comprehension of a text.

In this context, the main goal of this paper is to study how number representation impacts text readability and understandability for native Spanish speakers with or without dyslexia. Readability refers to the legibility of a text, that is, the ease with which text can be read, while understandability refers to comprehensibility, the ease with which text can be understood. With this goal in mind, we conducted three experiments with 72 persons (36 with dyslexia) using eye-tracking and comprehension questionnaires. From our results we can quantify the impact of numerical expressions in the reading process for people with or without dyslexia, and it is possible to apply this information to the adaptation of numerical information so texts are more accessible to the widest number of readers.

To the best of our knowledge, this is the first time that numerical representations are measured in terms of readability and comprehension using our methodology. Therefore, this paper presents three main contributions:

- The first analysis of how numerical information impacts text readability and understandability for people with or without dyslexia using a methodology that includes eye-tracking and comprehension questionnaires.

¹ <http://www.plainlanguage.gov/>

² A specific learning disability involving innate difficulty in learning or comprehending arithmetic. It is akin to dyslexia and includes difficulty in understanding numbers, learning how to manipulate numbers, learning mathematical facts, and a number of other related symptoms [7].

³ Comorbidity indicates a medical condition (in this case dyscalculia) existing simultaneously but independently with another condition (dyslexia).

- Numerical information represented as digits improve readability for people with dyslexia.
- Numerical information represented as percentages improve readability for people with dyslexia.

The rest of the paper is organized as follows. Section 2 covers the related work. In Section 3 we present the details of the experimental methodology. Section 4 presents our results and Section 5 discusses them. Conclusions and future work are drawn in Section 6. Finally, in the Appendix, the data used are presented.

2 Related Work

Experimental psychology and cognitive neuropsychology have dealt with the study of number processing and calculation over the last two decades. Many researchers have studied the cognitive processes that are responsible for number processing and calculation, with the goal of contributing to the improvement of teaching and learning processes. For example, [24, 46] present findings about how the frequency of use of a word or number is an influential variable in the reading process. In addition, it seems that numerical expressions most frequently used require less time for recognition.

Researchers in psychophysics [39] have also studied various aspects of reading: impact of text context on readability and eye movements during reading, among others. When numerical expressions are expressed in digits there is a faster access to its semantic representation than when expressed in words [12, 18, 19, 28].

From experimental psychology there is evidence regarding the importance of the frequency of use of numerical expressions. For example, Brysbaert [6] investigated number processing by looking at reading time using eye-tracking and showing that subjects have longer eye fixations with more frequently used numbers.

Overall, it is a generally accepted hypothesis that the probability of making a fixation on a particular linguistic unit is determined by the perceptual or informational relevance of the unit, and the degree of difficulty of processing required for its identification. Due to the quantitative nature of this measure, it is not easy to unravel what are the specific reasons justifying the preference for fixations on certain kinds of linguistic units. Thus, the visual processing of words has been shown to be affected significantly by factors such as length, frequency, type of vocabulary, predictability, or word ambiguity [40].

There is an extensive body of knowledge that takes into consideration eye movements of readers with dyslexia using eye-tracking. While some found differences among people with or without dyslexia [16], others did not [48]. Hyönä *et al.* [25] studies the effect of word length and word frequency in relation with eye fixation patterns. Their results show that low frequency and long words present longer gaze durations and more re-inspections although in [43] only more frequent words presented significantly shorter fixation durations. However, we found no previous work that investigates numerical representations in readers with dyslexia using eye-tracking, nor for people in general. In fact, it is the first user evaluation of numerical representations.

Currently there is plenty of automatic text simplification research based on cognitive aspects. The main objectives are to identify simplification operations that can be applied to adapt a text using some kind of automatic means. Most of the text simplification approaches disregard the treatment of numerical expressions [5, 9] except from [4] that is a numerical expressions simplification system designed on the basis of corpus analyses [2, 15]. However, to the extent of our knowledge there are no user evaluations regarding the impact of simplifying numerical expressions as the one we present in this paper.

