### Highlights

#### Modelling the assembly and flexibility of antibody structures

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- Conformational flexibility of antibodies affects their function.
- Currently available experimental data pose challenges to the modelling of full-length antibody assemblies.
- Integrative modelling combining experiments and computational methods can address this challenge.

## Modelling the assembly and flexibility of antibody structures

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#### Abstract

Antibodies are large protein assemblies capable of both specifically recognising antigens and engaging with other proteins and receptors to coordinate immune action. Traditionally, structural studies have been dedicated to antibody variable regions, but efforts to determine and model full-length antibody structures are emerging. Here we review the current knowledge on modelling the structures of antibody assemblies, focusing on their conformational flexibility and the challenge this poses to obtaining and evaluating structural models. Integrative modelling approaches, combining experiments (cryo-electron microscopy, mass spectrometry etc.) and computational methods (molecular dynamics simulations, deep-learning based approaches etc.), hold the promise to map the complex conformational landscape of full-length antibody structures.

*Keywords:* Antibody structures, Antibody isotypes, Conformational sampling, Antibody flexibility

#### 1 1. Introduction

Antibodies are large protein assemblies secreted by B cells in response to immune challenges. They are considered as one of the most promising therapeutics, due to their ability to specifically recognise antigens and interact

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with receptors on different effector cells in the immune system to orches-5 trate immune response. Understanding the structural assembly of antibod-6 ies is important to dissect the mechanisms of immune response and improve 7 the design of therapeutic biologics. Antibodies are typically depicted as Y-8 shaped protein assemblies of two heavy (H) and two light (L) chains. Two 9 H-L pairs form the variable (V) region, which contains antigen-binding sur-10 faces specific to an antigen [1] (Figure 1A). The rest of the molecule forms 11 the constant (C) region, harbouring binding sites for receptors and a number 12 of features which govern the flexibility and integrity of this protein assem-13 bly: (i) disulphide bonds bind disparate H and L chains together to form the 14 assembly; (ii) some antibody isotypes contain a long, flexible hinge linking 15 the antigen binding fragment (Fab) and the crystalisable fragment (Fc), and 16 allow large movements of the antibody arms; (iii) post-translational modifi-17 cations (PTM), such as glycosylation, can be found decorating the antibody 18 molecule, adding further complexity to study these protein assemblies. In 19 humans, there are a total of nine isotypes, each with variable hinge lengths 20 (or an extra immunoglobulin domain in place of the hinge), disulphide bond 21 and glycosylation patterns (Figure 1B). An additional tailpiece allows these 22 assemblies to be anchored on cell surfaces in the form of B cell receptors 23 (BCR). B cells can switch between isotypes, in a process called Class-Switch 24 Recombination (CSR), to adapt themselves in different biological contexts 25 (reviewed in [2]). 26

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A large number of structural studies is dedicated to antibodies, but we 28 are only beginning to address and understand the principles of assembly and 29 functional stability of full-length antibody structures. The solution of com-30 plex structures covering both Fab and Fc is important to understand the 31 multifunctional properties of antibody assemblies: techniques such as cryo-32 electron microscopy (cryo-EM) are beginning to fill in the gap for a com-33 plete picture of these large macromolecular assemblies (Table 1). Existing 34 full-length antibody structures capture a variety of complex assemblies that 35 antibody can form, at times coupled with other proteins, one example being 36 the joining chain (encoded by the gene *JCHAIN*) which binds monomers of 37 IgM and IgA to form secretory antibodies [27]. These high-order assemblies 38 (e.g. secretory IgM are typically pentameric, comprising a total of 20 anti-39 body protein chains and 1 joining chain) are complex, and pose significant 40 challenges to computational approaches such as AlphaFold-Multimer [28]. 41 Currently, the available 3D structural information is still heavily skewed to-42



Figure 1: Human antibody structures. (A) Schematic of human IgG1 in complex with the antigen (SARS-CoV-2 Spike Receptor Binding Domain [RBD] [PDB 6zlr] illustrated here as an example) and the Fc receptor  $Fc\gamma RIII$ -B (PDB 1t83). One half of the full-length IgG1 was depicted with cartoon illustration (PDB 1hzh) and another half was depicted with a simplified domain illustration. (B) Schematic of all nine human isotypes with labels of the hinge length [3], number of inter-chain disulphide bonds [4, 5, 6, 7, 8] and glycosylation sites [9, 10, 11, 12]. (C) The number of human antibody structures available in the SAbDab database [13] (accessed 5 October, 2023) and the number of full-length human antibody structures available on the Protein Data Bank (PDB, accessed 5 October, 2023).

