

# Human Evaluation of Online Machine Translation Services for English/Russian-Croatian

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**Abstract.** This paper presents results of human evaluation of machine translated texts for one non closely-related language pair, English-Croatian, and for one closely-related language pair, Russian-Croatian. 400 sentences from the domain of tourist guides were analysed, i.e. 100 sentences for each language pair and for two online machine translation services, Google Translate and Yandex.Translate. Human evaluation is made with regard to the criteria of fluency and adequacy. In order to measure internal consistency, Cronbach's alpha is calculated. Error analysis is made for several categories: untranslated/omitted words, surplus words, morphological errors/wrong word endings, lexical errors/wrong translations, syntactic errors/wrong word order and punctuation errors. At the end of this paper, conclusions and suggestions for further research are given.

**Keywords:** machine translation, human evaluation, Google Translate, Yandex.Translate, English, Russian, Croatian, adequacy, fluency, error analysis, inter-evaluator agreement

## 1 Introduction

Machine translation refers to the process of translating from one natural language to another by applying various computer programs. It is closely related to the development of computational linguistics, artificial intelligence, computer science and language processing methods. Natural languages are characterised by large variabilities of expressions, exceptions to grammatical rules and context dependent changes, which makes automatic machine translation a challenging and demanding task, especially if the languages are morphologically rich and syntactically complex [1]. Machine translation technology is becoming more accessible for everyday needs, but the output quality is not always satisfactory, especially for less-resourced languages. Still, online machine translation has been used for quick access to information and gisting purposes, for browsing or cross-lingual information retrieval.

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