Speech and Language Processing

An Introduction to Natural Language Processing, Computational Linguistics, and Speech Recognition

Second Edition

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Pearson Education International

Contents

Fo	rewor	d		23
Pr	eface			25
Ab	out th	e Autho	ors	31
1	Intro	duction		35
	1.1		edge in Speech and Language Processing	36
	1.2		uity	38
	1.3		s and Algorithms	39
	1.4		age, Thought, and Understanding	40
	1.5	_	ate of the Art	42
	1.6		Brief History	43
		1.6.1	Foundational Insights: 1940s and 1950s	43
		1.6.2	The Two Camps: 1957–1970	44
		1.6.3	Four Paradigms: 1970–1983	45
		1.6.4	Empiricism and Finite-State Models Redux: 1983–1993	46
		1.6.5	The Field Comes Together: 1994–1999	46
		1.6.6	The Rise of Machine Learning: 2000–2008	46
		1.6.7	On Multiple Discoveries	47
		1.6.8	A Final Brief Note on Psychology	48
	1.7	Summ	ary	48
	Biblio		ral and Historical Notes	49
		0 ,		
I	Wor	ds		
2	Regu	lar Exp	ressions and Automata	51
	2.1		ar Expressions	51
		2.1.1	Basic Regular Expression Patterns	52
		2.1.2	Disjunction, Grouping, and Precedence	55
		2.1.3	A Simple Example	56
		2.1.4	A More Complex Example	57
		2.1.5	Advanced Operators	58
		2.1.6	Regular Expression Substitution, Memory, and ELIZA	59
	2.2	Finite-	State Automata	60
		2.2.1	Use of an FSA to Recognize Sheeptalk	61
		2.2.2	Formal Languages	64
		2.2.3	Another Example	65
		2.2.4	Non-Deterministic FSAs	66
		2.2.5	Use of an NFSA to Accept Strings	67
		2.2.6	Recognition as Search	69
		2.2.7	Relation of Deterministic and Non-Deterministic Automata	72
	2.3	Regula	ar Languages and FSAs	72
	2.4	-	nary	75

		ographical and Historical Notes
	Exerc	ises
3	Word	s and Transducers 79
	3.1	Survey of (Mostly) English Morphology
		3.1.1 Inflectional Morphology
		3.1.2 Derivational Morphology
		3.1.3 Cliticization
		3.1.4 Non-Concatenative Morphology 85
		3.1.5 Agreement
	3.2	Finite-State Morphological Parsing
	3.3	Construction of a Finite-State Lexicon
	3.4	Finite-State Transducers
		3.4.1 Sequential Transducers and Determinism 93
	3.5	FSTs for Morphological Parsing
	3.6	Transducers and Orthographic Rules
	3.7	The Combination of an FST Lexicon and Rules
	3.8	Lexicon-Free FSTs: The Porter Stemmer
	3.9	Word and Sentence Tokenization
		3.9.1 Segmentation in Chinese
	3.10	Detection and Correction of Spelling Errors
	3.11	Minimum Edit Distance
	3.12	Human Morphological Processing
	3.13	Summary
		ographical and Historical Notes
		ises
4	<i>N</i> -Gr	ams 11'
4	4.1	Word Counting in Corpora
	4.2	Simple (Unsmoothed) N-Grams
	4.3	Training and Test Sets
	4.3	4.3.1 <i>N</i> -Gram Sensitivity to the Training Corpus
		4.3.2 Unknown Words: Open Versus Closed Vocabulary Tasks
	4.4	Evaluating N-Grams: Perplexity
	4.4	
	4.5	ε
		1 6
		2 2
	16	
	4.6	Interpolation
	4.7	Backoff
	4.0	4.7.1 Advanced: Details of Computing Katz Backoff α and P^* . 14
	4.8	Practical Issues: Toolkits and Data Formats
	4.9	Advanced Issues in Language Modeling
		4.9.1 Advanced Smoothing Methods: Kneser-Ney Smoothing 14
		4.9.2 Class-Based N-Grams

