

Mini review

Stress-induced rearrangements of cellular networks: Consequences for protection and drug design

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Abstract The complexity of the cells can be described and understood by a number of networks such as protein–protein interaction, cytoskeletal, organelle, signalling, gene transcription and metabolic networks. All these networks are highly dynamic producing continuous rearrangements in their links, hubs, network-skeleton and modules. Here we describe the adaptation of cellular networks after various forms of stress causing perturbations, congestions and network damage. Chronic stress decreases link-density, decouples or even quarantines modules, and induces an increased competition between network hubs and bridges. Extremely long or strong stress may induce a topological phase transition in the respective cellular networks, which switches the cell to a completely different mode of cellular function. We summarize our initial knowledge on network restoration after stress including the role of molecular chaperones in this process. Finally, we discuss the implications of stress-induced network rearrangements in diseases and ageing, and propose therapeutic approaches both to increase the robustness and help the repair of cellular networks.

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1. Introduction: Cellular networks, stress responses, adaptation and learning

The complexity of the cells can be described reasonably well, if we catalogue those interactions of cellular molecules only, which have a relatively high affinity, and, therefore, are unique and specific interactions of the cell. Here the interacting molecules behave as network elements, and their interactions form the weighted, but not necessarily directed links of the respec-

tive structural network. Alternatively, we may also envision directed links as representations of signalling or metabolic processes of the functional networks in the cell (Table 1, [1–3]).

Cellular networks often form small worlds, where two elements of the network are separated by only a few other elements. Networks of our cells contain hubs, i.e. elements, which have a large number of neighbours. These networks can be dissected to overlapping modules, which form hierarchical communities [4–6]. However, this summary of the major features of cellular networks is largely a generalization, and needs to be validated through critical scrutiny of the datasets, sampling procedures and methods of data analysis at each network examined [7,8].

The word, ‘stress’ has been coined by Selye [9,10], who was born a hundred years before the writing and publication of this paper. Here we use a definition of stress from the point of the cellular networks. Stress is any unexpected, large and sudden perturbation of the cellular network, to which the network (1) does not have a prepared adaptive response or (2) does not have enough time to mobilize the adaptive response. From the network point of view we talk about an adaptive response, if a massive network rearrangement occurs. Learning of networks can be differentiated from adaptation, if we restrict the learning to those network rearrangements, which are extended only to a few links and network elements.

The cellular response to stress involves a number of specific signalling events as well as the activation and extensive synthesis of molecular chaperones, many of which are also called heat shock, or stress proteins. While the signalling events mostly prepare for the specific cellular adaptation steps in the metabolism, membranes, cytoskeleton, and for those of other cellular elements and functions, chaperones provide a general response to stress by repairing damaged proteins [11–13].

2. Stress of networks

Stress can be a single network perturbation (which becomes noteworthy, if it was large enough), but it is often repeated, which may cause a congestion of the perturbations at special points of the cellular networks (Fig. 1). Congestion often affects most the communication boundaries, such as the central hubs of hierarchical networks, or the overlaps of network modules [14]. Rather paradoxically, the chances to develop congestion become higher, if the network is denser, meaning that the average number of neighbours is higher in the network [15].

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Table 1
Cellular networks

Name of cellular network	Network elements	Network links
Protein interaction network	Cellular proteins	Transient or permanent bonds
Cytoskeletal network	Cytoskeletal filaments	Transient or permanent bonds
Organelle network	Membrane segments (membrane vesicles, domains, rafts, of cellular membranes) and cellular organelles (mitochondria, lysosomes, segments of the endoplasmic reticulum, etc.)	Proteins, protein complexes and/or membrane vesicles, channels
Signalling network	Proteins, protein complexes, RNA (such as micro-RNA)	Highly specific interactions undergoing a profound change (either activation or inhibition), when a specific signal reaches the cell
Metabolic network	Metabolites, small molecules, such as glucose or adenine	Enzyme reactions transforming one metabolite to the other
Gene transcription network	Transcriptional factors or their complexes and DNA gene sequences	Functional (and physical) interactions between transcription factor proteins (sometimes RNA-s) and various parts of the gene sequences in the cellular DNA

