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8 **Protein structure and aggregation: a marriage of necessity ruled by**
9 **aggregation gatekeepers**

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23 **Abbreviations**

24 **APR:** Aggregation-prone region – **GK:** aggregation gatekeeper – **IDP:** Intrinsically Disordered
25 Protein – **PN:** Proteostasis Network
26

27 **Keywords**

28 protein structure and stability, protein aggregation, amyloid, proteostasis, kinetic partitioning
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34 Abstract

35 Protein aggregation propensity is a pervasive and seemingly inescapable property of
36 proteomes. Strikingly, a significant fraction of the proteome is supersaturated, meaning that
37 for these proteins, the native conformation is less stable than the aggregated state.
38 Maintaining the integrity of a proteome under such conditions is precarious and requires
39 energy-consuming proteostatic regulation. Why then is aggregation propensity maintained at
40 such high levels during long evolutionary timescales? We argue that the conformational
41 stability of the native and aggregated states are correlated thermodynamically and that
42 codon usage strengthens this correlation. As a result, the folding of stable proteins requires
43 kinetic control to avoid aggregation, provided by aggregation gatekeepers. These unique
44 residues are evolutionarily selected to kinetically favour native folding, either on their own or
45 by co-opting chaperones.

46

47

48 **Protein aggregation propensity is a constant threat to cellular health**

49 The most widely studied aggregation mechanism is the formation of intermolecular β -sheets
50 by short **Aggregation-Prone Regions** (APRs, see Glossary). Prediction software can detect
51 APRs based on their physicochemical properties directly in primary protein sequences (more
52 below). The assembly mechanism of APRs can give rise to highly structured amyloid fibrils or
53 to more amorphous aggregates. The specific outcome of this process depends to a large
54 extent on experimental and/or physiological conditions. As we have pointed out before, many
55 amorphous aggregates still show an enrichment in β -sheet structure and are thus based on
56 the same basic assembly mechanism, although such amorphous structures may also form in
57 other ways [1]. In this Opinion, we focus on the cross- β aggregation mechanism, irrespective
58 of whether it leads to higher order structure such as amyloid and we assume that β -sheet-
59 enriched amorphous aggregates consist of shorter stretches of β -sheets clustered into less
60 defined entities. The combined output of the myriad of computational methods that are
61 currently available for the prediction of APRs in entire proteomes [2] suggests that most likely
62 less than 1% of proteins in any proteome have no APR and are hence unaffected by protein
63 **aggregation propensity** (see Glossary). In fact, on average about 20% of residues in a protein
64 sequence have tendency to misfold into β -structured aggregates [3]. The ensemble of APRs
65 in a polypeptide have been called its **intrinsic aggregation propensity** (see Glossary). The
66 intrinsic aggregation propensity of a protein sequence can further be modulated by other
67 factors, such as conformation, concentration, and environmental conditions to result in its
68 actual aggregation propensity (Box 1) [4-7]. In recent years, we have come to realize that 10%
69 to 30% of proteins are supersaturated under physiological conditions meaning they are
70 expressed at abundances exceeding their intrinsic solubility [8-10]. Hence, a significant
71 amount of metabolic energy has to be invested in proteostatic control ensuring proteins get
72 and remain properly folded [11]. The erosion of this proteostatic control is also why ageing
73 organisms are increasingly at risk of aggregation-associated diseases [12].

74 In this Opinion article, we discuss how this precarious situation came to be. Firstly, we argue
75 that intrinsic aggregation propensity is directly correlated to globular fold stability. The
76 intricate stereochemical packing of the hydrophobic core required for the thermodynamic
77 stability of the native state severely limits the extent to which protein sequences can be
78 optimized to avoid intrinsic aggregation propensity without critically destabilizing the native
79 fold (Figure 1A). This thermodynamically imposes a solubility limit on most proteins, and
80 causes a large fraction of the proteome to be **metastable** (see Glossary) at physiological
81 concentrations. Secondly, we review mechanisms that help avoid this thermodynamic trap
82 by **kinetically partitioning** (see Glossary) the native fold from the aggregated state [13],
83 allowing proteins to be expressed for biologically relevant timescales at supersaturated
84 concentrations.

85

86 **Widespread aggregation propensity causes proteome metastability**

87 The classical image of a folded protein is that of a chain of amino acids folded in on itself,
88 forming local secondary structures such as α -helices, β -sheets, and loops, which arrange

