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# Tryptophan scanning mutagenesis as a way to mimic the compound-bound state and probe the selectivity of allosteric inhibitors in cells†

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Understanding the selectivity of a small molecule for its target(s) in cells is an important goal in chemical biology and drug discovery. One powerful way to address this question is with dominant negative (DN) mutants, in which an active site residue in the putative target is mutated. While powerful, this approach is less straightforward for allosteric sites. Here, we introduce tryptophan scanning mutagenesis as an expansion of this idea. As a test case, we focused on the challenging drug target, heat shock cognate protein 70 (Hsc70), and its allosteric inhibitor JG-98. Structure-based modelling predicted that mutating Y149W in human Hsc70 or Y145W in the bacterial ortholog DnaK would place an indole side chain into the allosteric pocket normally occupied by the compound. Indeed, we found that the tryptophan mutants acted as if they were engaged with JG-98. We then used DnaK Y145W to suggest that this protein may be an anti-bacterial target. Indeed, we found that DnaK inhibitors have minimum inhibitory concentration (MIC) values  $<0.125 \mu\text{g mL}^{-1}$  against several pathogens, including multidrug-resistant *Staphylococcus aureus* (MRSA) strains. We propose that tryptophan scanning mutagenesis may provide a distinct way to address the important problem of target engagement.

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## Introduction

It is often challenging to discern whether a small molecule exerts its biological response through the intended target protein(s) or whether it is acting through polypharmacology.<sup>1–7</sup> Accordingly, multiple methods to address this question have emerged,<sup>8,9</sup> including pull-downs,<sup>10,11</sup> partial proteolysis,<sup>12,13</sup> genetic screens for resistance,<sup>14,15</sup> techniques such as shRNA<sup>16</sup> or CRISPRi,<sup>17,18</sup> sequencing-based correlations with transcriptomics,<sup>19–22</sup> and variations of cellular thermal shift assays (CETSA).<sup>10,23,24</sup> Another common approach is to show that treatment of cells with an inhibitor produces a phenotype that is similar to expression of a dominant negative (DN), a variant of the target enzyme in which a key, catalytic residue is removed.<sup>25</sup>

Because each of these methods has its own strengths, it often takes more than one experiment (*e.g.* pulldowns combined with a DN) to ultimately conclude that a compound is sufficiently selective to be used as a chemical probe.<sup>3,4</sup> However, achieving this preponderance of evidence can be challenging, especially when the inhibitor acts through a cryptic, allosteric binding site.

In an effort to expand the scope of target exploration methods, we envisioned that tryptophan scanning mutagenesis might be a complementary approach. This proposed use of scanning mutagenesis has clear origins in alanine scanning<sup>26</sup> and other types of tryptophan scanning,<sup>27–29</sup> which, to date, have been primarily used for exploring questions in the fields of protein folding, protein–protein interactions and studying the structure of membrane proteins. Put simply, we thought that another way to use tryptophan mutants would be to strategically place bulky, indole rings into a region that might, in some cases, partially mimic the compound-bound state. This approach would be expected to create a version of the target protein that is allosterically inhibited.

To test this idea, we turned to the molecular chaperone: heat shock protein 70 (Hsp70). Members of the Hsp70 family of chaperones, including the constitutively expressed, human Hsc70 and the prokaryotic DnaK ortholog, are emerging as drug target for a number of diseases.<sup>30,31</sup> However, this protein class is a particularly challenging system for probing target selectivity