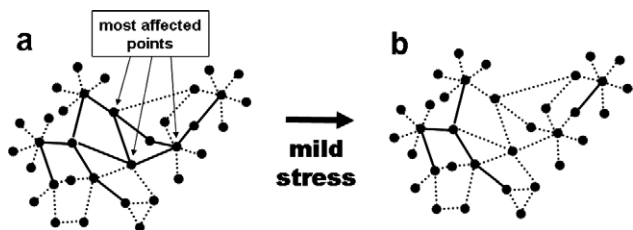


Fig. 1. Network perturbations, congestions and damage: a ‘Le-Chatelier type principle’ of network stabilization after stress. (a) The congestion of network perturbations is preferentially observed at communication boundaries, such as central hubs of hierarchical networks or overlaps of network modules. (b) Extensively repeated or large perturbations may lead to the damage of most affected network elements, which makes the links of the given element weaker to its neighbours as before. Damage-induced link-weakening may act as a fuse and by re-channelling the perturbation to alternative routes of weak links may counteract stress-induced network destabilization. Solid and dotted lines represent strong and weak (high and low affinity) links, respectively.

86 If perturbations repeatedly arrive within the relaxation time
87 of the element or group of elements, network damage may oc-
88 cur. Network may also be damaged, if the propagation of such
89 a single but large perturbation becomes prevented. As a very
90 simple scenario, extensively repeated smaller conformational
91 changes of proteins (or an extremely large change in the shape
92 of a protein) may induce a partial unfolding, which is large en-
93 ough to misfold, and denature the protein in question [16]. The
94 propagation of network perturbations exemplified as confor-
95 mational changes of protein structural networks and their conse-
96 quence as partial unfolding (damage) of protein segments
97 can be nicely followed by the differential unfolding of active
98 centres of enzymes [17] and antibodies [18] as well as the
99 growth of initial perturbations to local and global unfolding
100 events in the course of protein extension by optical tweezers
101 [19].

102 Continuing the description of the above scenario, altered
103 shapes of proteins will not properly serve the very same con-

tacts the respective protein had before. In other words, links 104
105 to the former neighbours in the protein–protein interaction
106 network will be more transient, weaker. Consequently, stress
107 induces a decrease in the average link-strength and link-den-
108 sity. Deleting links may be actually beneficial, and may help
109 to prevent the propagation of damage [20]. Stress-induced shift
110 from strong links to weaker ones may actually form a part of a
111 ‘Le-Chatelier type network principle’ meaning that upon dis-
112 turbing the former network equilibrium, the network starts
113 to have an automatic attenuation of link-strength, which acts
114 as a fuse, re-channels the perturbations to alternative routes,
115 and induces an extra stabilization counteracting the original
116 damage (Fig. 1, [3,21]).

3. Network rearrangements in stress 117

118 Stress-induced decrease in the strength and number of links
119 leads to a gradual detachment of network elements from each
120 other. This results in a larger number of ‘lonely’ elements, but
121 – more importantly – induces an increased competition be-
122 tween the hubs of the network for the remaining links. During
123 a prolonged stress the segregation of ‘looser hubs’ and ‘winner
124 hubs’ will occur, where winner hubs will be preferentially
125 those, which are more flexible, can endure the transmission
126 of perturbations better, had more links to their neighbours be-
127 fore, and the average strength of these links was stronger. Sim-
128 ilarly, stress-induced scarcity of stronger links also leads to an
129 increased competition of bridges, resulting in weaker, more rig-
130 id ‘looser bridges’ and ‘winner bridges’ (Fig. 2a). Extending
131 this description winner hubs and bridges may have a larger
132 repertoire of game strategies in the iterative scenarios of mak-
133 ing and maintaining protein–protein interactions, which might
134 also be called protein games [22].