89 further into a predefined three-dimensional structure, i.e. the functional form or native fold.
90 It has long been clear that some proteins can also adopt a drastically different structure,
91 known as the aggregated state. In this configuration, hydrophobic segments of the protein
92 with a high propensity for β -sheet formation and low net charge engage in extended
93 intermolecular β -sheets with identical counterparts in a sequence-specific manner [14]
94 (Figure 1B). Multiple sheets can align length-wise and as such extensively interact through the
95 interdigitation of their sidechains, perpendicularly to the β -sheet axis. The resulting “cross-
96 β ” conformation is highly stable, both mechanically and physico-chemically. Indeed, the
97 combination of the regular stacking of hydrophobic side chains in subsequent layers in the
98 fibril core, combined with the extensive network of backbone hydrogen bonds connecting the
99 layers renders the mature aggregate highly stable, certainly when compared to the well-
100 documented marginal stability of biologically functional native states, which often require
101 flexibility for function. A more complete discussion on amyloid stability can be found
102 elsewhere [15, 16], but one prominent difference is the fact that the polypeptide fulfils its full
103 backbone hydrogen bonding potential in the amyloid state, where this is not true for globular
104 proteins that typically contain a mix of secondary structure element and loops. However, this
105 should be mitigated by the recent realisation that regions of suboptimal H-bond geometry
106 and hence structural frustration also occur in the β -aggregated state [17].
107 The amyloid conformation is most well-known as the pathological hallmark of more than 30
108 degenerative diseases, in which specific proteins adopt this intermolecular β -conformation.
109 As a result, amyloid formation is sometimes considered a rare off-pathway event affecting
110 only a select group of proteins. However, intense research has made clear that most, if not
111 all, proteins carry within them an inherent tendency to form amyloid – in the form of short
112 segments with the right conjunction of physicochemical properties. The most important
113 factors that keep these regions from actually initiating aggregation is native protein folding
114 and the cellular **proteostasis** machinery (see Glossary) [18]. Many proteins are obligate
115 **chaperone** (See Glossary) substrates and aggregate when translated *in vitro* in the absence
116 of these factors [19-22]. Importantly, with some exceptions (discussed below) most
117 chaperones are not classic catalysts that stabilize the transition state of the folding reaction.
118 Rather by binding to APRs they prevent or reverse the interactions of exposed hydrophobic
119 regions thereby inhibiting aggregation [23]. In doing so they not only increase folding yields
120 but can also increase folding rates, which we believe they achieve by destabilizing local
121 conformational minima resulting from erroneous hydrophobic collapse. Indeed, modern
122 proteins are riddled with intrinsic aggregation propensity: over 90 % of globular proteins
123 contain at least one region with a tendency to form β -structured intermolecular aggregates
124 [3] making APRs universal handles to partition aggregation from folding and to regulate
125 hydrophobic collapse. Moreover, aggregated states are generally more stable than their
126 native counterparts, even at common cellular concentrations, effectively making the native
127 fold a metastable conformation that is only kinetically protected from converting to the
128 aggregated state [13, 24]. This situation imposes a thermodynamic limit on the concentration
129 at which most proteins can be functionally expressed, as is seen from the relation between

130 protein aggregation and both mRNA levels [25-27] and cellular protein abundance [28]. The
131 consequences for proteome stability are profound: in recent years, it has become clear that
132 a large portion of the proteome exists in a supersaturated state under physiological
133 conditions, meaning their abundance exceeds their intrinsic solubility, giving rise to a
134 metastable sub-proteome that likely plays an important role in age-related disease [8-10].

135

136 **Why do high levels of intrinsic aggregation propensity persist during evolution?**

137 Following our recent work [18], we propose that the most straightforward explanation for the
138 evolutionary persistence of protein aggregation propensity is that it is a co-evolutionary side-
139 effect of globular protein structure. Stable globular protein folds require both secondary
140 structure propensity and extensive hydrophobic cores. Furthermore, proteins are synthesised
141 as linear polymers, and globular folds require hydrophobic segments of sufficient length to
142 traverse the core (Figure 1A). Sequence segments where hydrophobicity coincides with high
143 β -sheet propensity have the emergent property of aggregation propensity (they are called
144 Aggregation-Prone Regions or APRs [4, 6, 7, 29, 30]).

145 Importantly, as long as the protein maintains its native state such APRs cannot engage in
146 alternative interactions, which typically requires at least some degree of unfolding [18, 31].
147 However, there is a deeper link between native fold stability and aggregation propensity that
148 is becoming clear: a survey of point mutations showed that mutations that decrease
149 aggregation propensity tend to decrease native state stability and *vice versa* [32, 33]. The
150 same concept was explored in a systematic computational mutational analysis of amyloid
151 structures of proteins for which the structure of the native fold was also known: it was again
152 found that mutations that disrupt the amyloid state also tend to decrease the stability of the
153 native fold [34]. Moreover, the aggregation propensity of aggregation-prone segments
154 correlates to their contribution to native state stability: the segments that make up the most
155 stable parts of the native structure tend to have the highest aggregation propensity.
156 Furthermore, aggregation propensity is higher in proteomes of extremophiles, whose
157 proteins by definition require more thermodynamic stability [34]. And finally, at the other
158 end of the spectrum, intrinsically disordered protein (IDP) domains, which are by definition
159 devoid of stable three-dimensional structures, are the sole class of naturally occurring
160 polypeptides that harbour significantly fewer predicted aggregation-prone regions [3, 33].
161 This suggests that the only evolutionary pathway to lower aggregation propensity is through
162 the loss of globular protein structure. Of importance, there are two main sources of APRs: the
163 majority stem from hydrophobic core formation as discussed above, but the second type finds
164 its origins in functional sites, such as protein-protein interaction sites [35]. Whereas many
165 disordered regions have successfully shed the APRs that arise as a result of globular structure,
166 they do still contain the second class of APRs associated with functional interactions [36]. In
167 IDPs however, these take their own more polar flavour and the aggregation propensity is
168 driven more by β -sheet propensity and less by hydrophobicity with Tyr, Gln and Asn as typical
169 enriched amino acids [37, 38]. The aggregation propensity of these regions is suppressed by
170 being embedded in highly charged sequences that act as so-called **entropic bristles** (see