3 Methodology

We designed three different experiments to study the effect of different representations of numerical expressions with respect to readability and understandability. In the experiments, 72 participants (36 with dyslexia) had to read several texts in Spanish with different representations of numerical expressions. We tested the following hypotheses:

- H1.1: Readability will increase if digits are used instead of words for representing numerical expressions.
- H1.2: Understandability will increase if digits are used instead of words for representing numerical expressions.
- H2.1: Readability will increase if rounded numerical expressions are used instead of unrounded expressions (with decimals).
- H2.2: Understandability will increase if rounded numerical expressions are used instead of unrounded expressions (with decimals).
- H3.1: Readability will increase if numerical expressions are expressed in percentages instead of fractions.
- H3.2: Understandability will increase if numerical expressions are expressed in percentages instead of fractions.

3.1 Design

In the first experiment, *Digits vs. Words*, the independent variable [\pm digits] had two levels: [+digit] denotes the condition where numbers in the text were written in digits, *i.e.* 22, and [-digit] denotes the condition where numbers were written using words, *i.e.* *veintidos* ('twenty two').

In the second experiment, *Rounding vs. Decimals*, the independent variable [\pm round] had again two levels: [+round] denotes the condition where numbers were rounded, without decimals *i.e.* 19 and [-round] denotes the condition where numbers in the text were written with decimals *i.e.* 19.45.

In the third experiment, *Percentages vs. Fractions*, the independent variable [\pm percentage] also had two levels: [+percentage] denotes the condition where numbers in the text were written using percentages, *i.e.* 25% and [-percentage] denotes the condition where numbers in the text were written using fractions *i.e.* 1/4.

The experiment followed a within-subjects design, so every participant contributed to each of the conditions in the experiments. The order of conditions was counter-balanced to cancel out sequence effects. To measure understandability and readability, we measured fixation duration and the correct answers from the questionnaires, respectively. Sometimes both terms, *readability* and *understandability*, have been used interchangeably. However, previous research with people with dyslexia has shown that both concepts need to be taken into consideration separately. For instance, in [41] comprehension has been found to be independent of readability for people with dyslexia, while text readability can be used as an indicator of comprehension for people without dyslexia. Therefore, in this study we distinguish between readability and understandability.

Fixation Duration. When reading a text, the eye does not move contiguously over the text, but alternates saccades and visual fixations, i.e. jumps in short steps and rests on parts of the text. *Fixation duration* denotes how long the eye rests still on a single place of the text. Fixation duration has been shown to be a valid indicator of readability. According to [30, 40, 47], shorter fixations are associated with better readability while longer fixations can indicate that processing loads are greater. Hence, we use fixation duration across the whole text as measure to quantify readability.

Correct Answers. To measure text comprehension we used questionnaires, one per text. We used multiple-choice questions with three possible choices, one correct and two incorrect. From these answers, we computed the percentage of correct answers, where the correct choice scored 100% and the others 0%.

3.2 Participants

Seventy-two Spanish native speakers undertook the experiments, 36 without dyslexia (group N) and 36 with dyslexia (group D). Their ages ranged from 16 to 50, with a mean age of 26.94 for group N and 23.38 for group D. All the participants were asked to bring their dyslexia diagnosis to the experiment. Except from 3 participants with dyslexia and 2 without who had no higher education, the rest were attending school or high school (17 participants with dyslexia and 13 participants without dyslexia) or were studying or had already finished university degrees (16 participants with dyslexia and 21 participants without dyslexia).

3.3 Materials

To study the effects of numerical expressions we need to study target numerical expressions in context, *i.e.* as part of a text. To isolate the effects of these variables, the texts need to be comparable in complexity. In this section, we describe how we designed the texts and the target numerical expressions that were used in this study.

Base Texts. As basis for our manipulations, we created six texts with an average length of 62.33 words. To meet the comparability requirements among the texts belonging to the same experiment, we took into account the parameters that different complexity measures take into consideration [14]. Next, we present the characteristics shared by the texts in each experiment:

- (a) They have the same number of target words: Seven [\pm digits] numerical expressions pairs for each of the texts in *Digits vs. Words*, seven [\pm round] expressions pairs for each of the texts in *Rounding vs. Decimals*, and four [\pm percentages] target numerical expressions in *Percentages vs. Fractions*.
- (b) They share the same genre and are about similar topics: fast food ingredients.
- (c) They contain the same number of sentences: three sentences in *Percentages vs. Fractions* and four sentences in the other two experiments.
- (d) The base texts of each experiment have the same number of words per text (39 words in *Percentages vs. Fractions* and 63 words for the other two experiments).
- (e) All the texts have a similar word length average ranging from 4.88 to 5.24 letters.
- (f) They do not contain named entities, foreign words, or numerical acronyms.