135 Parallel with the stress-induced segregation of looser and
136 winner hubs and bridges, stress also provokes an increased
137 de-coupling of network modules. The overlap decreases be-
138 tween modules (Fig. 2a). This leads to simpler, less regulated,
139 more specialized cellular functions. This fits well to the require-

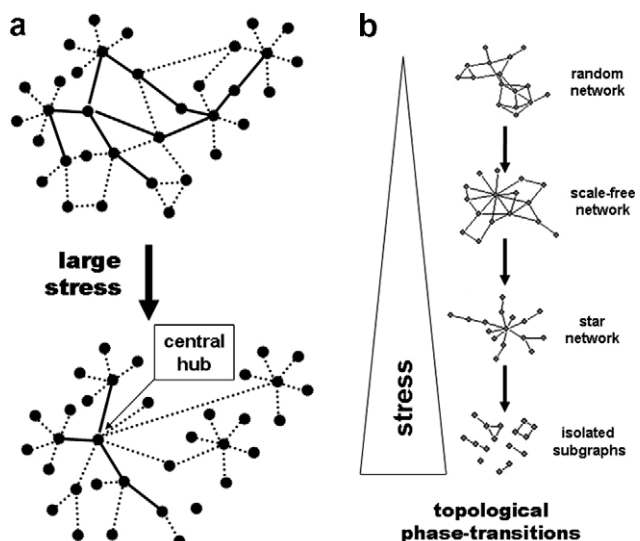


Fig. 2. Network rearrangements in stress. (a) Stress-induced decrease in the strength and number of links leads to detached elements, and results in an increased competition between the strongest hubs and bridges for remaining links. Parallel with this, an increased de-coupling (in extreme case: quarantining) of network modules is observed, which leads to simpler, less regulated, more specialized cellular functions. Solid and dotted lines represent strong and weak (high and low affinity) links, respectively. (b) In chronic stress or extreme changes in the environment parts of cellular network may undergo a topological phase transition, where the distribution of the number of neighbours becomes more and more uneven. Here the topology changes from a random network to a hub-containing network, where the number of neighbours has a scale-free distribution, then a star-network develops, where a ‘dictator-hub’ attains most connections, and finally the network falls apart to densely-connected small groups – called isolated subgraphs.

140 ment for more efficient energy utilization and preparation for
141 larger autonomy of various cellular modules during stress.
142 (A larger autonomy is expected to occur, if there is an in-
143 creased chance for a damage of various parts of the network
144 – which is exactly the scenario during stress, where random-
145 type damages may hit one or another module.)

146 The larger autonomy may be increased to such an extent
147 that certain modules become completely de-coupled from the
148 rest of the network. This quarantining may affect those mod-
149 ules which suffered the largest damage or may isolate those
150 segments, which would utilize the most resources from the
151 diminished reserves.

152 Modular rearrangements certainly affect the hierarchical
153 structure of cellular modules [23]. Elementary modules of some
154 super-modules may coalesce into a single grand-module and
155 suffer a significant reduction, while other super-modules may
156 fall apart to a loose or even isolated assembly of single mod-
157 ules.

158 All these ‘simplifications’ of cellular networks during stress
159 resemble to an accelerated and reversible version of the reduc-
160 tive evolution of symbiotic organisms, especially, where the
161 engulfment by the host provides a safe and stable environment
162 for the ‘guest’, e.g. a parasite [24,25]. In both processes major
163 segments of the original networks become attenuated parallel
164 with a specialization of the network structure for a specific
165 set of environmental conditions provided by either the stress
166 or the host. This network simplification gives a more rigid

167 structure, where most of the original universal and flexible
168 adaptation strategies were temporarily or irreversibly lost.

169 During stress, chaperones become increasingly occupied by
170 damaged proteins and a so-called ‘chaperone overload’ occurs
171 [26]. Since chaperones often couple various cellular modules of
172 protein–protein interaction [27] and cellular organelle net-
173 works [28], their inhibition might lead to a de-coupling of all
174 these chaperone-mediated contacts between network modules.
175 Since de-coupling of modules stops the propagation of
176 network damage at the modular boundaries, the above
177 mechanism provides an additional safety measure for the cell
178 [13].

179 In chronic stress or extreme changes in the environment,
180 smaller or larger parts of cellular network may undergo a
181 topological phase transition [29]. When the cell has plenty of
182 resources, there is ample energy to build a large amount of
183 links between network elements, which means that the result-
184 ing topology will be very close to that of a random network.
185 If the network experiences stress, and if its resources become
186 more and more depleted, in agreement with the above notions,
187 a larger and larger number of links will cease to operate. This
188 leads to a discrimination of network elements. A few of them
189 will retain and even gain links, while most of them will be pau-
190 perized. The ‘link-winners’ will become the hubs of the novel
191 network structure. If the stress is stronger or it lasts longer,
192 an increased competition of hubs will occur, and in an extreme
193 case, the network may be switched to a star-network, where
194 the ‘winner hub takes all’ and an extremely centralized, highly
195 hierarchical structure develops. If the resources will become
196 even smaller, the star-network collapses and a number of iso-
197 lated, small groups will be formed. This corresponds to the
198 death of the former gross structure, which we called cell or
199 organism (Fig. 2b). The latter, disintegration-type topological
200 phase transition may be preceded by quarantining the most
201 damaged parts of the network, and might accompany various
202 forms of programmed cell death [30].

