

# Contents

<b>Overview</b> .....	1
<b>1. Introduction</b> .....	3
1.1 Incremental Natural Language Processing .....	3
1.2 Incremental Speech Understanding .....	11
1.3 Incremental Architectures and the Architecture of MILC .....	15
1.4 Summary .....	24
<b>2. Graph Theory and Natural Language Processing</b> .....	25
2.1 General Definitions .....	25
2.2 The Use of Word Graphs for Natural Language Processing Systems .....	30
2.3 Evaluation of Word Graphs: Size and Quality Measures .....	34
2.4 Evaluation of Word Graphs: Quality Measures .....	44
2.5 Further Operations on Word Graphs .....	48
2.5.1 Removing Isolated Silence .....	48
2.5.2 Removing Consecutive Silence .....	49
2.5.3 Removing All Silence Edges .....	51
2.5.4 Merging Mutually Unreachable Vertices .....	51
2.6 Hypergraphs .....	52
2.6.1 Formal Definition of Hypergraphs .....	54
2.6.2 Merging of Hyperedges .....	56
2.6.3 Combination of Hyperedges .....	59
2.7 Search in Graphs .....	60
2.8 Summary .....	62
<b>3. Unification-Based Formalisms for Translation in Natural Language Processing</b> .....	65
3.1 Unification-Based Formalisms for Natural Language Processing ...	65
3.1.1 Definition of Typed Feature Structures with Appropriateness ..	68
3.1.2 Type Lattices .....	68
3.1.3 Feature Structures .....	69
3.1.4 Functions as Values of Features .....	73
3.2 Unification-Based Machine Translation .....	73
3.3 Architecture and Implementation of the Formalism .....	76
3.3.1 Definition and Implementation of Type Lattices .....	79
3.3.2 Definition and Implementation of Feature Structures .....	80
3.4 Summary .....	84

<b>4.</b>	<b>MILC: Structure and Implementation . . . . .</b>	85
4.1	Layered Charts . . . . .	86
4.2	Communication Within the Application . . . . .	95
4.2.1	Communication Architecture of an Application . . . . .	96
4.2.2	Channel Models . . . . .	98
4.2.3	Information Service and Synchronization . . . . .	100
4.2.4	Termination . . . . .	104
4.3	Overview of the Architecture of MILC . . . . .	105
4.4	Word Recognition . . . . .	106
4.5	Idiom Processing . . . . .	108
4.6	Parsing . . . . .	110
4.6.1	Derivation of Verbal Complexes . . . . .	111
4.6.2	Spontaneous Speech and Word Recognition . . . . .	113
4.6.3	Structure and Processing Strategies . . . . .	115
4.7	Utterance Integration . . . . .	121
4.8	Transfer . . . . .	128
4.8.1	Chart-Based Transfer . . . . .	130
4.8.2	The Implementation of Transfer for MILC . . . . .	132
4.9	Generation . . . . .	137
4.10	Visualization . . . . .	143
4.11	Extensions . . . . .	145
4.11.1	Extension of the Architecture . . . . .	147
4.11.2	Anytime Translation . . . . .	149
4.12	System Size . . . . .	152
4.13	Summary . . . . .	152
<b>5.</b>	<b>Experiments and Results . . . . .</b>	155
5.1	Hypergraphs . . . . .	156
5.2	Translation . . . . .	158
5.2.1	Data Material . . . . .	158
5.2.2	Linguistic Knowledge Sources . . . . .	159
5.2.3	Experiments and System Parameters . . . . .	161
5.2.4	Evaluation . . . . .	162
5.2.5	Extensions . . . . .	164
5.3	Comparison With Non-incremental Methods . . . . .	165
5.4	Summary . . . . .	167
<b>6.</b>	<b>Conclusion and Outlook . . . . .</b>	169
<b>Bibliography . . . . .</b>		175
<b>Glossary . . . . .</b>		193
<b>Index . . . . .</b>		195