11

		6.7.1	Why We Call It Maximum Entropy	239
	6.8	Maximu	The state of the s	241
		6.8.1	• •	244
	6.9	Summa		245
	Bibli			246
	Exerc	~ .		247
II	Sp	eech		
7	Phon			249
′	7.1			250
	7.1	-		25
	1.2	7.2.1	•	252
			C	254
		7.2.2		255
		7.2.3		
		7.2.4		256
		7.2.5	5	25
	7.3		8 8	259
		7.3.1		26
		7.3.2	8	262
		7.3.3	ε	263
	7.4		5	264
		7.4.1	Waves	264
		7.4.2	Speech Sound Waves	26:
		7.4.3	Frequency and Amplitude; Pitch and Loudness	26
		7.4.4	1	270
		7.4.5	Spectra and the Frequency Domain	270
		7.4.6	The Source-Filter Model	274
	7.5	Phoneti	c Resources	27:
	7.6	Advanc	ed: Articulatory and Gestural Phonology	273
	7.7		ry	279
	Bibli		ll and Historical Notes	280
			· ·	28
8	Snee	ch Synth	egis -	28.
Ü	8.1	-	ormalization	28:
	0.1	8.1.1	Sentence Tokenization	28:
			Non-Standard Words	28
		8.1.3	Homograph Disambiguation	29
	0.0			29
	8.2		c Analysis	29
		8.2.1	Dictionary Lookup	
		8.2.2	Names	29
	0.2	8.2.3	Grapheme-to-Phoneme Conversion	29
	8.3		c Analysis	29
		8.3.1	Prosodic Structure	29
		8.3.2	Prosodic Prominence	29

13

		10.5.3 Pronunciation Modeling: Variation Due to Genre	388
	10.6	Metadata: Boundaries, Punctuation, and Disfluencies	390
	10.7	Speech Recognition by Humans	392
	10.8	Summary	393
	Biblio	ographical and Historical Notes	393
	Exerc		394
11	-	putational Phonology	395
	11.1	Finite-State Phonology	395
	11.2	Advanced Finite-State Phonology	399
		11.2.1 Harmony	399
		11.2.2 Templatic Morphology	400
	11.3	Computational Optimality Theory	401
		11.3.1 Finite-State Transducer Models of Optimality Theory	403
		11.3.2 Stochastic Models of Optimality Theory	404
	11.4	Syllabification	406
	11.5	Learning Phonology and Morphology	409
		11.5.1 Learning Phonological Rules	409
		11.5.2 Learning Morphology	411
		11.5.3 Learning in Optimality Theory	414
	11.6	Summary	415
	Biblio	ographical and Historical Notes	415
	Exerc	rises	417
II	I Sy	vntax	
			414
	Form	nal Grammars of English	419
	Form 12.1	nal Grammars of English Constituency	420
	Form	aal Grammars of English Constituency	420 42
	Form 12.1 12.2	Tal Grammars of English Constituency	420 421 423
	Form 12.1	Constituency	420 421 423 426
	Form 12.1 12.2	Context-Free Grammars	420 421 421 420 420
	Form 12.1 12.2	Constituency	420 421 420 420 420 420
	Form 12.1 12.2	Constituency	420 420 420 420 420 420 420 420
	Form 12.1 12.2	Constituency	420 421 420 420 420 420 420 431
	Form 12.1 12.2	Constituency	420 420 420 420 420 420 420 430 430
	Form 12.1 12.2	Context-Free Grammars 12.2.1 Formal Definition of Context-Free Grammar Some Grammar Rules for English 12.3.1 Sentence-Level Constructions 12.3.2 Clauses and Sentences 12.3.3 The Noun Phrase 12.3.4 Agreement 12.3.5 The Verb Phrase and Subcategorization 12.3.6 Auxiliaries	420 421 420 420 420 420 420 431 434 430
	Form 12.1 12.2	Constituency	420 421 420 420 420 420 420 431 432 432 433
	Form 12.1 12.2	Context-Free Grammars 12.2.1 Formal Definition of Context-Free Grammar Some Grammar Rules for English 12.3.1 Sentence-Level Constructions 12.3.2 Clauses and Sentences 12.3.3 The Noun Phrase 12.3.4 Agreement 12.3.5 The Verb Phrase and Subcategorization 12.3.6 Auxiliaries 12.3.7 Coordination Treebanks	420 420 420 420 420 420 430 430 431 431 431
	Form 12.1 12.2 12.3	Constituency Context-Free Grammars 12.2.1 Formal Definition of Context-Free Grammar Some Grammar Rules for English 12.3.1 Sentence-Level Constructions 12.3.2 Clauses and Sentences 12.3.3 The Noun Phrase 12.3.4 Agreement 12.3.5 The Verb Phrase and Subcategorization 12.3.6 Auxiliaries 12.3.7 Coordination Treebanks 12.4.1 Example: The Penn Treebank Project	420 421 422 423 423 434 434 434 433 433 433
	Form 12.1 12.2 12.3	Constituency	420 421 420 420 420 431 431 431 431 431 431 431
	Form 12.1 12.2 12.3	Constituency	420 421 420 420 420 431 431 431 431 441 441
	Form 12.1 12.2 12.3	Constituency	420 421 420 420 420 431 431 431 431 431 431 431
	Form 12.1 12.2 12.3	Constituency	420 421 420 420 420 420 431 431 431 431 441 441 441 441
	Form 12.1 12.2 12.3	Context-Free Grammars 12.2.1 Formal Definition of Context-Free Grammar Some Grammar Rules for English 12.3.1 Sentence-Level Constructions 12.3.2 Clauses and Sentences 12.3.3 The Noun Phrase 12.3.4 Agreement 12.3.5 The Verb Phrase and Subcategorization 12.3.6 Auxiliaries 12.3.7 Coordination Treebanks 12.4.1 Example: The Penn Treebank Project 12.4.2 Treebanks as Grammars 12.4.3 Treebank Searching 12.4.4 Heads and Head Finding	420 420 420 420 420 430 430 431 431 431 441 441