4. Network re-establishment after stress

203

204 When the stress is over, and cellular resources slowly start to
205 get back to normal again, cellular networks start to re-estab-
206 lish those links, which were ceased to operate during stress.
207 Bridges, local hubs are re-built, modules are re-coupled. As a
208 gross summary of these processes, the cell re-establishes its lost
209 repertoire of weak links, which enable its networks to a large
210 number of flexible changes. In this way the re-gaining of the
211 links shed during stress can be envisioned as a purchase of a
212 general ‘insurance’, which enables the stressed cell to recover
213 from its former, rigid state highly specialized to the given form
214 of stress, and to attain a more flexible structure, which will be
215 able cope with a large number of unexpected changes in the fu-
216 ture.

217 These processes are helped by the newly synthesized molec-
218 ular chaperones, since their low affinity interactions effectively
219 sample a large number of proteins, and allow the rearrange-
220 ment of hubs, re-formation of bridges and binding of de-cou-
221 pled modules each other in a very flexible, partially stochastic
222 manner. Thus, chaperones give the cell a refined and flexible
223 way for the gradual build-up of the complex modular structure
224 and function, when the stress is already over [27,31].

225 **5. Examples for stressed-induced network rearrangements**

226 The above descriptions of stress-induced rearrangements of
227 cellular networks (which may also be called as network re-
228 modelling or re-configuration) were mostly based on our gen-
229 eral knowledge on network behaviour during and after stress.
230 In this section we list a few initial examples, where we already
231 have evidence for a similar behaviour in cellular systems. How-
232 ever, we have to note that this field has not become yet a main-
233 stream approach, and, therefore, the examples below are
234 rather sporadic and prompt further research efforts in the field.

235 A molecular complex, where stress-induced rearrangements
236 were extensively studied is the cytoskeleton, where stress is
237 exemplified by the mechanical stress of stretching. Networks
238 of actin filaments show an exceptional elastic behaviour, where
239 stretch-induced stiffening is followed by reversible softening at
240 higher loads. Stiffening (which is also called as strain-hardening)
241 is induced by cross-linking and may span changes of several
242 magnitudes in elasticity. Cross-linking of actin filaments is
243 helped by a whole family of proteins including alpha-actinin
244 and filamin. At higher loads softening becomes the major form
245 of further rearrangements instead of stiffening to avoid a cata-
246 strophic fracture of the network [32–35]. This complex behav-
247 iour of the cytoskeletal network resembles to the stress-
248 induced rearrangement of networks described in Section 3,
249 which is also followed by the appearance of a more rigid struc-
250 ture. The consecutive softening is similar to the de-coupling of
251 network modules after extensive stress [13,29]. De-coupling of
252 individual mitochondria from each other also saves non-dam-
253 aged parts of the mitochondrial network during oxidative [36]
254 and osmotic damage [37] by stopping the propagation of the
255 damage from mitochondrion to mitochondrion. The rear-
256 rangement of the cytoskeletal network after stress [38] also
257 resembles to general features of network-evolution [2,3], when
258 first minor sub-networks are formed, which become cross-
259 linked later, and coalesce to larger networks.