# List of Figures

1.1	The architecture of a functional unit within a modular system .....	4
1.2	The architectonic overview of MILC .....	17
1.3	Interlingua and transfer .....	19
1.4	Multi-level transfer .....	21
2.1	A chart for <i>Der Peter singt mit Freud</i> .....	29
2.2	The graph $K_{(3,3)}$ .....	29
2.3	Word graph for the utterance n002k000 .....	33
2.4	Unique word graph for the utterance n002k000 .....	35
2.5	A difficult graph w.r.t the reduction to unique label sequences .....	40
2.6	Runtime for reducing graphs to unique label sequences .....	42
2.7	A complex graph for rank computation .....	46
2.8	Merging of silence edges .....	49
2.9	Two families of edges in a word graph .....	52
2.10	An interval graph .....	53
2.11	Two families of word hypotheses as hyperedges .....	54
2.12	Adding a word hypothesis to a hyperedge .....	58
2.13	Creation of additional paths by using hypergraphs .....	60
3.1	Feature structure for a simple syntactic rule .....	68
3.2	A transfer rule in LFG style .....	74
3.3	A transfer rule in TFS style .....	75
3.4	A transfer rule by Beskow .....	75
3.5	A small part of a type lattice .....	79
3.6	One part of the structure of lexical items .....	79
3.7	Feature structure for a simple syntactic rule .....	81
3.8	Definition of vertices within feature structures .....	82
4.1	The Whiteboard-Architecture .....	89
4.2	The principle layout of a layered chart .....	91
4.3	Principle component layout .....	97
4.4	The configuration of <i>split channels</i> .....	99
4.5	An example of a configuration file for split channels .....	101
4.6	Time line of the initial configuration of channels with the ILS .....	103
4.7	XPVM snapshot of the initial synchronization .....	104

4.8	The architectonic overview of MILC .....	106
4.9	A word graph in Verbmobil syntax .....	107
4.10	Idiom definition for the partial utterance “ <i>tut mir leid</i> ” (“I am sorry”) ..	109
4.11	A syntactic rule for verbs in last position with four complements .....	112
4.12	One of the lexical entries for “ <i>Arbeitstreffen</i> ” (“work meeting”) .....	116
4.13	A grammar rule for noun phrases with a determiner .....	118
4.14	A noun phrase from the partial parser .....	120
4.15	Island analysis: An example rule for nominal phrases .....	122
4.16	A rule for complements to the left of the verb .....	124
4.17	Lexicon entry for “ <i>ausmachen</i> ” (“schedule”) .....	126
4.18	A verbal phrase from the integrator .....	127
4.19	A transfer chart for structural translations .....	132
4.20	A transfer rule for verbal phrases .....	133
4.21	The transfer lexicon entry for “ <i>recht sein</i> ” (“suit”) .....	134
4.22	Topology of the fundamental rule for transfer .....	135
4.23	A subpart of the generation input for “ <i>lassen Sie uns das nächste Arbeitstreffen vereinbaren</i> ” (“let us schedule the next work meeting”) .....	139
4.24	Generation rules for imperative verbs .....	140
4.25	Generation lexicon entry for “ <i>let</i> ” .....	142
4.26	A snapshot of the processing with MILC .....	145
5.1	Reduction of word edges by hypergraph conversion .....	156
5.2	Reduction of chart edges by hypergraph conversion .....	157
5.3	Reduction of analysis time by hypergraph conversion .....	158
5.4	Comparison of incremental and non-incremental processing .....	167

# List of Tables

3.1	The syntax for type lattices .....	80
3.2	The syntax of feature structures .....	82
3.3	Internal representation of a feature structure.....	83
4.1	Messages sent from the word recognizer to the successor components ..	108
4.2	Results for standard and partial parsing of the dialog n002k .....	115
4.3	Sketch of the processing of “lassen Sie uns den nächsten Termin ausmachen” (“let us schedule the next appointment”) .....	125
4.4	An example for the output of the generator .....	143
4.5	System size (in lines of code) .....	153
5.1	Properties of the dialogs used in the experiments.....	159
5.2	The utterances in dialog m123 .....	160
5.3	Results of analyzing five dialogs .....	162
5.4	Generator output for the utterance j534a005.....	163
5.5	Evaluation of the translations .....	164
5.6	Comparison of runtime for incremental and non-incremental configura-tions .....	165

# List of Algorithms

1	Computing the topological order of a DAG .....	36
2	Computation of the transcript independent density of a word graph .....	37
3	Calculation of the number of paths in a graph .....	38
4	Reducing a graph to unique label sequences .....	39
5	Merging of two vertices .....	41
6	Calculation of the number of derivation steps of a fictitious parser for a word graph .....	43
7	Computing the rank of a path (part 1) .....	44
8	Computing the rank of a path (part 2) .....	46
9	Removing isolated silence edges .....	49
10	Removing consecutive silence .....	50
11	Removing all silence edges .....	51
12	Adding a word hypothesis $e_n$ to a hypergraph $G = (\mathcal{V}, \mathcal{E}, \mathcal{L}, \mathcal{W})$ .....	58
13	SSSP for DAGs .....	61
14	SSSP for incremental hypergraphs .....	62