PDB ID	Description	Species	Isotype	Experimental methods	Resolution	Publication
1mco	An antibody harbouring hinge deletion	Human	IgG1	X-ray crystallography	3.20 Å	[14]
1iga	X-ray scattering analysis of serum IgA1	Human	IgA1	Solution scattering	N/A	[15]
1hzh	Antibody recognising	Human	IgG1	X-ray crystallography	2.70 Å	[16]
1r70	Recombinant hapten- hinding monomeric IgA2	Human	IgA2	Solution scattering	N/A	[17]
2esg	IgA1 complexed with hu- man serum albumin	Human	IgA1	Solution	N/A	[18]
2qtj	Dimeric IgA1 isolated from myeloma serum	Human	IgA1	Solution	N/A	[19]
3chn	Secretory IgA1 isolated from colostrum samples	Human	IgA1	Solution	N/A	[20]
3 cm 9	Secretory IgA2 isolated from colostrum samples	Human	IgA2	Solution	N/A	[21]
5dk3	Pembrolizumab structure	Human	IgG4	X-ray crystallography	2.28 Å	[22]
6gfe	Therapeutic anti-NPRA antibody	Human	IgG4	X-ray crystallography	1.80 Å	[23]
7xq8	IgM BCR with Fab from HIV-1 neutralising anti- body VRC-01	Human	IgM	cryo-EM	3.30 Å	[24]
8ady, 8adz, 8ae0, 8ae3, 8ae2	Human IgM of different conformations	Human	IgM	cryo-EM	5.20 Å, 6.70 Å, 7.10 Å, 6.80 Å, 8.50 Å	[25]
1igt	Anti-canine lymphoma monoclonal antibody	Mouse	IgG2a	X-ray crystallography	2.80 Å	[26]

Table 1: Current available full-length antibody structures available in the Protein Data Bank (PDB). Human structures are organised in chronological order of the associated publications. HIV-1, human immunodeficiency virus-1; NPRA, natriuretic peptide receptor A; BCR, B cell receptor; cryo-EM, cryo-electron microscopy.

wards Fab structures (Figure 1C). Given the advancement of single-cell sequencing methods to generate antibody sequence data comprising both the
V and C regions [29], full-length sequences are increasingly accessible in antibody discovery programs and basic research in B cell immune response *in vivo*. These data motivate antibody structural studies beyond the V region,
to investigate the structural and functional implication of biological processes
such as CSR in changing the antibody C region.

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Nowadays, a wide array of approaches can complement experimental 51 structure determination under the umbrella of integrative structural biology. 52 In this review, we survey existing efforts to apply and adapt such approaches 53 to study full-length antibody structures. The inherent conformational flexi-54 bility of the Fab arms is one of the major factors posing challenges to accurate 55 structure determination and modelling of antibody assemblies. Following the 56 rise of deep learning models such as AlphaFold2 [30] in generating accurate 57 models of protein structures, we discuss how these techniques, in combination 58 with molecular simulations, can be integrated with experimental approaches 59 to probe the structural landscape of antibodies and understand the principles 60 of antibody assembly. 61