		12.7.1 The Relationship Between Dependencies and Heads	449
		12.7.2 Categorial Grammar	451
	12.8	Spoken Language Syntax	451
		12.8.1 Disfluencies and Repair	452
		12.8.2 Treebanks for Spoken Language	453
	12.9	Grammars and Human Processing	454
		Summary	455
		graphical and Historical Notes	456
	Exerc		458
13	Svnta	ctic Parsing	461
	13.1	Parsing as Search	462
		13.1.1 Top-Down Parsing	463
		13.1.2 Bottom-Up Parsing	464
		13.1.3 Comparing Top-Down and Bottom-Up Parsing	465
	13.2	Ambiguity	466
	13.3	Search in the Face of Ambiguity	468
	13.4	Dynamic Programming Parsing Methods	469
	13.7	13.4.1 CKY Parsing	470
		13.4.2 The Earley Algorithm	477
	12.5	13.4.3 Chart Parsing	482
	13.5	Partial Parsing	484
		13.5.1 Finite-State Rule-Based Chunking	486
		13.5.2 Machine Learning-Based Approaches to Chunking	486
	10.6	13.5.3 Chunking-System Evaluations	489
	13.6	Summary	490
		graphical and Historical Notes	491
	Exerc	ises ,	492
14		tical Parsing	493
	14.1	Probabilistic Context-Free Grammars	494
		14.1.1 PCFGs for Disambiguation	495
		14.1.2 PCFGs for Language Modeling	497
	14.2	Probabilistic CKY Parsing of PCFGs	498
	14.3	Ways to Learn PCFG Rule Probabilities	501
	14.4	Problems with PCFGs	502
		14.4.1 Independence Assumptions Miss Structural Dependencies Between Bules	502
		tween Rules	
	145	- · · · - · · · · · · · · · · · · · · ·	503
	14.5	Improving PCFGs by Splitting Non-Terminals	505
	14.6	Probabilistic Lexicalized CFGs	507
		14.6.1 The Collins Parser	509
		14.6.2 Advanced: Further Details of the Collins Parser	511
	14.7	Evaluating Parsers	513
	14.8	Advanced: Discriminative Reranking	515
	14.9	Advanced: Parser-Based Language Modeling	516