The presentation of the text has an effect on reading speed so we used the same layout for all the texts. We chose a recommended font type for reading in a screen, sans serif arial, a large size (20 points) and 62 characters/column and unjustified text and recommended color and brightness contrast using a black font with crème background [1, 45].⁴

Target Numerical Expressions. For the numerical expressions we used the following criteria:

- (a) We chose pairs of numerical expressions denoting the same number because the frequency of the number expressed has an impact on its processing time [24, 46]. Therefore the same numerical expressions with different representation were chosen for the three experiments.
- (b) We did not include ambiguous numerical expressions because they require more processing than unambiguous ones [40]. For instance, depending on the context *cien* ('*hundred*') could also mean "very fast" in Spanish i.e. *Estoy trabajando a cien* ('*I am working very fast*') and *Las manzanas están a cien* ('*The apples cost one hundred*').
- (c) We did not use orthographically similar numerical expressions, (i.e. mirror numbers '6' and '9') in the same text since such representations can be a major difficulty for people with dyslexia [17].
- (d) In the experiment *Digits vs. Words*, we selected different numerical expressions, i.e., with decimals, rounded, two or three digits and percentages (see the Appendix for the data used).

⁴ The CYMK are crème (FAFAC8) and black (000000). Color difference: 700, Brightness difference: 244 [45].

- (e) In the experiment *Rounding vs. Decimals*, we rounded the original numbers, always using modifiers when there was a loss of precision, *i.e.* *un poco* ('a little'), *casi* ('almost').
- (f) In the experiment *Percentages vs. Fractions*, we selected frequently occurring percentages and their corresponding fractions

Comprehension Questionnaires. Each questionnaire is composed by two items, one inferential question *i.e.* to be answered correctly the question requires a deep understanding of the content of the text) and one question about details of the text which were expressed using a numerical expression. For each text there were two comprehension questions. The first was about the overall content of the text and the second was about the numerical part of the text. The later question always was phrased with the same number representation that was used in the text. Two examples, an inferential question (i) and a question devoted to details (ii) are given in Figure 1.

(i) El texto trata sobre: ('The text is about:') (a) La descomposición de una hamburguesa. ('The decomposition of a burger.') (b) La creación de una hamburguesa. ('The creation of a burger.') (c) La composición de una hamburguesa. ('The composition of a hamburger'.)	(ii) Una porción de patatas fritas tiene un máximo de: ('One portion of french fries has a maximum of:') (a) 200 kilocalorías. ('200 kilocalories.') (b) 300 kilocalorías. ('300 kilocalories.') (c) 400 kilocalorías. ('400 kilocalories'.)
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Figure 1. Two examples of questions in the comprehension tests.

Preference Questionnaires. Each participant performed a questionnaire with 20 questions that were rated using a 5 level Likert scale. For 10 of the statements the participant was asked about how easy was to read the text, that is, readability, while for the other 10 statements the participant was asked about how easy was to comprehend the text, that is, understandability. Each of the statements contained a numerical expression, using one of the following representations: rounded, unrounded, percentage and fractions, where 8 were written in words and 12 in digits. In the Appendix we present the set of numerical expressions used.

3.4 Equipment

The eye tracker used was the Tobii T50 [49] that has a 17-inch TFT monitor with a resolution of 1024x768 pixels. The eye tracker was calibrated for each participant and the light focus was always in the same position. The distance between the participant and the eye tracker was constant (approximately 60 cm. or 24 in.) and controlled by using a fixed chair.

3.5 Procedure

The sessions were conducted at Universitat Pompeu Fabra and they lasted from 20 to 30 minutes, depending on the participant. In each session, the participant was alone with the interviewer in the quiet room prepared for the study, performing the following three steps.

First, we began with a questionnaire designed to collect demographic information. Second, we conducted the experiments that were recorded using eye-tracking. Out of the 72 participants, 40 participated in the experiment *Digits vs. Words* (20 D, 20 N) and 32 carried out the *Rounding vs. Decimals* experiment (16 D, 16 N). Finally, The experiment *Percentages vs. Fractions* was carried out by 32 participants (16 D, 16 N) who had already participated in either the first or the second experiment, were not tired of reading, and were willing to read more. The participant was asked to read the texts in silence and to complete the comprehension tests. Third, we carried out a user preferences survey.