260 As an excellent example for complex networks helping an
261 efficient stress response, the modularity and robustness of the
262 heat shock response system have been studied in the *Esche-*
263 *richia coli* in detail. The extensive analysis revealed that the
264 module around the sigma-32 transcription factor acts as a cen-
265 tral module-hub, and orchestrates the regulation of a number
266 of other cellular modules. A balance of feed-forward mecha-
267 nisms and the sequestration/degradation of sigma-32 induces
268 a fast and efficient response preventing gross protein unfold-
269 ing. Noise reduction during *E. coli* stress is helped by protein
270 degradation (such as the degradation of sigma-32), which
271 may be a stress-induced stabilization mechanism in eukary-
272 otes, too [39–41]. A modular structure of the chaperone net-
273 works in the eukaryotic cytosol has been also uncovered,
274 where a distinction between stress-induced chaperones partici-
275 pating in the re-folding of damaged proteins and stress-re-
276 pressed chaperones helping the folding of de novo
277 synthesized proteins was found [42]. The above, relatively min-
278 or, local re-adjustments of protein levels and activities of chap-
279 erone-networks may trigger a large network re-shuffling at
280 the level of the whole cell, which is due to the central position of
281 chaperones and their network-modules in the complete cellular
282 network system [13,27]. Such behaviour is suggested by the ac-
283 tive centre-induced gross conformational rearrangements of
284 proteins, which is a result of the central position of triggering
285 amino acid residues in the protein structural networks [16].

6. Stressed cellular networks in disease and ageing

286

287 The increased vulnerability of stressed cellular networks, to-
288 gether with the significantly reduced range of adaptive re-
289 sponses of stressed networks become especially critical, if the
290 cellular network already experienced a previous damage. This
291 happens under the repeated waves of chronic stress, but also
292 prevalent in disease and in aged cells. In these scenarios
293 stress-induced severing of various links in cellular networks af-
294 fects a network structure, which has been already weakened by
295 the preceding permanent damage. An additional type of dan-
296 ger is raised by the fact that in disease and ageing the noise le-
297 vel is already much higher than usual [43]. If disease and age-
298 induced noise is accompanied by the extra, stress-generated
299 noise, it may well go beyond the tolerable threshold, and in-
300 duces an ‘error-catastrophe’.

7. Robustness and repair of stressed networks: consequences to pharmacology and drug design

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302

303 Networks have a number of efficient measures to protect
304 themselves from stress-induced damage. If the traffic of the
305 most central network elements is redistributed to other, non-
306 central nodes, the network capacity can be increased by 10
307 times [44,45]. If a network element is destroyed, an isoform
308 may be synthesized as a back-up, or an emergency rewiring
309 of its neighbors can also save the network [46]. Additionally,
310 the selective removal of network elements and links with either
311 a small load, or a large excess of overload also diminishes the
312 size of the cascading damage [20].

313 Efficient repair of the multiple rearrangements and defects of
314 disease-, ageing- and stress-affected cellular networks is rather
315 seldom reached by a single-target drug having a well-designed,
316 high affinity interaction with one of the cellular proteins [47].
317 In agreement with this general assumption, several examples
318 show that multi-target therapy may be superior to the usual
319 single-target approach. The best known examples of multi-tar-
320 get drugs include Aspirin, Metformin or Gleevec as well as
321 combinatorial therapy and natural remedies, such as herbal
322 teas [48]. Due to the multiple regulatory roles of chaperones,
323 chaperone-modulators provide additional examples for multi-
324 target drugs. Indeed, chaperone substitution (in the form of
325 chemical chaperones), the help of chaperone induction
326 and chaperone inhibition are all promising therapeutic strate-
327 gies [49–52].

8. Summary and perspectives

328

329 Recent progress in network science and, especially, our
330 emerging knowledge of network dynamics provides a unique
331 chance to understand and modulate stress-induced changes
332 in cellular networks. We have an initial idea on stress-induced
333 network rearrangements as well as on a few mechanisms help-
334 ing the cell to preserve robustness under these conditions.
335 However, a number of key issues have not been tackled yet
336 both from the theoretical and the experimental points of view.

- We do not have a detailed view on the vulnerable points of
real, cellular networks suffering from congestions or being
exposed to damage during stress.