#### <sup>62</sup> 2. Conformational flexibility of antibodies

In the last decade, thanks to the increased availability of single particle 63 electron microscopy, the vastness of the possible conformational landscapes 64 of antibodies has been addressed [23, 25, 31]. Relative orientation of the 65 subdomains is guided by the flexibility, which is affected by the hinge length 66 and the number of disulphide bonds in the same region (Figure 1). As these 67 are the main discriminators of IgG subclasses, different isotypes are charac-68 terized by varying conformational minima, speculated to correlate with their 69 biological functions [32]. Considering the flexibility of the Fab arms [33]. 70 the presence of two additional disulphide bonds in the hinge makes IgG2 71 the most rigid among IgG isotypes. Although IgG4 has the same number of 72 disulphide bonds, the slightly shorter hinge (12 residues vs 15) with respect 73 to IgG1, leads to reduced inter-domain flexibility [23, 32]. Interestingly, the 74 flexibility order (IgG3 > IgG1 > IgG4 > IgG2) seems to reflect quite well 75 the ability to bind the receptor  $Fc\gamma R$  [32, 33]. IgG4 and IgG2 are generally 76 less potent [32]; IgG2, in particular, has lost the ability to simultaneously 77 bind two antigens [34, 35]. IgG3, containing the longest hinge, was proposed 78



Figure 2: Schematic summary of the role of inherent flexibility and glycosylation in defining conformational ensembles of antibody assemblies.

<sup>79</sup> to allow binding to antigens less targetable by other isotypes [32]. A longer <sup>80</sup> hinge was also shown to improve antibody-mediated effector functions [36]. <sup>81</sup> Furthermore, the amino acid composition in the N-terminal end of the hinge <sup>82</sup> has been shown to affect Fc flexibility, in terms of the extent of CH2-CH2 <sup>83</sup> bending, as well as exhibiting different motions, which may selectively dis-<sup>84</sup> rupt the binding to Fc $\gamma$ R receptor [37].

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Binding to Fc receptors is further modulated by post-translational modi-86 fications (PTMs) such as glycosylation. Glycans covalently linked to the IgG 87 CH2 domain (position Asn297, EU numbering) are known to affect Fc stabil-88 ity and modulate the interaction with  $Fc\gamma R$  and FcN receptors, via specific 80 glycan-glycan interactions [34, 38, 39]. Thus, modifications of even a single 90 sugar unit can affect and alter Fc protein binding [40]. Even though N-linked 91 glycosylation sites are fairly conserved among the isotypes, the diversity of 92 glycan structures can lead to 36 functional states (for IgG1), depending on 93 the expression systems used (Figure 2), which differ in terms of enzyme 94 expression patterns [41]. Glycosylation can also appear elsewhere in the an-95 tibody: it is worth noting that IgG4 Fabs tend to be more glycosylated while 96 IgG3 shows an unique O-linked glycosylation pattern in the hinge region, a 97 feature shared with human IgD and IgA1 [32, 42]. Differences in glycosyla-98 tion states were reflected in distinct conformational minima being sampled in 99 molecular dynamics simulations [38, 43]. Whether Fab or hinge glycosylation 100 can alter the structure and biological functions is still under investigation. 101 Fab glycosylation may reduce antibody half-life, due to steric clashes in FcR 102 binding, while hinge O-linked glycosylation could improve resistance towards 103 proteolysis [32, 42]. 104

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For the Fab, flexibility can conceivably affect antigen binding. The mutual 106 orientation of the two Fab arms may affect the shape of the paratope, i.e. the 107 antigen binding site. The six hyper-variable loops composing the paratope 108 are characterized by conformational rearrangement in the microsecond-to-109 millisecond timescale while the elbow angle (angle between variable and con-110 stant Fab regions, Figure 2), the VH-VL and CH1-CL motions is in the low 111 nanosecond timescale [44], with a higher degree of freedom in  $\lambda$  rather than 112  $\kappa$  L chains [45]. Recent *in silico* mutagenesis data highlighted VH-VL angle 113 sensitivity, and the consequential change in solvent-accessible surface area 114 even at distal positions of the structure [46]. Bound and unbound Fab states 115 are characterized by different patterns of interaction. Upon antigen bind-116