		Human Parsing	517
		Summary	519
	Biblio	graphical and Historical Notes	520
	Exerc	ises	522
1.5	E4		533
15		res and Unification	523
	15.1	Feature Structures	524
	15.2	Unification of Feature Structures	526
	15.3	Feature Structures in the Grammar	531
		15.3.1 Agreement	532
		15.3.2 Head Features	534
		15.3.3 Subcategorization	535
	1 ~ 4	15.3.4 Long-Distance Dependencies	540
	15.4	Implementation of Unification	541
		15.4.1 Unification Data Structures	541
		15.4.2 The Unification Algorithm	543
	15.5	Parsing with Unification Constraints	547
		15.5.1 Integration of Unification into an Earley Parser	548
		15.5.2 Unification-Based Parsing	553
	15.6	Types and Inheritance	555
		15.6.1 Advanced: Extensions to Typing	558
		15.6.2 Other Extensions to Unification	559
	15.7	Summary	559
		ographical and Historical Notes	560
	Exerc	ises	561
16	Lang	uage and Complexity	563
-0	16.1	The Chomsky Hierarchy	564
	16.2	Ways to Tell if a Language Isn't Regular	566
	10.2	16.2.1 The Pumping Lemma	567
		16.2.2 Proofs that Various Natural Languages Are Not Regular	569
	16.3	Is Natural Language Context Free?	571
	16.4	Complexity and Human Processing	573
	16.5	Summary	576
		ographical and Historical Notes	577
	Exerc		578
	Джеге		570
τx	7 S o	mantics and Duagmatics	
I	se se	mantics and Pragmatics	
17	The I	Representation of Meaning	579
	17.1	Computational Desiderata for Representations	581
		17.1.1 Verifiability	581
		17.1.2 Unambiguous Representations	582
		17.1.3 Canonical Form	583
		17.1.4 Inference and Variables	584
		17.1.5 Expressiveness	585
			- 00

Contents	17
Contents	1.7

	17.2	Model-Theoretic Semantics	586
	17.3	First-Order Logic	589
		17.3.1 Basic Elements of First-Order Logic	589
		17.3.2 Variables and Quantifiers	591
		17.3.3 Lambda Notation	593
		17.3.4 The Semantics of First-Order Logic	594
		17.3.5 Inference	595
	17.4	Event and State Representations	597
		17.4.1 Representing Time	600
		17.4.2 Aspect	603
	17.5	Description Logics	606
	17.6	Embodied and Situated Approaches to Meaning	612
	17.7	Summary	614
	Biblio	ographical and Historical Notes	614
	Exerc		616
18	Comp	putational Semantics	617
	18.1	Syntax-Driven Semantic Analysis	617
	18.2	Semantic Augmentations to Syntactic Rules	619
	18.3	Quantifier Scope Ambiguity and Underspecification	626
		18.3.1 Store and Retrieve Approaches	626
		18.3.2 Constraint-Based Approaches	629
	18.4	Unification-Based Approaches to Semantic Analysis	632
	18.5	Integration of Semantics into the Earley Parser	638
	18.6	Idioms and Compositionality	639
	18.7	Summary	641
	Biblio	ographical and Historical Notes	641
	Exerc	ises	643
10		10	~ 4 ~
19		al Semantics	645
	19.1	Word Senses	646 649
	19.2	Relations Between Senses	
		19.2.1 Synonymy and Antonymy	649
		19.2.2 Hyponymy	650
	10.2	19.2.3 Semantic Fields	651
	19.3	WordNet: A Database of Lexical Relations	651
	19.4	Event Participants	653
		19.4.1 Thematic Roles	654
		19.4.2 Diathesis Alternations	656
		19.4.3 Problems with Thematic Roles	657
		19.4.4 The Proposition Bank	658
		19.4.5 FrameNet	659
	10.5	19.4.6 Selectional Restrictions	661
	19.5	Primitive Decomposition	663
	19.6	Advanced: Metaphor	665
	19.7	Summary	666