171 Glossary)[39], but can still lead to aggregation, often in an age-dependent manner. In fact,
172 several of the most intensely studied amyloid-forming proteins, tau, A β , TDP43 and α -
173 synuclein [40, 41], are disordered or have substantial intrinsically disordered regions [42].
174 Intriguingly, aggregation propensity is conserved even down to the genetic level, as mutations
175 that potentially abrogate amylogenic stretches are often inaccessible through single point
176 mutations as a result of the genetic code [34]. Preservation of amyloid propensity thus
177 appears to be deeply embedded within in the genetic code, most likely as a side effect of
178 favouring the conservation of native protein structure. As a result, it is almost impossible to
179 evolve globular structure without also increasing aggregation propensity: it appears as if
180 globular protein structure is addicted to aggregation propensity and the strongest aggregate-
181 forming sequences are among the most deeply conserved in the core of globular protein
182 structures. These considerations explain why so many proteins end up being supersaturated
183 [8-10].

184

185 **Kinetic partitioning of globular structure to the rescue of the Anfinsen hypothesis**

186 Anfinsen's famous thermodynamic hypothesis stated that proteins fold spontaneously
187 because the biologically active native state is the point of the lowest energy in the
188 conformational landscape [43]. This concept was already put into perspective by the
189 realisation that many proteins require chaperone intervention in order to fold, but the idea
190 of a supersaturated sub-proteome puts even larger question marks by the Anfinsen postulate
191 [44]. If, as we argue, most proteins are indeed aggregation-prone and thermodynamically
192 fated to form aggregates, how is globular protein folding secured? To a large extent, this
193 appears to be achieved through kinetic partitioning, in which the rate of protein folding is
194 made to exceed that of aggregation at relevant concentrations, and the native state has a
195 sufficiently long lifetime by virtue of a slow unfolding rate, so that even if proteins are
196 destined to aggregate eventually, they are able to adopt and maintain their native fold for a
197 physiologically relevant timespan. In fact, many proteins that are involved in aggregation
198 pathologies have a shorter than average lifetime, suggesting they are protected from
199 aggregation by a fast turnover (i.e. they are degraded before they can aggregate) [45], but
200 this hinges on efficient protein degradation which notoriously declines during ageing [46].
201 The so-called kinetic partitioning, where the native state is metastably trapped for as long as
202 it is required for function, is achieved through both protein-intrinsic features as well as
203 protein-extrinsic factors (Figure 2).

204

205 *Protein-intrinsic kinetic partitioning by aggregation gatekeepers*

206 "**Aggregation gatekeepers**" (GKs; see Glossary and Figure 2B) are charged residues and β -
207 structure breakers that directly flank APRs, thereby reducing aggregation propensity [3]. Once
208 again, this underpins the tight link between fold stability and aggregation propensity, and
209 shows that evolution had to stop short of completely abrogating APRs since this would require
210 introduction of charged residues or the disruption of secondary structure in the hydrophobic
211 core of the protein. Instead, GKs are found at the first position where the polypeptide

212 emerges from hydrophobic core, often still at some depth from the protein surface. As a
213 result, ‘aggregation gatekeeping’ comes at a significant cost to native state stability as each
214 GK on average reduces the thermodynamic stability of the native fold by about 0.5 kcal/mol
215 [47]. Moreover, the conservation of GKs scales to the aggregation propensity of the region
216 they are flanking [48]. Such evolutionary conservation despite a negative effect on protein
217 stability is typically seen in functionally important residues, such as in active sites, leading us
218 to propose that GKs are functional class of residues unto themselves. Apart from their
219 thermodynamic effects, GKs likely also slow down the kinetics of native protein folding, as
220 removing charges altogether is known to increase protein folding rates [49]. However, GKs
221 slow down the aggregation reaction *more* than they slow down native folding, making them
222 a quintessential example of kinetic partitioning to circumvent the constraints that arise from
223 the entanglement between aggregation propensity and fold stability.