ing, an allosteric signal propagates across L and H chains and reaches the 117 CH1 domain [47, 48]. Mutations distal to the antigen-binding site (e.g., in 118 the VH-VL interface) can influence binding by modulating the interdomain 119 conformations as well as by allosterically perturbing the paratope [49]. The 120 hinge adds further to the effects of flexibility on antigen binding: interest-121 ingly, it has been recently proposed to act not just a flexible linker but to 122 be able to take part in intradomain/intrachain communication [50], raising 123 the possibility of stabilising antigen binding through mutations beyond the 124 Fab. Hinge disulphide cross-over was shown to enhance receptor binding in 125 agonistic antibodies [51]. Furthermore, due to the nature of the hinge, the 126 two Fabs are now recognised to be asymmetrical in terms of intradomain ge-127 ometries and motions [52, 53]. A comparison of the dynamics of full-length 128 IgG1 (PDB 1hzh) with one of its Fab in isolation showed that Fabs internal 129 motions are negligible with respect to Fabs moieties fluctuations in the full 130 structure [52], suggesting overall dynamical communication via the hinge and 131 the constant region. 132

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It is thus important to understand how hinge flexibility can be controlled 134 to fine-tune antibody function. It has been shown via mutagenesis experi-135 ment and treatment with thioredoxin that enhanced flexibility of IgG1, par-136 ticularly in the hinge region, could lead to reduction of Fc-mediated activity. 137 The authors suggests that the enhanced flexibility of Fabs can limit interac-138 tions by steric hinderance of Fc-FcR interactions [54]. In light of the role of 139 Fabs in Fc-FcR interactions, enhanced hinge flexibility could also allow the 140 Fabs to move far away from the Fc, abrogating antibody-dependent cellular 141 cytotoxicity (ADCC). Furthermore, increase in flexibility will also result in 142 an increased exposure of buried proteolysis binding site and PTMs hotspot 143 leading to aggregation and degradation [38, 54]. 144

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Recently, biophysical experiments using Hydrogen-Deuterium Exchange 146 Mass Spectrometry (HDX-MS), Surface Plasmon Resonance (SPR), Hydroxyl 147 Radical Footprint (HRF-MS) and high-speed Atomic Force Microscopy (AFM) 148 proved that ADCC, through  $Fc\gamma$ IIIR-IgG1 interactions, is stronger when full-140 length antibodies were used in the experiments, in comparison to Fc-only 150 constructs. 3D structural modelling based on these experimental results cor-151 roborated the hypothesis of the need of the Fab to improve binding of  $Fc\gamma R$ , 152 through which ADCC is exerted [55, 56]. Consequently, this limits the rela-153 tive orientation between Fc and Fab to accommodate Fc $\gamma$ R. Such conforma-154

tions seem to be preferred if the antibody is bound to the antigen, suggesting allosteric conformational cooperativity between Fab and Fc [57, 58].

#### <sup>157</sup> 3. Modelling the assembly of antibodies

The sheer complexity and the highly flexible nature of antibodies <del>calls</del> 158 call for specialised methods and considerations in modelling these protein 159 assemblies. AlphaFold2 [30] and AlphaFold-multimer[28] were designed for 160 general-use protein structural modelling. It has been shown that AlphaFold2 161 is not aware of antibody-specific structural features, such as the conformation 162 of CDR loops [59]. Several Antibody-specific pipelines (ABodyBuilder [60], 163 RosettaAntibody [61], RepertoireBuilder [62], etc.) have made significant 164 progress in improving the prediction of V region using structural modelling. 165 With respect to the more challenging task of modelling CDR3 loops, comparison 166 of those tools against AlphaFold2 [30] and AlphaFold-multimer[28], which 167 were designed for general-use protein structural modelling, suggested that 168 the AlphaFold methods achieved comparable performance for antibodies 169 and nanobodies [59]. The advent of deep learning techniques further im-170 proved V region modelling: for example, ABodyBuilder2 [63] was trained 171 with antibody structures using a similar architecture as AlphaFold2. A 172 more comprehensive benchmark will ascertain the differences between these 173 methods in modelling antibodies. Recent advancements in antibody language 174 models represent another attempt to improve antibody structural modelling; 175 specifically, these models often return attention scores, which denote rela-176 tionships between residues in the input sequence that can be interpreted as 177 spatial proximity in antibody structures. IgFold [59] was built upon the anti-178 body language model AntiBERTy [64] and incorporated structural templates 179 to capture correct location of residues during structural modelling. 180