4 Results

In this section we present the analysis of the results of the eye-tracking and comprehension tests. The measures used for the comparison of the text passages were the means of the fixation duration, the total duration of reading, and the correct answers. In order to test our hypotheses, differences between groups and conditions were tested by means of (Bonferroni-corrected) Student's t-tests.

Shorter fixations are preferred to longer ones because faster reading is related to more readable texts [51]. We compare readability with understandability through the inferential items of the comprehension questionnaires.

First, we study the differences between both groups. Then, we analyze the impact of the different numerical expressions in readability and understandability.

4.1 Digits vs. Words

We did not find statistical significance in readability ($p < 0.444$) for group N (see Table 1). However, we found statistical significance for readability in group D taking into account the mean of fixation time ($p < 0.054$). This result supports our H1.1 hypothesis.

No statistical significance was found for both groups. Hence we reject hypothesis H1.2 ($p < 0.241$ for group N and $p < 0.269$ for group D).

4.2 Rounding vs. Decimals

We reject hypothesis H2.1, since we did not find statistical significance in readability in group N ($p < 0.867$) nor in group D ($p < 0.685$) when reading texts with rounded numerical expressions taking into account the mean of fixation time (see Table 2).

We also refute H2.2 because we did not find statistical significance for understandability in both groups ($p < 0.310$ in group N and $p < 0.695$ in group D).

Table 1. Experimental results for *Digits vs. Words*.

Measure (ave. \pm std.dev.)	[+Digit]	[-Digit]
	Group N	
Fixations Duration	0.19 \pm 0.03	0.19 \pm 0.02
Correct Answers	87.50%	95.00%
	Group D	
Fixations Duration	0.21 \pm 0.04	0.24 \pm 0.05
Correct Answers	85.35%	76.51%

Table 2. Experimental results for *Rounding vs. Decimals*.

Measure (ave. \pm std.dev.)	[+Round]	[-Round]
	Group N	
Fixations Duration	0.19 \pm 0.03	0.19 \pm 0.03
Correct Answers	97.22%	90.87%
	Group D	
Fixations Duration	0.23 \pm 0.04	0.22 \pm 0.04
Correct Answers	90.63%	91.67%

Table 3. Experimental results for *Percentages vs. Fractions*.

Measure (ave. \pm std.dev.)	[+Percentage]	[-Percentage]
	Group N	
Fixations Duration	0.19 \pm 0.03	0.18 \pm 0.03
Correct Answers	88.19%	96.86%
	Group D	
Fixations Duration	0.20 \pm 0.06	0.23 \pm 0.05
Correct Answers	80.55%	88.89%

4.3 Percentages vs. Fractions

We did not find statistical significance in readability for group N ($p < 0.462$) taking into account the mean of fixation time (see Table 3). However, our results confirm H3.1 because we found statistical significance for readability in group D ($p < 0.046$) when reading texts with numerical expressions in percentages. This group reads faster texts with expressions in percentages than texts with numerical information in fractions.

On the other hand, we reject H3.2 because we did not find statistical significance results for understandability in both groups ($p < 0.170$ for group N and $p < 0.474$ for group D, see again Table 3).

4.4 Survey

We found a high Pearson correlation of 0.95 between the answers of both groups. Therefore, groups N and D generally agreed in their answers with respect to readability and understandability. In Figure 2 we show the histograms of the survey results. Then, we calculated the standard deviation for all the statements. For the readability answers the standard deviation was significantly higher in group D ($\mu = 1.20$ seconds, $s = 0.41$) than in group N ($\mu = 0.87$ seconds, $s = 0.46$), with $p = 0.007$. This means that participants with dyslexia had a higher variability in their ratings. For the understandability answers, we found no significant difference between groups in their standard deviation ($p = 0.157$) for group D ($\mu = 1.04$ seconds, $s = 0.44$) and for group N ($\mu = 0.89$ seconds, $s = 0.37$).