224 Interestingly, we recently demonstrated that even within the class of the charged GK
225 residues, there is an important distinction between positively and negatively charged GKs
226 [50]. The positively charged moieties on Lys and Arg are more readily dehydrated than their
227 negatively charged counterparts Asp and Glu, and they have longer and more hydrophobic
228 sidechains. As a result, positively charged GKs are more readily incorporated into a globular
229 protein but unfortunately are also more compatible with amyloid structure and thus poorer
230 aggregation breakers. In fact, positively charged GKs barely destabilize the aggregated state
231 and only marginally slow down the aggregation process. As a compensatory mechanism,
232 positively charged GKs are specifically recognized and assisted by molecular chaperones,
233 which augment the kinetic partitioning capacity of the gatekeepers [51-60]. The positively
234 charged GKs have therefore been referred to as “non-autonomous”. Negatively charged GKs,
235 on the other hand, both strongly disrupt amyloid structure and severely slow down its
236 formation and were therefore termed “autonomous” GKs [50]. However, because of the
237 entanglement between the stability of the native and aggregated states, the negatively
238 charged GKs are less compatible with native protein structure and can hence not always be
239 accommodated.

240

241 *Molecular chaperones: protein-extrinsic partitioners*

242 Molecular chaperones are a diverse group of major effectors of the Proteostasis Network
243 (PN). Some, like the Proline-Prolyl isomerases catalyse protein folding, while others (such as
244 the Hsp70 and chaperonin family members) prevent aggregation (e.g. the small heat shock
245 proteins by virtue of their holdase activity), disaggregate aggregated species, or direct
246 terminally misfolded proteins towards appropriate degradation pathways [61]. Other
247 chaperones, like the Hsp90 family members, help maintain the integrity of the native state
248 using extensive interaction surfaces. Although molecular chaperones come in many varieties
249 with distinct modes of action, a recurring theme is that they recognize and bind their
250 substrates through exposed hydrophobic regions [56, 62-73]. Not only is exposed
251 hydrophobicity, and by extension APRs, a sign of incomplete folding or misfolding, but such
252 regions are also at risk of engaging in aberrant intermolecular interactions. By engaging their

253 clients, chaperones shield these hydrophobic regions, thereby preventing aggregation. In
254 effect, this mode of action is a form of kinetic partitioning, in which a large energetic barrier
255 is maintained between the native fold and the aggregated state (**Error! Reference source not**
256 **found.C**). Moreover, the interaction of chaperones with their clients results in an excluded
257 volume, decreasing local protein concentration and favouring the formation of intramolecular
258 interactions over intermolecular ones [74]. Finally, chaperones partially unfold their client
259 proteins, potentially resolving kinetically trapped misfolded states and accelerating the
260 folding process.

261 In effect, molecular chaperones constitute the ultimate evolutionary measure that maintains
262 modern proteomes in a metastable state in the face of widespread aggregation propensity. It
263 could be argued that chaperones are folding catalysts, in that they are not a part of the final
264 folded protein, and therefore do not affect the thermodynamics of protein folding. However,
265 classic enzyme catalysts generally increase reaction rates by binding to and therefore
266 stabilizing the rate-limiting transition state of a reaction. Except for the Proline-Prolyl
267 isomerases, it is unlikely that most chaperones increase the kinetics of protein folding in the
268 same manner by directly binding to and stabilizing the transition state of folding, given the
269 diversity in protein topology and sequence. By binding to APRs however, we think that
270 chaperones not only prohibit aggregate assembly (thereby increasing the folding yield) but
271 can probably in some cases also increase folding rates by destabilizing the ground state of
272 unfolded and partially (mis)folded conformations. Modifying the folding landscape in this
273 manner equally results in a lower kinetic barrier and hence faster folding. By binding APRs
274 and controlling hydrophobic surfaces chaperones are therefore not only the ultimate kinetic
275 partitioners between native folding and amyloid-like aggregation but also by smoothing out
276 the native folding landscape thereby both improving protein folding yields and rates. As a
277 result, large portions of modern proteomes depend on them for their solubility [75, 76].

278 As mentioned above, several classes of chaperones specifically prioritise hydrophobic
279 segments when they are flanked by positively charged residues, such as APRs flanked by
280 positive GKs [56, 63-73, 77]. We recently showed that because of this binding preference,
281 chaperones are able to recognize APRs most at risk of aggregating because of poor
282 gatekeeping [50]. This points towards a coevolution between GKs and molecular chaperones,
283 allowing even proteins with insufficiently protected APRs to reach appropriate cellular
284 concentrations through the concerted effects of positively charged GKs and molecular
285 chaperones.

286

287 *Co-translational folding: temporal partitioning?*

288 For small proteins, folding *in vitro* takes place on the μ second timescale. Translation of mRNA
289 into protein at the ribosomes however, is a slower process, as the prokaryotic translation
290 machinery produces 15-20 amino acids/s, and eukaryotic ribosomes work even slower, at 1-
291 5 amino acids/s on average [78]. This discrepancy in timing makes it highly likely that
292 substantial protein folding occurs before a protein is fully translated and is therefore still
293 physically attached to the ribosome, which has profound effects on the folding landscape