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using DNAs because of its complex allosteric motions and numerous compound-binding sites.<sup>32</sup> In both prokaryotes and eukaryotes, members of the Hsp70 family are composed of two domains: a ~50 kDa nucleotide binding domain (NBD) and a ~25 kDa substrate binding domain (SBD).<sup>33</sup> The NBD has ATPase activity and, during nucleotide cycling, it switches between a “closed”, ATP-bound state and an “open”, ADP-bound state.<sup>34–36</sup> More specifically, the identity of the bound nucleotide controls a scissoring motion between the two lobes (I and II) of the NBD, resulting in a relatively acute angle (~40°) in the ATP-bound state and a more open angle (~50°) in the ADP-bound state.<sup>37,38</sup> In turn, these lobe motions in the NBD regulate the strength of inter-domain interactions with the SBD and overall quaternary structure of Hsp70s.<sup>39</sup> Many inhibitors of Hsp70s have been developed and these molecules bind to different locations within the NBD and SBD.<sup>40,41</sup> For example, JG-98 binds to a cryptic, allosteric site between the two lobes of the NBD, stabilizing the ADP-like state by acting as a “door jamb” to scissoring motions.<sup>37,42</sup> Despite progress in characterizing their molecular MoAs, it is often difficult to ascribe the cellular activity of Hsp70 inhibitors, such as JG-98, to a specific structural state of the protein in cells, owing to the Hsp70's complex series of nucleotide-driven motions. Moreover, there are thirteen *hsp70* genes in humans and it can be challenging to ascribe an inhibitor's activity to a specific one of these isoforms because of the potential for feedback mechanisms and compensation.<sup>43</sup> These issues, and others, often contribute to a disconnect between the detailed knowledge of an inhibitor's MoA from *in vitro* experiments and the results of compound treatment in cells or animals.

Herein, we leverage knowledge of the JG-98 binding site, combined with molecular dynamic simulations and tryptophan scanning mutagenesis, to create a genetic tool for exploring these questions. Simulations predicted that installing a tryptophan at residue 149 in human Hsc70 (Y149W Hsc70) or 145 in DnaK (Y145W DnaK) would place steric bulk into the same allosteric site that is normally occupied by JG-98, at the hinge between lobes I and II. Indeed, we found that the tryptophan mutant acted as if it was bound to the inhibitor in a series of biochemical and structural assays. We also used this approach to show that DnaK is a potential new drug target in important human pathogens. Thus, we envision that tryptophan scanning mutagenesis might supplement existing methodologies. This method might be particularly useful for studying allosteric inhibitors, where traditional, enzyme-dead DN mutants fail to fully replicate the compound's MoA.

## Results

### *In silico* tryptophan scanning mutagenesis

JG-98 is predicted to bind an allosteric site between lobes I and II in the NBD of human Hsc70 (Fig. 1A).<sup>42,44</sup> This site is highly conserved in prokaryotic isoforms of the Hsp70 family, including *E. coli* DnaK (ESI Fig. 1†). Moreover, this binding site is adjacent to, but not overlapping with, the nucleotide-binding cleft in the NBD (Fig. 1A), suggesting an allosteric mechanism. Indeed, recent studies have shown that JG-98 restricts the

nucleotide-driven, “scissoring” motions of lobes I and II.<sup>37</sup> In this way, JG-98 partially interrupts nucleotide cycling by stabilizing a conformation of the NBD that resembles the ADP-bound state, even if ATP is present.

Guided by this MoA, we focused on mutating residues at the interface between lobes I and II, such as Y149, A223 and D225 (Fig. 1A). The hypothesis was that bulky tryptophan residues at this key, crux point might, like JG-98, partially restrict scissoring of lobes I and II. To test this idea, we performed Molecular Dynamics (MD) simulations on the NBD of wild-type (WT) Hsc70 (PDB 3C7N)<sup>45</sup> and compared the nucleotide-dependent motions of its lobes to those of the *in silico* point mutants: A223W, D225W, and Y149W. In the MD trajectories, we monitored the relative frequency at which the NBD occupied either the ATP-like, closed conformation or the ADP-like, open conformation. First, we confirmed that, for WT Hsc70, the angle between lobes I and II was primarily predicted to be in the closed state (~38°) in the presence of ATP, while it became relatively open (~53°) in the presence of bound ADP (Fig. 1B). Moreover, we confirmed that JG-98 favored the open angle between the lobes (~54 to 55°), regardless of whether ATP or ADP was present. Then, we screened the candidate tryptophan mutants for those that might mimic JG-98. We reasoned that, if the tryptophan mutants mirrored the MoA of JG-98, they might be expected to also favor the ADP-like state. Two of the tryptophan scanning mutants, A223W and D225W Hsc70 NBD, failed to show stabilization of the open state; rather, they showed a broad distribution of predicted angles (Fig. 1B). However, the third mutant, Y149W Hsc70 NBD, was predicted to stabilize the ADP-like lobe angle (~55°), at the expense of the ATP-like, closed state (Fig. 1B). Thus, these results suggested that mutation of Y149W might partially recapitulate the effects of JG-98, presumably by structural mimicry of the compound's MoA.