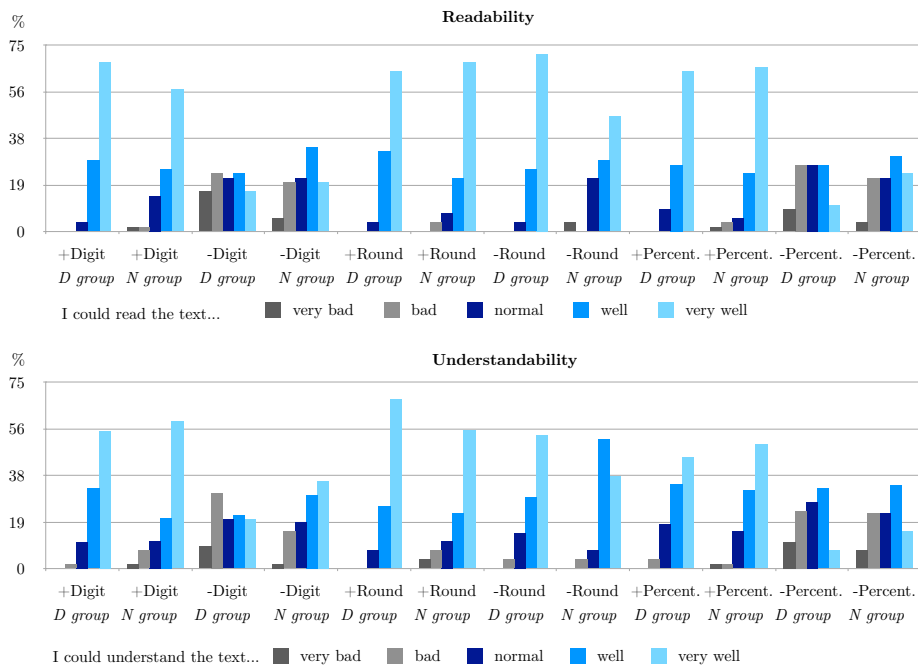


Fig. 2. Survey results for readability and understandability.

Digits vs. Words. Participants significantly found numbers written in digits more readable than in letters ($p < 0.001$) as well as more understandable ($p < 0.001$). We also found significance within groups for readability ($p < 0.001$ in group D and $p < 0.001$ in group N) and understandability ($p < 0.001$ in group D and $p = 0.014$ in group N).

Rounding vs. Decimals. We did not find statistical significance for readability between rounded and unrounded numbers ($p = 0.272$) nor for understandability ($p = 0.446$). No significant differences were found within groups for readability ($t(53.937) = 0.479$, $p = 0.634$ in group D and $p = 0.111$ in group N) and understandability ($p = 0.163$ in group D and $p = 0.888$ in group N).

Percentages vs. Fractions. Participants significantly found percentages more readable than fractions ($p < 0.001$) as well as more understandable ($p < 0.001$). We also found significance within groups for readability ($p < 0.001$ in group D and $p < 0.001$ in group N) and understandability ($p < 0.001$ in group D and $p < 0.001$ in group N).

5 Discussion

With respect to differences between the use of digits and the use of numerical expressions in words, results indicate a statistically significant improvement in performance for readability in people with dyslexia when digits are employed. In contrast, in group N, we found no significant differences. This agrees with the fact that numerical expressions described using words require a longer number of words and/or characters in comparison with the corresponding versions using digits. Overall length is an already known parameter that creates difficulties for people with dyslexia, so the reduction in length involved in phrasing a number in digits should make it easier to read for them. Results for understandability in experiment *digits vs. words* are not statistically significant for both groups.

With respect to differences between the use of rounded and unrounded numbers, none of the differences found are statistically significant. Rounding numbers even with modifiers such as “around” or “almost” did not have the expected effect in our experiments.

With respect to differences between the use of percentages and fractions, there is a statistically significant increase in readability for group D when percentages are used instead of fractions. In contrast, no differences were found for group N. Again, results for understandability are not statistically significant in either case. There is an apparent contradiction in that for group D percentages seem to be easier to read but more difficult to understand. A possible explanation might be related to the nature of these expressions. From a conceptual point of view, both percentages and fractions convey the relative proportion between two quantities: the value of the percentage and 100 in the case of percentages, and the value of the numerator and the value of the denominator in fractions. However, the reference value in the case of percentages is implicit (or conveyed by the % sign). This implies that for fractions, two quantities have to be read, whereas only one needs to be read for percentages. This may account for the comparative ease for group D of reading percentages (only one quantity to read) vs. fractions (two different quantities to read). Participants that took this experiment did it because they were not tired and still willing to read more. In most cases participants with dyslexia were adults, and as such they have reading skills that are similar to adults without dyslexia. Note that fixation duration for these participants is shorter

when reading percentages. More over, the percentages used in the texts were the most commonly used (see Appendix) and the more frequent the word, the shorter the eye fixation [25].