294 (Figure 2A and **Error! Reference source not found.**). Indeed, it has become abundantly clear
295 that many proteins do fold co-translationally, and that translational kinetics are optimized
296 for this very purpose: translational pause sites were found to be enriched in interdomain
297 regions over two decades ago, and, more recently, it was observed that pause sites are
298 enriched 20-60 aa downstream of sequence segments predicted to form subdomain co-
299 translational folding intermediates [79]. Simulations confirm that such pause sites allow
300 domains to fold more efficiently by preventing potential non-native interactions with not yet
301 formed C-terminal regions [80]. Aggregation-prone segments on the other hand, tend to be
302 enriched in optimal codons. Although not yet fully understood, this could suggest the
303 necessity for the regions containing APRs to be rapidly translated, allowing for at least partial
304 co-translationally folding and descending into the native folding basin before aggregation has
305 a chance to occur. In line with this, protein interaction sites, which are often hydrophobic and
306 tend to contain APRs, are depleted near the N-terminus of proteins [81]. This allows protein
307 domains to progress down the native folding funnel directly upon the emergence of an APR,
308 temporally partitioning native folding from aggregation (**Error! Reference source not found.**).
309 It is tempting to speculate that recent findings regarding the proximal translation of
310 interacting proteins [82] fit into the same framework: since interaction sites often require
311 exposed APRs in the monomeric subunits, coordinating the translation of the interacting
312 proteins so that the time of APR exposure in the subunits is minimized could be another form
313 of kinetic partitioning.

314 Ribosome association has an added benefit: physical linkage to the large ribosomes creates
315 an excluded volume around the nascent chain, effectively instituting a low local concentration
316 of exposed aggregation-prone regions (which is why the nascent chains being translated by
317 the ribosome are depicted on the “intramolecular” side of the folding landscape in Figure 2).
318 Indeed, it was recently shown that interaction with any soluble protein can indirectly increase
319 folding efficiency by preventing aggregation [74].

320 These factors make the translation process an effective form of kinetic partitioning. By
321 allowing folding to happen co-translationally, the chances of aberrant interactions and
322 misfolding are reduced, increasing the rate of the native folding reaction. Concurrently,
323 association with the ribosome creates an excluded volume which decreases the rate of
324 intermolecular interactions and hence aggregate formation.

325

326 **When partitioning fails**

327 The efficacy of the proteostasis network declines with age. This has long been viewed as one
328 of the major reasons why age is the predominant risk factor in many of the neurodegenerative
329 amyloidoses plaguing modern society [12]. Given the proteome metastability discussed
330 above, decreasing proteostasis logically results in aggregation of supersaturated proteins:
331 indeed, proteins known to precipitate in protein misfolding disorders are significantly more
332 supersaturated than the remainder of the proteome, and therefore more dependent on
333 kinetic partitioning to remain soluble [44, 83]. Moreover, it has become abundantly clear that

334 chaperones have an important role in keeping misfolding-disease-associated proteins soluble,
335 and ridding the cell of inadvertently aggregated material [84].
336 As mentioned above, many of the proteins associated with aggregation-related diseases carry
337 at least some degree of intrinsic disorder. Although intrinsically disordered protein domains
338 have less aggregation propensity overall, the energetic basins associated with their native
339 folds are relatively shallow at best [85, 86]. Lacking thermodynamic stabilization, these
340 proteins are more reliant on kinetic partitioning by external factors (i.e. chaperones and
341 proteases) for their solubility. Indeed, recent work shows how the so-called supersaturation
342 barrier needs to be broken in order to induce aggregation of folded proteins [87], and that
343 this is easier in specific protein types, particularly short peptides and intrinsically disordered
344 ones, both groups of proteins with a shallow native state energetic basin [88]. This might
345 explain why many intrinsically disordered proteins are often stabilized by clusters of (often
346 negative) non-neutralized charges [89]. Indeed, A β , α -Synuclein and Tau are all stabilized by
347 highly charged clusters, and the removal or neutralization thereof results in their aggregation
348 [90-93]. Such charge clusters likely constitute a radical form of intrinsic kinetic partitioning,
349 whereby strong charge repulsion prevents amyloid nucleation.
350 Clearly, some proteins are intrinsically at risk of forming amyloid deposits because of their
351 inherent characteristics and the specific tissues they are expressed in. This situation can be
352 exacerbated by genetic alterations both in these proteins themselves, or in the PN that
353 ensures their kinetic partitioning [94]. Some familial mutations associated with misfolding
354 disorders even cause proteins to escape recognition by the PN, effectively removing kinetic
355 partitioning and leading to aggregation, as is the case for the SOD1 A4V mutant [95].

356

357

358 **Concluding remarks**

359 The propensity to misfold and aggregate into amyloid-like assemblies is a universal property
360 of proteins in all kingdoms of life. Protein aggregation is unfavourable, resulting in protein
361 functional dysregulation and disease. Maintaining proteostasis under these conditions
362 requires an extensive protein quality control machinery representing a high metabolic cost.
363 It is therefore remarkable that the protein aggregation propensity of proteomes is maintained
364 at such high levels.