337
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339

- 340 • We are at the very beginning to understand stress-induced
341 network rearrangements: the exploration of the rules of
342 hub- and bridge-competition as well as changes in the hier-
343 archical modular structure is largely missing.
- 344 • Parallel data-sets showing the differences between protein–
345 protein interaction, organelle and functional cellular net-
346 works under normal and stressful conditions are missing.
- 347 • The exploration of topological phase transitions of cellular
348 networks by comparing their topology in extremely re-
349 source-rich and resource-poor environments awaits experi-
350 mentation.
- 351 • Our knowledge on the re-establishment, re-building of cel-
352 lular networks after stress is practically zero.
- 353 • We need a much better understanding of cellular network
354 changes in disease and ageing.
- 355 • Lastly, but perhaps most importantly, besides chaperones,
356 and chaperone-related therapies we do not have a detailed
357 knowledge on the mechanisms helping cellular networks
358 to cope with their stress and on the possibilities for efficient
359 therapeutic interventions.
- 360 We are quite certain that stressed networks will give a lot of
361 excitement and pleasure for systems biologists, who would like
362 to understand the dynamics of cellular networks. As a result of
363 these studies the emergence of network-based therapies is ex-
364 pected, where the target-sets of multi-target drugs will be iden-
365 tified using our knowledge on the vulnerable points (hot-spots)
366 of cellular networks in stress, disease and ageing.