The standard deviations of the survey reveal that people with dyslexia made a greater difference between readability and understandability than people without dyslexia. For people without dyslexia, easier reading was correlated to text comprehension while participants with dyslexia dissociated these two elements, perhaps due to the nature of dyslexia, which affects reading but not comprehension of the language.

The higher variability of scores indicates that for people with dyslexia the representation of numbers has a much bigger impact on readability. However, the correlation of the answers of people with or without dyslexia is high. Hence, both groups generally agree in their rates with respect to readability and understandability.

The significant difference in the number representations of the survey for *Digits vs. Words and Percentages vs. Fractions*, are consistent with the quantitative data from the eye tracker where we found significant variations. Hence, the performance and the preferences of our participants with respect to these number representations are consistent.

6 Conclusions and Future Work

The presence of numerical information in a text impacts its readability. We have analyzed some of the different representations of numerical expressions in text to study their influence in the reading process of people with or without dyslexia. For each experiment our hypotheses have been tested and depending on the kind of numerical information for each group we have obtained different results.

The main contribution of this research is that numbers represented as digits instead of words as well as percentages instead of fractions improve readability of people with dyslexia.

These results may prove to be of value in providing empirical basis for the development or refinement of guidelines for the simplification of text. These guidelines exist in very general form [21] and they are currently employed as reference in a number of efforts to improve accessibility of text for groups of users with special needs. An empirical grounding that correlates particular expressions with particular user groups would be a very positive contribution.

This work can motivate work on text simplification for textual accessibility regarding numerical expressions [3, 4, 38]. Also, these findings can have an impact on current interactive systems for people with dyslexia that modify the text presentation but not its content such as *Claro ScreenRuler Suite* [10], *SeeWord* [22] or *IDEAL e-Book reader* [31]. We plan to integrate these findings in *DysWebxia 2.0* [44], a tool that modifies text content and layout for people with dyslexia.

Another field in which these results can be expected to have an impact is that of the assessment of readability. In general terms, computational models for predicting readability of texts are used, like FOG [23], Flesch, Flesch-Kincaid [20], and SMOG [35]. Current efforts along this line are considering a number of factors like average num-

ber of characters per word and average syllables per word to predict a readability score, but include no specific account for numerical expressions. Based on the results presented here, an effort might be made to expand the set of features used in the assessment of readability to include numerical expressions.

Future work includes the evaluation of numerical representation of other target groups and other measures of readability. We also need to evaluate other representations for specific numerical expressions, for example to represent time.

Acknowledgments

We thank Mari-Carmen Marcos for her assistance with the eye-tracker hardware, Martin Pielot for his help with statistics, and Jerónimo Bautista Velázquez for his help in distributing our experiments announcement among experts. The research of the first author was funded by the Spanish Ministry of Education and Science (Grant TIN2009-14560-C03-01) and the Catalanian FI scholarship program while the research of the second, fourth and fifth authors was funded by the Spanish Ministry of Education and Science (Grant TIN2009-14659-C03-01 Project), Universidad Complutense de Madrid and Banco Santander Central Hispano (GR58/08 Research Group Grant).

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Appendix: Synonyms Pairs

Experiment 1: *Digits vs. Words* and **Experiment 2:** *Rounding vs. Decimals* (the set of target numerical expression used for each experiment are written in brackets, that is, [*Digits / Words - Decimals / Rounding*]).

Composición de una hamburguesa: El pan supone entre el [30% / treinta por ciento - 18,53% / casi el 20%] y el [50% / cincuenta por ciento - 29,57% / casi el 30%] del peso de una hamburguesa. La hamburguesa tiene un valor energético que oscila entre las [250 / doscientas cincuenta - 297 / casi 300] y [300 / trescientas - 398 / casi 400] kilocalorías. Un adulto con actividad moderada necesita en torno a [2.500 / dos mil quinientas - 2.489 / unas 2.500] kilocalorías diarias, por lo que una hamburguesa a la semana no desequilibra ninguna dieta ni siquiera incorporándole un sobre de [11 / once - 11,8 / casi 12] gramos de ketchup, que contiene [70 / setenta - 70,8 / un poco más de 70] kilocalorías.