365

366 In this opinion piece we discussed how protein aggregation is under continuous selective
367 pressure yet cannot be reduced below the levels observed in proteomes. While protein
368 aggregation decreases the efficiency of protein folding it also favours protein stability. Even
369 more, we argue it is almost impossible to increase the conformational stability of a protein
370 without increasing its aggregation propensity and conversely reducing the aggregation
371 propensity of proteins generally results in protein destabilisation. Remarkably, we found that
372 the entanglement between protein stability and aggregation is further increased by the
373 universal genetic code: protein sequence segments that both strongly contribute to protein

374 stability and have a high aggregation propensity are also strongly conserved appearing as if
375 proteins are addicted to those amyloidogenic sequences.

376

377 The global result of coupling between protein stability and aggregation is that the Anfinsen
378 postulate of thermodynamic determination is only a local property of the native folding basin
379 and that globally protein folding requires mechanisms of kinetic control to ensure native
380 protein folding is favoured over aggregation. The presence of such mechanisms also explains
381 why a substantial fraction of proteins are in fact supersaturated under physiological
382 conditions.

383

384 Kinetic control of protein folding is enforced in two interdependent ways by gatekeeper
385 residues and chaperones. Hydrophobic aggregation-prone protein segments are flanked by
386 charged residues that function as aggregation gatekeepers: these residues disfavour protein
387 aggregation by electrostatic repulsion, favouring kinetic partitioning towards the native state.
388 Short, negatively charged residues such as Asp and Glu are particularly good at inhibiting
389 aggregation, allowing protein folding without the help of chaperones. Due to their short side
390 chains they are however difficult to incorporate into native protein structures. Positively
391 charged residues Arg and Lys can be used instead but they are less efficient gatekeepers and
392 are incapable of fully inhibiting aggregation. This is compensated by the fact that chaperones
393 evolved to favour binding to aggregation-prone regions that are flanked by positive residues.

394

395 The insights outlined in this Opinion of course raise additional question, which have been
396 highlighted in the Open Questions section.

397

398

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629

630 **Glossary**

- 631 • **Amyloid:** a type of cross- β protein aggregation typified by a highly structured, elongated,
632 fibrous nature.
- 633 • **Aggregation:** the coagulation of proteins into mostly dysfunctional conglomerates. This
634 process is mainly driven by Aggregation-Prone Regions that engage in intermolecular
635 interactions in a sequence-specific manner.
- 636 • **Aggregation-prone region (APR):** short (5-15 amino acids) stretches of “sticky”, usually
637 hydrophobic amino acids with a strong tendency to form homomeric intermolecular β -
638 sheets, thereby driving protein aggregation.
- 639 • **Intrinsic Aggregation Propensity:** The inherent propensity of a polypeptide to form
640 aggregates irrespective of folding or external factors (e.g. at elevated temperatures). It
641 has been shown that this is directly determined by the presence of APRs in the primary
642 sequence.
- 643 • **Aggregation gatekeeper (GK):** Aggregation-inhibiting residues that directly flank
644 aggregation-prone regions, thereby reducing aggregation tendency. The most common
645 GK types are the charged residues and Pro, and they function through charge repulsion
646 and/or an incompatibility with β -structure.
- 647 • **Chaperone:** A class of proteins dedicated to catalyzing folding, translocation and assembly
648 of their substrate proteins. Chaperones are vital parts of the proteostasis network.
- 649 • **Proteostasis:** short for protein homeostasis. This term encompasses all cellular factors
650 and processes that maintain proteins in the proper functional states necessary for
651 cellular health. The proteostasis network encompasses the translation machinery,
652 molecular chaperones and degradation pathways.
- 653 • **Aggregation Propensity:** The actual aggregation propensity of a protein is determined
654 by the balance between its intrinsic aggregation propensity, its conformational stability
655 and external factors, such as solution conditions, concentration and the state of the
656 proteostasis network.
- 657 • **Supersaturation:** Many proteins solubly accumulate at levels above their intrinsic
658 solubility, and these proteins are hence said to be supersaturated. Supersaturation is a
659 metastable state maintained through kinetic partitioning. so that in contradiction to the
660 Anfinsen postulate, the thermodynamically most stable state of these protein is not
661 their biologically active native state, but their aggregated state.
- 662 • **Proteome metastability:** Denotes the fact that many proteins in any given cell are
663 supersaturated.
- 664 • **Kinetic Partitioning:** Denotes the fact that for supersaturated proteins, for which the
665 native state is metastable, the lifetime of the native state is determined by the kinetic
666 barriers separating that state from the unfolded and aggregated states. The higher the
667 energy barrier for unfolding and aggregation, the better the kinetic entrapment of the
668 native state. Molecular chaperones are extrinsic factors acting directly on this, whereas
669 aggregation gatekeepers are a protein-intrinsic factor that shapes kinetic partitioning.
- 670 • **Entropic bristle:** Intrinsically disordered regions are enriched in charged residues and
671 the disordered chain is highly flexible, creating large excluded volume effect for
672 intermolecular interactions, as well as a high degree of solvent interactions. This has a
673 strong solubilizing effect on sequences fused to these ‘entropic bristles’ [39].