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374 References

- 375 [1] Barabasi, A.L. and Oltvai, Z.N. (2004) Network biology: under-
376 standing the cell's functional organization. *Nat. Rev. Genet.* 5,
377 101–113.
- 378 [2] Boccaletti, S., Latora, V., Moreno, Y., Chavez, M. and Hwang,
379 D.-U. (2006) Complex networks: structure and dynamics. *Phys.*
380 *Rep.* 424, 175–308.
- 381 [3] Csermely, P. (2006) *Weak Links: A Universal Key for Network*
382 *Diversity and Stability*, Springer Verlag, Heidelberg.
- 383 [4] Watts, D.J. and Strogatz, S.H. (1998) Collective dynamics of
384 'small-world' networks. *Nature* 393, 440–442.
- 385 [5] Barabasi, A.L. and Albert, R. (1999) Emergence of scaling in
386 random networks. *Science* 286, 509–512.
- 387 [6] Palla, G., Derenyi, I., Farkas, T. and Vicsek, T. (2005) Uncover-
388 ing the overlapping community structure of complex networks
389 in nature and society. *Nature* 435, 814–818.
- 390 [7] Arita, M. (2004) The metabolic world of *Escherichia coli* is not
391 small. *Proc. Natl. Acad. Sci. USA* 101, 1543–1547.
- 392 [8] Tanaka, R., Yi, T.M. and Doyle, J. (2005) Some protein
393 interaction data do not exhibit power law statistics. *FEBS Lett.*
394 579, 5140–5144.
- 395 [9] Selye, H. (1955) Stress and disease. *Science* 122, 625–631.
- 396 [10] Selye, H. (1956) *The Stress of Life*, McGraw-Hill, New York, NY,
397 USA.
- 398 [11] Hartl, F.-U. (1996) Molecular chaperones in cellular protein
399 folding. *Nature* 381, 571–580.
- 400 [12] Bukau, B. and Horwich, A.L. (1998) The Hsp70 and Hsp60
401 chaperone machines. *Cell* 92, 351–366.
- 402 [13] Soti, C., Pal, C., Papp, B. and Csermely, P. (2005) Chaperones as
403 regulatory elements of cellular networks. *Curr. Opin. Cell Biol.*
404 17, 210–215.
- [14] Gfeller, D., Chappelier, J.-C. and De Los Rios, P. (2005) Finding
instabilities in the community structure of complex networks.
Phys. Rev. E 72, 056135.
- [15] Park, K., Lai, Y.-C., Zhao, L. and Ye, N. (2005) Jamming in
complex gradient networks. *Phys. Rev. E* 71, 065105.
- [16] Böde, C., Kovács, I.A., Szalay, M., Palotai, R., Korcsmáros, T.
and Csermely, P. (2007) Network analysis of protein dynamics.
arxiv.org/q-bio.BM/0703025.
- [17] Horowitz, P. and Criscimagna, N.L. (1986) Low concentrations
of guanidinium chloride expose apolar surfaces and cause
differential perturbation in catalytic intermediates of rhodanese.
J. Biol. Chem. 261, 15652–15658.
- [18] Wang, X.D., Luo, J., Guo, Z.Q., Zhou, J.M. and Tsou, C.L.
(1997) Perturbation of the antigen-binding site and staphylococcal
protein A-binding site of IgG before significant changes in global
conformation during denaturation: an equilibrium study. *Biochem.*
J. 325, 707–710.
- [19] Kellermayer, M.S., Smith, S.B., Granzier, H.L. and Bustamante,
C. (1997) Folding–unfolding transitions in single titin molecules
characterized with laser tweezers. *Science* 276, 1112–1116.
- [20] Motter, A.E. (2004) Cascade control and defense in complex
networks. *Phys. Rev. Lett.* 93, 098701.
- [21] Csermely, P. (2004) Strong links are important, but weak links
stabilize them. *Trends Biochem. Sci.* 29, 331–334.
- [22] Kovacs, I.A., Szalay, M.S. and Csermely, P. (2005) Water and
molecular chaperones act as weak links of protein folding
networks: energy landscape and punctuated equilibrium changes
point towards a game theory of proteins. *FEBS Lett.* 579, 2254–
2260.
- [23] Ravasz, R., Somera, A.L., Mongru, D.A., Oltvai, Z.N. and
Barabasi, A.L. (2002) Hierarchical organization of modularity in
metabolic networks. *Science* 297, 1551–1555.
- [24] Papp, B., Pal, C. and Hurst, L.D. (2004) Metabolic network
analysis of the causes and evolution of enzyme dispensability in
yeast. *Nature* 429, 661–664.
- [25] Pál, C., Papp, B., Lercher, M.J., Csermely, P., Oliver, S.G. and
Hurst, L.D. (2006) Chance and necessity in the evolution of
minimal metabolic networks. *Nature* 440, 667–670.
- [26] Csermely, P. (2001) Chaperone-overload as a possible contributor
to "civilization diseases": atherosclerosis, cancer, diabetes. *Trends*
Genet. 17, 701–704.
- [27] Korcsmáros, T., Kovacs, I.A., Szalay, M.S. and Csermely, P. (in
press). Molecular chaperones: the modular evolution of cellular
networks. *J. Biosci.* (www.arxiv.org/q-bio.MN/0701030).
- [28] Szabadkai, G., Bianchi, K., Varnai, P., De Stefani, D., Wic-
kowski, M.R., Cavagna, D., Nagy, A.I., Balla, T. and Rizzuto, R.
(2006) Chaperone-mediated coupling of endoplasmic reticulum
and mitochondrial Ca²⁺ channels. *J. Cell Biol.* 175, 901–911.
- [29] Derenyi, I., Farkas, I., Palla, G. and Vicsek, T. (2004) Topolog-
ical phase transitions of random networks. *Physica A* 334, 583–
590.
- [30] Soti, C., Sreedhar, A.S. and Csermely, P. (2003) Apoptosis,
necrosis and cellular senescence: chaperone occupancy as a
potential switch. *Ageing Cell* 2, 39–45.
- [31] Lewandowska, A., Gierszewska, M., Marszalek, J. and Liberek,
K. (2006) Hsp78 chaperone functions in restoration of mitochon-
drial network following heat stress. *Biochim. Biophys. Acta* 1763,
141–151.
- [32] Xu, J., Tseng, Y. and Wirtz, D. (2000) Strain hardening of actin
filament networks. Regulation by the dynamic cross-linking
protein alpha-actinin. *J. Biol. Chem.* 275, 35886–35892.
- [33] Gardel, M.L., Shin, J.H., MacKintosh, F.C., Mahadevan, L.,
Matsudaira, P. and Weitz, D.A. (2004) Elastic behavior of cross-
linked and bundled actin networks. *Science* 304, 1301–1305.
- [34] Gardel, M.L., Nakamura, F., Hartwig, J., Crocker, J.C., Stossel,
T.P. and Weitz, D.A. (2006) Stress-dependent elasticity of
composite actin networks as a model for cell behavior. *Phys.*
Rev. Lett. 96, 088102.
- [35] Chaudhuri, O., Parekh, S.H. and Fletcher, D.A. (2007) Reversible
stress softening of actin networks. *Nature* 445, 295–298.
- [36] Aon, M.A., Cortassa, S. and O'Rourke, B. (2004) Percolation and
criticality in a mitochondrial network. *Proc. Natl. Acad. Sci. USA*
101, 4447–4452.
- [37] Copp, J., Wiley, S., Ward, M.W. and van der Geer, P. (2005)
Hypertonic shock inhibits growth factor receptor signaling.

