

# **Machine Translation: Technologies and Applications**

**Volume 2**

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Bernard Scott

# Translation, Brains and the Computer

A Neurolinguistic Solution to Ambiguity  
and Complexity in Machine Translation



Springer

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*Gratefully Dedicated*  
A. M. D. G.

*Any intelligent fool can make things bigger  
and more complex. It takes a touch of  
genius – and a lot of courage – to move in  
the opposite direction.*

– Albert Einstein

# Preface

This book is about Machine Translation (MT) and the classic problems associated with this language technology. It is intended for anyone who wonders what if anything might be done to relieve these difficulties. For linguistic, rule-based systems, we attribute the cause of these difficulties to language's ambiguity and complexity and to their interplay in logic-driven processes. For non-linguistic, data-driven systems, we attribute translation shortcomings to the very lack of linguistics. We then propose a demonstrable way to relieve these drawbacks in both instances.

Throughout the book, we present a variety of translations by several of the most prominent linguistic, statistical and neural net MT systems in use today. Our object in doing this is to illustrate both the relative strengths and weaknesses of the various technologies these systems embody. The book's principal intent, however, is not to promote one particular translation system over against others (not even the one the author worked on for thirty years, described herein as Logos Model), but rather to examine the deeper and more critical question of the mechanisms that underlie the translation act itself, and to illustrate what can be done to optimize these mechanisms in a translation machine. We hold this to be the more fundamental issue that needs to be addressed if the classic problems associated with MT are to be solved, and consistent, high-quality machine output is ever to be realized.

Because the linguistic processes of the brain are singularly free of the classic difficulties that beset the machine, we have looked to the brain for possible guidance. We describe a working translation model (Logos Model) that has taken its inspiration from key assumptions about psycholinguistic and neurolinguistic function. We suggest that this brain-based mechanism is effective precisely because it bridges both linguistically-driven and data-driven methodologies. In particular, we show how simulation of this cerebral mechanism has freed this one MT effort, Logos Model, from the all-important, classic problem of complexity when coping with the ambiguities of language. Logos Model accomplishes this by a data-driven process that does not sacrifice linguistic knowledge, but that, like the brain, integrates linguistics within a data-driven process. As a consequence, we suggest that the brain-like mechanism simulated in this model has the potential to contribute to further advances in MT in all its technological instantiations.

These admittedly are controversial claims, and we recognize that the reader may be inclined to dismiss them out of hand, especially given the fact that the model being described, Logos Model, had its origins more than 45 years ago in the earliest days of MT. How, one will ask, can technology from so far back in time offer anything of interest to present-day MT? That is certainly a legitimate question, but it is one we trust this book will answer.

As readers work their way through this book, they will see that we are showing Logos Model at its best, seemingly at times at the expense of other translation systems. Our purpose in writing this book, however, has *not* been to prove that Logos is a better translation system. In terms of the general output quality of many MT systems nowadays, no such claim could be defended. Our purpose rather has been quite different, namely, to demonstrate that the technology underlying Logos Model offers a demonstrable solution to the problem that complexity poses for MT. As we argue throughout this book, complexity is the one issue that is most apt to limit the ultimate potential of any MT system, whether linguistic, statistical or neural. And we attempt to show that Logos Model, originally designed as it was to address the complexity problem, may offer a workable answer. Logos Model translations shown in this book are meant to demonstrate that the model must be doing something right in that regard, something that we trust would be of interest to MT developers generally. Allow me to repeat the point. Logos Model translations in this book are *not* intended to prove that Logos is a better system, only that underlying Logos Model technology may have something of genuine interest to offer. It is hoped that the MT community will understand this, and that the empirical data, arguments and personal testimony we have presented will be considered in constructive spirit intended.

One final matter. Translations shown in this book by Google Translate, Microsoft's Bing Translator, SYSTRANet, PROMT Translator and LISA Lab's neural MT system were carried out in the 2016–2017 timeframe. Readers should be aware that these translations do not necessarily represent output of these systems subsequent to this 2016–2017 timeframe. Readers will note that output from Google Translate and Bing Translator had to be marked as either statistical or neural, since both the Google and Microsoft systems transitioned to neural net technology in late 2016 as this book was being written.

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