	Biblio Exerci	graphical and Historical Notes	667 668		
20	Computational Lexical Semantics				
	20.1	Word Sense Disambiguation: Overview	672		
	20.2	Supervised Word Sense Disambiguation	673		
		20.2.1 Feature Extraction for Supervised Learning	674		
		20.2.2 Naive Bayes and Decision List Classifiers	675		
	20.3	WSD Evaluation, Baselines, and Ceilings	678		
	20.4	WSD: Dictionary and Thesaurus Methods	680		
		20.4.1 The Lesk Algorithm	680		
		20.4.2 Selectional Restrictions and Selectional Preferences	682		
	20.5	Minimally Supervised WSD: Bootstrapping	684		
	20.6	Word Similarity: Thesaurus Methods	686		
	20.7	Word Similarity: Distributional Methods	692		
		20.7.1 Defining a Word's Co-Occurrence Vectors	693		
		20.7.2 Measuring Association with Context	695		
		20.7.3 Defining Similarity Between Two Vectors	697		
		20.7.4 Evaluating Distributional Word Similarity	701		
	20.8	Hyponymy and Other Word Relations	701		
	20.9	Semantic Role Labeling	704		
		Advanced: Unsupervised Sense Disambiguation	708		
	20.11	÷ ,	709		
	Biblio	graphical and Historical Notes	710		
		ses	713		
21	Comp	outational Discourse	715		
	21.1	Discourse Segmentation	718		
		21.1.1 Unsupervised Discourse Segmentation	718		
		21.1.2 Supervised Discourse Segmentation	720		
		21.1.3 Discourse Segmentation Evaluation	722		
	21.2	Text Coherence	723		
		21.2.1 Rhetorical Structure Theory	724		
		21.2.2 Automatic Coherence Assignment	726		
	21.3	Reference Resolution	729		
	21.4	Reference Phenomena	732		
		21.4.1 Five Types of Referring Expressions	732		
		21.4.2 Information Status	734		
	21.5	Features for Pronominal Anaphora Resolution	735		
		21.5.1 Features for Filtering Potential Referents	735		
		21.5.2 Preferences in Pronoun Interpretation	736		
	21.6	Three Algorithms for Anaphora Resolution	738		
		21.6.1 Pronominal Anaphora Baseline: The Hobbs Algorithm	738		
		21.6.2 A Centering Algorithm for Anaphora Resolution	740		
		21.6.3 A Log-Linear Model for Pronominal Anaphora Resolution .	742		
		21.6.4 Features for Pronominal Anaphora Resolution	743		

2 2 2 2	21.8 Ev 21.9 A 21.10 Ps 21.11 Su	valuati dvance sychol ummai aphica	ence Resolution on of Coreference Resolution ed: Inference-Based Coherence Resolution inguistic Studies of Reference ry and Historical Notes	746 747 752 753 754
V	Appli	catio	ns	
22 1	Informa	tion E	extraction	759
2	22.1 N	amed	Entity Recognition	761
	22	2.1.1	Ambiguity in Named Entity Recognition	
	22	2.1.2	NER as Sequence Labeling	
	22	2.1.3	Evaluation of Named Entity Recognition	
	22	2.1.4	Practical NER Architectures	
2	22.2 R	elatior	Detection and Classification	768
	22	2.2.1	Supervised Learning Approaches to Relation Analysis	769
	22	2.2.2	Lightly Supervised Approaches to Relation Analysis	. 772
	22	2.2.3	Evaluation of Relation Analysis Systems	
2	22.3 Te	empor	al and Event Processing	. 777
		2.3.1	Temporal Expression Recognition	
	22	2.3.2	Temporal Normalization	
	22	2.3.3	Event Detection and Analysis	
	22	2.3.4	TimeBank	. 784
2	22.4 To	emplat	te Filling	. 786
		2.4.1	Statistical Approaches to Template-Filling	
	22	2.4.2	Finite-State Template-Filling Systems	
2	22.5 A	dvanc	ed: Biomedical Information Extraction	
		2.5.1	Biological Named Entity Recognition	
	22	2.5.2	Gene Normalization	
		2.5.3	Biological Roles and Relations	
2			ry	
]			l and Historical Notes	
	Exercise	•		505
23	Questio	n Ans	wering and Summarization	799
	_		ation Retrieval	. 801
		3.1.1	The Vector Space Model	. 802
		3.1.2	Term Weighting	
	2:	3.1.3	Term Selection and Creation	
		3.1.4	Evaluation of Information-Retrieval Systems	
		3.1.5	Homonymy, Polysemy, and Synonymy	
		3.1.6	Ways to Improve User Queries	
			Question Answering	
		3.2.1	Question Processing	