Composition of a burger: The bread is between [30% / thirty percent - 18.53% / almost 20%] and [50% / fifty percent - 29.57% / almost 30%] of the weight of a hamburger. The burger has an energy value of between [250 / two hundred fifty - 297 / almost 300] and [300 / three hundred - 398 / almost 400] kilocalories. A moderately active adult needs about [2,500 / two thousand five hundred - 2,489 / around 2.500] kilocalories a day, so a burger a week not even unbalanced diet incorporating any one of [11 / eleven - 11.8 / almost 12] grams of ketchup, which contains [70 / seventy - 70.8 / a little more than 70] calories.

Composición de las patatas fritas: Las patatas fritas, a pesar de tener [3,6 / tres coma seis - 3,67 / casi 4] gramos de grasa y [234 / doscientas treinta y cuatro - 214 / un poco más de 200] kilocalorías por cada [100 / cien - 89 / casi 100] gramos, son un alimento muy energético por lo que ha de consumirse en pequeñas cantidades y esporádicamente. Contienen [11 / once - 11,82 / un poco más de 10] gramos de hidratos de carbono con un índice glucémico de [70 / setenta - 68,67 / casi 70]. Es decir, suponen un [50% / cincuenta por ciento - 58% / casi un 60%] del consumo diario recomendado de hidratos en mujeres y el [30% / treinta por ciento - 29,12% / casi un 30%] en hombres.

Composition of french fries: French fries, despite having [3.6 / three point six - 3.67 / almost 4] grams of fat and [234 / two hundred thirty-four - 214 / a little more than 200] kilocalories per [100 / hundred - 89 / almost 100] grams, are a very ener-

getic food which has to be consumed in small quantities and sporadically. Containing [11 / eleven - 11.82 / a little more than 10] grams of carbohydrates with a glyce-mic index of [70 / seventy - 68.67 / almost 70] That is, suppose [50% / fifty per-cent - 58% / almost 60%] of the recommended daily intake of carbohydrates in women and [30% / thirty percent - 29.12% / almost 30%] in men.

Experiment 3: Percentages vs. Fractions

Composición de una hamburguesa: El pan supone entre el [25% / 1/4] y el [50% / 1/2] del peso de una hamburguesa incluyendo el [75% / 3/4] de los hidratos de carbono de esta. Estos hidratos suponen el [20% / 1/5] del consumo diario recomendado para un adulto con actividad moderada.

Composition of a burger: The bread is between [25% / 1/4] and [50% / 1/2] by weight of a hamburger including [75% / 3/4] of this carbohydrate. These hydrates represent [20% / 1/5] of the recommended daily intake for an adult with moderate activity.

Composición de las patatas fritas: Alrededor del [50% / 1/2] de los componentes de las patatas fritas son hidratos de carbono con un índice glucémico del [75% / 3/4]. Es decir, suponen un [25% / 1/4] del consumo diario recomendado de hidratos en mujeres y el [20% / 1/5] en hombres.

Composition of French fries: Approximately [50% / 1/2] of the components of French fries are carbohydrates with a low glyce-mic index of [75% / 3/4]. That is, suppose [25% / 1/4] of the recommended daily intake of carbohydrates in females and [20% / 1/5] in males.

Numerical expressions used in the survey:

18.3%, menos de 1/5 ('less than 1/5'), menos del 20% ('less than 20%'), menos de un quinto ('less than a fifth'), menos de veinte por ciento ('less than twenty per cent'), más de 1/4 ('more than 1/4'), más del 25% ('more than 25%'), más de un cuarto ('more than a quarter'), más del veinte y cinco por ciento ('more than twenty-five per cent'), 27%, casi el 50% ('almost 50%'), menos de la mitad ('less than a half'), casi el cincuenta por ciento ('almost fifty per cent'), 48.6%, menos de 1/2 ('less than 1/2'), más de tres cuartos ('more than three quarters'), más del setenta y cinco por ciento ('more than seventy-five per cent'), 76.3%, más de 3/4 ('more than 3/4') and más del 75% ('more than 75%').