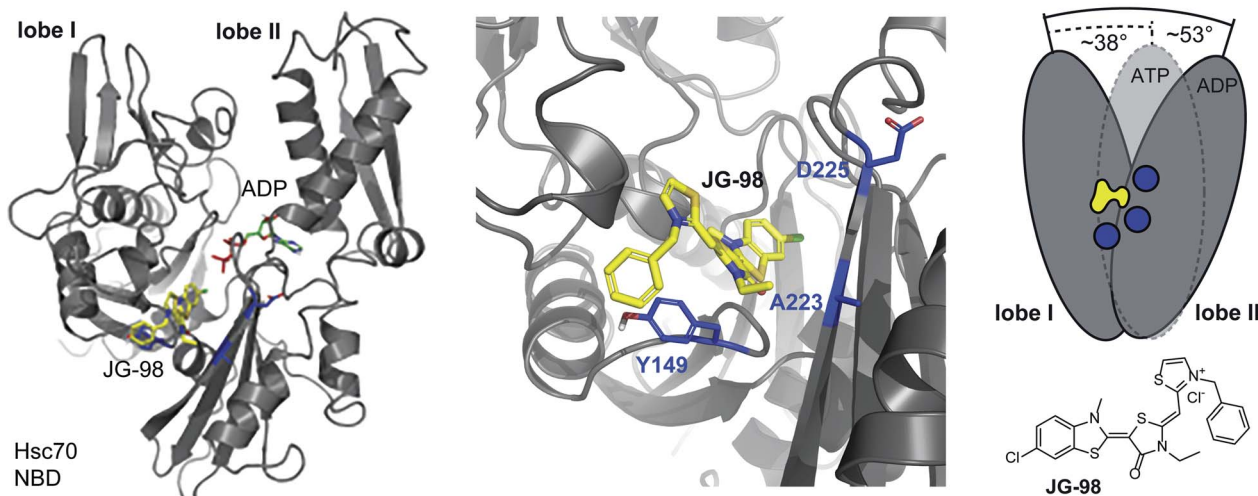
To examine this possibility, we looked at snapshots from the MD simulations of Hsc70 Y149W. This analysis suggested that the indole ring is preferentially placed into the cavity between the lobes, partially limiting their closure (Fig. 1C(i)). Further, the positioning of the indole ring closely traced the predicted position of the thioindole ring of JG-98. The global effect of the Y149W mutation on NBD structure was perhaps best observed by examining the motions of loop 222, which is known to undergo a diagnostic shift during the switch from the ATP- to ADP-state.<sup>37</sup> Specifically, crystal structures and modelling have shown that loop 222 is relatively compact in the ATP-bound state, but it is more extended in the ADP-bound state (Fig. 1C(ii)).<sup>35,46</sup> We found that Y149W favored positioning of loop 222 into a partially ADP-like state, much like JG-98. Neither of the other mutants, A223W or D225W, were able to do this (ESI Fig. 2†). It is worth noting that the extent of loop 222 motion induced by Y149W was not as dramatic as that caused by JG-98 (see Fig. 1C(i)), but we were encouraged that a single mutation could even partially replicate a complex, sub-domain motion.