		23.2.2	Passage Retrieval	815
		23.2.3	Answer Processing	
		23.2.4	Evaluation of Factoid Answers	
	23.3	Summa	rization	
	23.4		Document Summarization	
		23.4.1	Unsupervised Content Selection	
		23.4.2	Unsupervised Summarization Based on Rhetorical Parsing	
		23.4.3	Supervised Content Selection	
		23.4.4	Sentence Simplification	
	23.5	Multi-L	Occument Summarization	
		23.5.1	Content Selection in Multi-Document Summarization	
		23.5.2	Information Ordering in Multi-Document Summarization	
	23.6	Focused	d Summarization and Question Answering	
	23.7		rization Evaluation	
	23.8		ry	
	Biblio		all and Historical Notes	
	Exerc			
24			Conversational Agents	847
	24.1		ies of Human Conversations	
		24.1.1	Turns and Turn-Taking	
		24.1.2	Language as Action: Speech Acts	
		24.1.3	Language as Joint Action: Grounding	
		24.1.4	Conversational Structure	
		24.1.5	Conversational Implicature	
	24.2		Dialogue Systems	
		24.2.1	ASR Component	. 857
		24.2.2	NLU Component	. 858
		24.2.3	Generation and TTS Components	. 861
		24.2.4	Dialogue Manager	. 863
		24.2.5	Dealing with Errors: Confirmation and Rejection	
	24.3	VoiceX	ML	. 868
	24.4		e System Design and Evaluation	
		24.4.1	Designing Dialogue Systems	. 872
		24.4.2	Evaluating Dialogue Systems	
	24.5	Informa	ation-State and Dialogue Acts	
		24.5.1	Using Dialogue Acts	. 876
		24.5.2	Interpreting Dialogue Acts	. 877
		24.5.3	Detecting Correction Acts	
		24.5.4	Generating Dialogue Acts: Confirmation and Rejection	
	24.6		Decision Process Architecture	
	24.7		ed: Plan-Based Dialogue Agents	
		24.7.1	Plan-Inferential Interpretation and Production	
		24.7.2	The Intentional Structure of Dialogue	
	24.8		iry	
			ıl and Historical Notes	
	DIVIL	, grapinica	a and instituted inclus	. 072

	Exerci	ises	894
25 Machine Translation			
	25.1	Why Machine Translation Is Hard	898
		25.1.1 Typology	898
		25.1.2 Other Structural Divergences	900
		25.1.3 Lexical Divergences	901
	25.2	Classical MT and the Vauquois Triangle	903
		•	904
			906
			908
			909
	25.3	e e	910
	25.4		913
	25.5		915
		e e e e e e e e e e e e e e e e e e e	916
			919
	25.6	· ·	921
			922
	25.7	· ·	924
	25.8	•	926
	25.9		930
			930
		e	931
	25.10		934
			935
		•	939
	25.12		939
		· · · · · · · · · · · · · · · · · · ·	940
			941
	Exerci	<u> </u>	943
Bil	bliogra	phy	945
Αn	thor Ir	ndex	995
	bject I		007
Su	oject II	HUCA	.007