675 **Elements**

676

677 **Text Box 1: The difference between Intrinsic and Actual Aggregation Propensity**

678

679 In order to be able to form amyloid-like aggregates, proteins require short polypeptide
680 segments capable of nucleating the formation of intermolecular β -sheet structures, called
681 APRs. Despite the fact that the amyloid fibrils of full-length proteins contain much longer
682 stretches of the sequence in the amyloid conformation, the importance of APRs for the
683 formation of amyloids is beyond doubt:

- 684 - Isolated as peptides, these regions are capable of independently forming amyloid-
685 like aggregates with similar properties as those formed by the full-length proteins
686 [96].
- 687 - Mutational suppression or deletion of these regions strongly reduces the
688 aggregation propensity of a protein [97, 98].
- 689 - Grafting of an APR from one protein to another is sufficient to render the chimera
690 aggregation-prone [99, 100].
- 691 - Computational analysis of the architecture of the high resolution structures of
692 amyloid fibrils of full length proteins shows the APRs to be the most stable regions in
693 the amyloid, acting as a framework that compensates for the poor fit of the rest of
694 the sequence [17].

695 APRs can be distinguished from non-aggregation-prone sequences through the
696 physicochemical properties of their constituting residues. These properties are mainly high
697 β -sheet propensity and hydrophobicity and low net charge. As these properties are readily
698 quantifiable, it is possible to computationally identify APRs based on primary sequence
699 alone [30]. The ensemble of APRs in a polypeptide has been called its 'intrinsic aggregation
700 propensity'. The intrinsic aggregation propensity of a protein sequence can further be
701 modulated by environmental conditions, concentration and, importantly, the
702 conformational landscape of the protein, resulting in an 'actual aggregation propensity':
703 Protein conformations that bury the APRs away from the solvent (folding, binding) are
704 aggregation-resistant, whereas those that expose APRs are aggregation-prone. It is for this
705 reason that destabilisation of the native state of a protein by e.g. mutation or heat exposure
706 increases its aggregation propensity: the APRs are neatly buried inside the hydrophobic core
707 of the native state of the protein, rendering it aggregation-resistant, but in the (partially)
708 denatured state, the APRs come to the surface and start the aggregation process. The
709 equivalent for intrinsically disordered protein is the entropic bristle effect of the rest of the
710 sequence. This can potentially lead to confusion, as a protein with a high intrinsic
711 aggregation propensity that buries its APRs because of its high conformational stability or
712 tight binding to an interaction partner, may be aggregation-resistant in conditions where a
713 protein with much lower intrinsic aggregation propensity may aggregate due to the absence
714 of such protective interactions.

715

716

717

718

719 **Figure captions**

720

721 **Figure 1: Aggregation propensity is a consequence of the dependence of protein core**
722 **stability on core-spanning hydrophobic stretches. (A)** Proteins are linear concatenations of
723 amino acids that must adopt a predefined shape in order to be functional. In the aqueous
724 cellular environment, this folding process is driven by the tight packing of hydrophobic amino
725 acids into protein cores. To achieve this, proteins contain extended stretches of hydrophobic
726 amino acids capable of spanning the hydrophobic core. Some of these stretches have a
727 tendency to adopt non-native, intermolecular β -sheet conformations, causing their parent
728 proteins to aggregate. These stretches are commonly known as Aggregation-Prone Regions
729 (APRs). APRs are systematically flanked by Gatekeeper residues (GKs), charged residues and
730 β -breakers which slow down the aggregation process while leaving core-spanning
731 hydrophobic stretches intact. **(B)** Protein aggregates share a common core structure,
732 comprised of elongated intermolecular β -sheets with interdigitating sidechains that form an
733 expansive hydrophobic core known as a “dry steric zipper”. The structure is further stabilized
734 by the precise stacking of amino acids in consecutive β -strands, making this process highly
735 sequence-specific. Its repetitiveness gives this structure its typical “cross- β ” X-ray diffraction
736 pattern. Amyloid structure depicted here is based on PDB structure 2M5N [101].

737

738 **Figure 2: Kinetic partitioning by GKs and molecular chaperones allows supersaturated**
739 **proteins to fold. (A)** 2D representation of a generic folding landscape. Each point on the
740 funnel-shaped surface represents a specific conformation, the energy of which is represented
741 by the landscape depth, while the width of the funnel represents the entropy – i.e. the
742 number of possible conformations – at each energetic level. The folding landscape for
743 globular proteins is typically dominated by two separate basins: a native fold basin that can
744 be navigated down by individual molecules through intramolecular interactions (indicated by
745 the green shaded area), and an aggregation basin, in which multiple molecules engage in
746 intermolecular interactions (indicated by the red shaded area) through their Aggregation-
747 Prone regions (APRs; red stretches in both the native fold and β -aggregated state). Since their
748 association with the ribosome places nascent chains in an excluded volume with a low local
749 protein concentration, the ribosome is depicted towards the intramolecular end of the
750 landscape. This is in fact a method of temporal kinetic partitioning discussed in more detail in
751 the main text and in Figure 3. For many globular proteins at their physiological expression
752 levels, the thermodynamic stability of the aggregated state exceeds that of the native fold,
753 creating a deeper and virtually inescapable basin. Potential pathways proteins can take down
754 the folding landscape are indicated by arrows. Green arrows indicate folding reactions in
755 diluted conditions, while red arrows indicate folding in (super)saturated conditions. In the