- 480 induces caspase-3 activation, and causes reversible fragmentation
481 of the mitochondrial network. *Am. J. Physiol.* 288, C403–C415.
- 482 [38] Glascott, P.A. Jr., McSorley, K.M., Mittal, B., Sanger, J.M. and
483 Sanger, J.W. (1987) Stress fiber reformation after ATP depletion.
484 *Cell Motil. Cytoskel.* 8, 118–129.
- 485 [39] Kurata, H., El-Samad, H., Iwasaki, R., Ohtake, H., Doyle, J.C.,
486 Grigorova, I., Gross, C.A. and Khammash, M. (2006) Module-
487 based analysis of robustness tradeoffs in the heat shock response
488 system. *PLoS Comput. Biol.* 2, e59.
- 489 [40] El-Samad, H., Kurata, H., Doyle, J.C., Gross, C.A. and Kham-
490 mash, M. (2005) Surviving heat shock: control strategies for
491 robustness and performance. *Proc. Natl. Acad. Sci. USA* 102,
492 2736–2741.
- 493 [41] El-Samad, H. and Khammash, M. (2006) Regulated degradation
494 is a mechanism for suppressing stochastic fluctuations in gene
495 regulatory networks. *Biophys. J.* 90, 3749–3761.
- 496 [42] Albanese, V., Yam, A.Y., Baughman, J., Parnot, C. and Frydman,
497 J. (2006) Systems analyses reveal two chaperone networks with
498 distinct functions in eukaryotic cells. *Cell* 124, 75–88.
- 499 [43] Goldberger, A.L., Amaral, L.A.N., Hausdorf, J.M., Ivanov, P.C.,
500 Peng, C.-K. and Stanley, H.E. (2002) Fractal dynamics in
501 physiology: alterations with disease and ageing. *Proc. Natl. Acad.*
502 *Sci. USA* 99, 2466–2472.
- 503 [44] Ghim, C.-M., Oh, E., Goh, K.-I., Khang, B. and Kim, D. (2004)
504 Packet transport along the shortest pathways in scale-free
505 networks. *Eur. Phys. J. B* 38, 193–199.
- [45] Yan, G., Zhou, T., Hu, B., Fu, Z.-Q. and Wang, B.-H. (2006) 506
Efficient routing on complex networks. *Phys. Rev. E* 73, 046108. 507
- [46] Hayashi, Y. and Miyazaki, T. (2005) Emergent rewirings for 508
cascades on correlated networks. [www.arxiv.org/cond-mat/](http://www.arxiv.org/cond-mat/0503615) 509
[0503615](http://www.arxiv.org/cond-mat/0503615). 510
- [47] Kitano, H. (2004) Biological robustness. *Nat. Rev. Genet.* 5, 826– 511
837. 512
- [48] Csermely, P., Agoston, V. and Pongor, S. (2005) The efficiency of 513
multi-target drugs: the network approach might help drug design. 514
Trends Pharmacol. Sci. 26, 178–182. 515
- [49] Bernier, V., Lagace, M., Bichet, D.G. and Bouvier, M. (2004) 516
Pharmacological chaperones: potential treatment for conforma- 517
tional diseases. *Trends Endocrinol. Metab.* 15, 222–228. 518
- [50] Neckers, L. and Neckers, K. (2005) Heat-shock protein 90 519
inhibitors as novel cancer chemotherapeutics – an update. *Expert* 520
Opin. Emerg. Drugs 10, 137–149. 521
- [51] Vigh, L., Literati, P.N., Horvath, I., Torok, Z., Balogh, G., Glatz, 522
A., Kovacs, E., Boros, I., Ferdinandy, P., Farkas, B., Jaszlits, L., 523
Jednakovits, A., Koranyi, L. and Maresca, B. (1997) Bimocinolol: 524
a non-toxic, hydroxylamine derivative with stress protein- 525
inducing activity and cytoprotective effects. *Nat. Med.* 3, 1150– 526
1154. 527
- [52] Soti, C., Nagy, E., Giricz, Z., Vigh, L., Csermely, P. and 528
Ferdinandy, P. (2005) Heat shock proteins as emerging thera- 529
peutic targets. *Br. J. Pharmacol.* 146, 769–780. 530
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