These approaches focused nevertheless on modelling the V region, and 181 better methods are still needed to study and model full-length antibody 182 structures, taking into account antibody-specific considerations. A num-183 ber of recent methods aim to model the structures of large protein com-184 plexes, for example by first dividing the complex into subunits, and then 185 re-assemble models of these subcomponents using Monte Carlo tree search 186 methods [65]. Elsewhere, AlphaFold-multimer [28] has made encouraging 187 progresses on multimer assembly, and thus could hold promise in modelling 188 large antibody assemblies, but problems still exist on inter-domain orienta-189 tion [66]. This is a well-recognised issue in antibody structural modelling, 190



Figure 3: Integrative modelling approach, combining experimental data and computational modelling, can be adopted to model the flexibility of antibody assemblies. See the main text for further details.

mostly on specifying the angle between the VH and VL domains, as this has 191 been shown to be an important factor affecting the geometry of the antigen-192 binding pocket [67]. Similarly, the positioning and packing angles of the C 193 domains should be considered during the modelling of the complete antibody 194 assembly. Here, the presence of the hinge for some isotypes, and the diversity 195 in its length, further complicates the assembly of immunoglobulin domains 196 during modelling using tools such as AlphaFold. This is most notable for hu-197 man IgG3, which contains a hinge of over 60 residues, representing a major 198 challenge to predict domain orientation in full-length antibody structures. 199

#### 200 4. Future direction

Recently, successes in the solution of intact antibody structures have been reported [24, 25], though some of them still miss parts of the full-length antibody assembly [68], illustrating existing experimental difficulties in acquiring the intact antibody structure. Computational routes offer an alternative which complements experimental studies. Integrative modelling combining experimental data and computational methods hold the promise of consid-

ering the conformational flexibility of antibodies whilst incorporating exper-207 imental measurements to constrain computational predictions (Figure 3). 208 For example, cross-linking mass spectrometry provides distance restraints 209 between protein domains [69], and methods such as cryo-EM captures di-210 verse structural snapshots indicating various conformations of large protein 211 assemblies [70]. Such experimental information can serve either as structural 212 templates or as ground-truths for evaluating the predicted models. Here, 213 considering the inherent flexibility of antibodies, it remains a question on 214 how best to evaluate models of antibody structures. Traditionally, models 215 are compared against X-ray crystal structures. Modelling antibody struc-216 tures as an ensemble of possible conformations will perhaps reflect better the 217 diversity of conformations that antibodies can adopt. 218

3D structural modelling, using either (or a combination of) homology 219 modelling or deep-learning approaches, can model full-length antibody struc-220 tures. Here, different conformations provided by these modelling pipelines 221 can serve as different starting conformations for molecular dynamics simu-222 lations. Recent works have been taken to explore multiple conformational 223 states of predicted protein models by modifying the multiple sequence align-224 ment (MSA) input of AlphaFold [71]. Simulations using different starting 225 conformations allow a more extensive sampling of possible conformational 226 states, as done in a number of simulation studies [52, 57, 72]. In return, the 227 inter-domain conformation sampled in MD simulation facilitates the mod-228 elling of the flexible linker between domains (such as hinge) in antibody 229 structural modelling process. Again, experimental data provide constraints 230 to restrict the sampling of conformations to reflect *in vitro* behaviours of the 231 antibody; on the other hand, insights from simulations can inform further 232 experimental investigations to deeply characterise the dynamical behaviours 233 of antibodies (Figure 3). Such integrative modelling paradigm shows promise 234 in modelling other large protein complexes [73]; on modelling antibodies, col-235 laborative efforts between computational modellers and various experimental 236 communities will facilitate the adoption of these combinations of techniques 237 to map the complexity of the antibody structural landscape. Not only will 238 this enable rational design of therapeutic antibodies to optimise their func-230 tion, efficient modelling of antibody structures beyond the V region will en-240 able studies on the structural implication of biological processes such as CSR 241 in naturally occurring antibody response in vivo. 242

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