756 latter case, proteins are more likely to engage in APR-driven intermolecular interactions,
757 causing them to descend the aggregate basin. The chain-linked weight in the folding
758 landscape indicates the link between native fold stability and aggregation propensity, both of
759 which are stabilized by APRs and therefore interdependent. **(B)** Given its stability, the
760 aggregated state is thermodynamically favoured, especially at concentrations close to or
761 exceeding the critical concentration. The only way for proteins to be stably expressed at such
762 concentrations, is therefore to kinetically separate the native and aggregation basins by way
763 of an energetic barrier. This is partially achieved through Gatekeepers (GKs; indicated in
764 green), charged residues and β -breakers that directly flank APRs. GKs decrease the APR
765 burden, thereby destabilizing the aggregated state, but also the native fold (as indicated by
766 their increased energies). However, GKs also increase the energetic barrier between folding
767 and aggregation, slowing down the latter process and favouring the native folding reaction.
768 In doing so, GKs allow for higher concentrations of proteins to be stably expressed, at least
769 temporarily. **(C)** Another powerful method of kinetic partitioning is interaction with molecular
770 chaperones. These engage APRs or even entire proteins, creating a huge energetic barrier as
771 these contacts would need to be broken for aggregation to ensue. Most chaperones consume
772 ATP and hence cellular energy for their functional cycle. For most chaperones, ATP
773 consumption results in substrate binding-release cycles, each cycle giving proteins another
774 chance at obtaining the native fold. As is the case for ribosome attachment, chaperone
775 binding and release results in an excluded volume, in which chances for a protein to descend
776 the native funnel are increased.

777

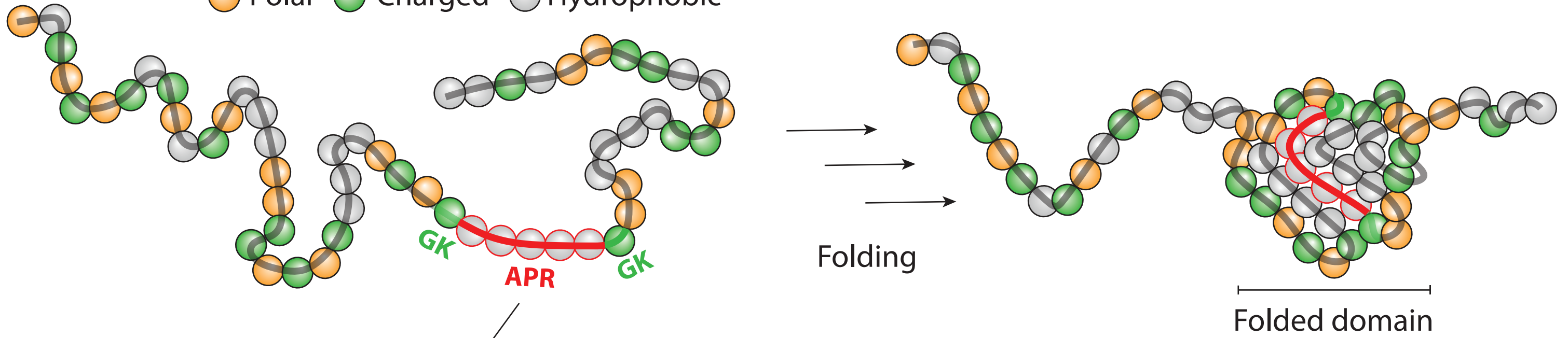
778 **Figure 3: Co-translational folding temporally partitions the native from the aggregated**
779 **state.** The rates of protein translation are slow enough to allow for co-translational folding to
780 occur. This means the folding landscape, i.e. the conformations available to a nascent protein
781 chain, expands as translation progresses, depicted here for 5 distinct timepoints i – v. In the
782 initial stages of translation, the folding landscape is rather shallow because of the limited
783 number of native stabilizing interactions available. As translation progresses, the landscape
784 deepens, and co-translational folding allows proteins to start descending the native funnel,
785 before APR-driven intermolecular interactions become available (stages i – iii). Placement of
786 an Aggregation-Prone Region (APR; indicated in red) towards the C-terminus of an emerging
787 domain means it can be instantly buried upon its emergence from the ribosome (stages iv
788 and v). In this way the kinetics of translation combined with proper placement of APRs can
789 effectively partition protein folding from aggregation and increase the probability of the
790 former, even though the latter is thermodynamically favored.

791

792

A

● Polar
 ● Charged
 ● Hydrophobic

**B**