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Eduardo Fermé · Sven Ove Hansson

# Belief Change

## Introduction and Overview



Springer

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# Preface

Belief change (belief revision) is a research area in formal philosophy that makes use of logic to produce models of how human and artificial agents change their beliefs in response to new information. The properties of these models are investigated in order to improve our understanding of how beliefs can be changed, with a particular emphasis on what it means to change one's beliefs in a rational way. This area of research arose in the 1970s and 1980s through a confluence of several approaches. Its first great synthesis was an article in the *Journal of Symbolic Logic* in 1985 (the so-called AGM paper). In the three decades that have followed since then, the area has developed rapidly and in many directions. This book is an introduction to the subject and at the same time an overview of some of its major ramifications. The model proposed in the 1985 paper will be used as a starting point, but we will also pay much attention to the criticism that has been raised against it and to several alternative models that have been proposed to supplement or replace it. Theorems and other formal results are presented without proofs; instead we give references to the research papers where the proofs can be found.

Belief change has turned out to be an unusually rich research area that provides us with new, dynamic ways to understand human rationality. We hope that the reader will see how full this field of research is of exciting openings for new discoveries.

In preparing the contents of this book we benefited from the help of more than fifty colleagues who answered our queries and provided us with information. In addition to its academic excellence, the belief revision community is a remarkably generous one. Special thanks go to Mauricio Reis, Rafael Testa, Hans van Ditmarsch and Ramón Pino Pérez for their help with Chapters 9, 10, 12 and 13 respectively.

Funchal and Stockholm,  
November 2017

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# Contents

<b>1</b>	<b>Motivation</b>	1
1.1	An Example of the Belief Change Problem	1
1.2	Some Questions About the Belief Change Problem	2
<b>2</b>	<b>History</b>	5
2.1	The Beginnings	5
2.2	The Impact in Philosophy	6
2.3	The Impact in Artificial Intelligence	7
<b>3</b>	<b>The AGM Model</b>	9
3.1	The Language	9
3.2	Logical Consequence	10
3.3	Belief Sets and Possible Worlds	11
3.4	Basic Ideas of AGM Theory	12
3.5	A Syntactic Approach to Contraction	14
3.6	A Syntactic Approach to Revision	17
3.7	Relations Between Contraction and Revision	19
3.8	Partial Meet Operations	20
<b>4</b>	<b>Equivalent Characterizations</b>	25
4.1	Possible World Models	25
4.2	Epistemic Entrenchment	31
4.3	Specified Meet Contraction	35
4.4	Kernel Contraction	38
4.5	Safe Contraction	39
<b>5</b>	<b>Criticism of the Model</b>	41
5.1	The Recovery Postulate and Minimal Change	41
5.2	The Success Postulates	43
5.3	Remainder Sets: Information vs. Informational Value	44
5.4	The Expansion Property	44

5.5	Are Belief Sets Too Large? . . . . .	46
5.6	Lack of Information in the Belief Set . . . . .	47
<b>6</b>	<b>Belief Bases</b> . . . . .	49
6.1	Representing Belief States with Belief Bases . . . . .	49
6.2	Change Operations on Belief Bases . . . . .	51
6.3	Belief Base Revision from Belief Base Contraction . . . . .	54
6.4	Other Belief Base Approaches . . . . .	55
6.5	Base-Generated Operations on Belief Sets . . . . .	56
<b>7</b>	<b>Iterated Change</b> . . . . .	59
7.1	Revising Epistemic States . . . . .	59
7.2	Major Classes of Iterable Operations . . . . .	62
7.3	Making AGM Contraction Iterable . . . . .	63
<b>8</b>	<b>Non-Prioritized Change</b> . . . . .	65
8.1	Classification of Revision Operations . . . . .	65
8.2	Some Constructions of Non-Prioritized Revision . . . . .	66
8.3	Non-Prioritized Contraction . . . . .	68
<b>9</b>	<b>Multiple Change</b> . . . . .	69
9.1	Choice and Package Contraction . . . . .	69
9.2	Multiple Partial Meet Contraction . . . . .	70
9.3	Multiple Kernel Contraction . . . . .	71
9.4	Sphere-Based Multiple Contraction . . . . .	72
<b>10</b>	<b>Alternative Operations of Change</b> . . . . .	75
10.1	Update . . . . .	75
10.2	Changes in the Strengths of Beliefs . . . . .	77
10.3	Resource-Bounded and Local Change . . . . .	78
10.4	Paraconsistent Belief Change . . . . .	80
10.5	Some Other Operations of Change . . . . .	81
<b>11</b>	<b>Extended Representations of Belief States</b> . . . . .	83
11.1	Probability and Plausibility . . . . .	83
11.2	Ranking Models . . . . .	84
11.3	Conditionals and the Ramsey Test . . . . .	85
11.4	Modal, Doxastic, and Temporal Sentences . . . . .	87
11.5	Changes in Norms, Preferences, Goals, and Desires . . . . .	87
<b>12</b>	<b>Applications, Connections, and Implementations</b> . . . . .	89
12.1	Non-Monotonic and Defeasible Logic . . . . .	89
12.2	Modal and Dynamic Logics . . . . .	90
12.3	Horn Clause Contraction . . . . .	92
12.4	Description Logic . . . . .	93
12.5	Belief Change by Translation Between Logics . . . . .	93

<b>Contents</b>	ix
12.6 Truth and Learning .....	94
12.7 Connections with Social Choice .....	95
12.8 Implementations .....	96
<b>13 Multiagent Belief Change</b> .....	<b>99</b>
13.1 Merging .....	99
13.2 Argumentation .....	101
13.3 Game Theory .....	102
<b>14 Descriptor Revision</b> .....	<b>105</b>
14.1 Belief Descriptors .....	105
14.2 Descriptor Revision .....	106
14.3 Connections with AGM .....	108
14.4 Further Developments .....	109
<b>References</b> .....	<b>111</b>