### The purified tryptophan mutant behaves as if it is inhibitor-bound in both the prokaryotic and eukaryotic systems

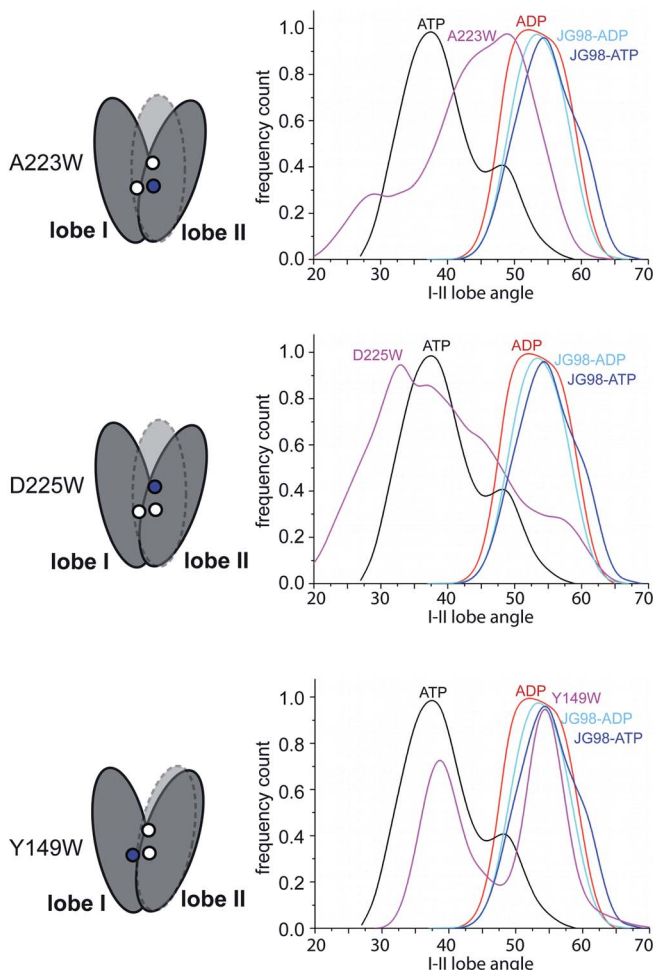
As a next step in understanding whether tryptophan mutants might be useful tools, we expressed and purified the Y149W



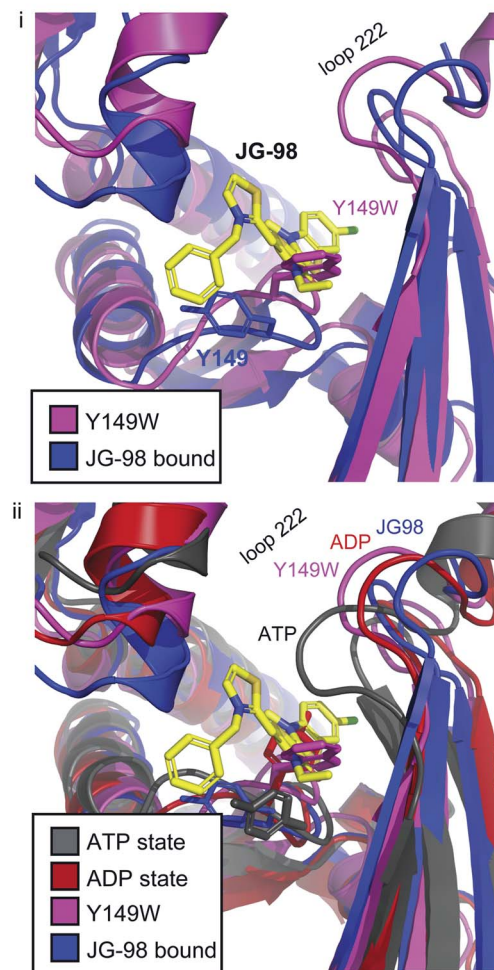
(A) JG98 is predicted to stabilize Hsc70's NBD in the ADP-bound state, with an open position of lobe I and II



(B) Tryptophan Scanning Mutagenesis predicts that Y149W favors the ADP-bound state



(C) Y149W partially mimics the compound-bound state by "pushing" on loop 222



**Fig. 1** Tryptophan scanning mutagenesis predicts that Y149W may partially mimic inhibitor binding by limiting motion of lobe I/II in Hsc70's NBD. (A) Docked structure of Hsc70's NBD in the ADP-bound state (pdb 3C7N), with a closeup of residues A223, D225 and Y149 (blue) at the interface of lobes I and II. JG-98 is known to limit "scissoring" motions of lobes I and II. (B) Summary of how *in silico* mutants A223W, D225W and Y149W sample the ATP-bound (closed) or ADP-bound (open) orientations of lobes I/II during MD simulations. Results are representative of two independent simulations. See Methods. (C) Comparison of the Y149W and ATP-, ADP- and JG98-bound structures. Based on the position of loop 222, Y149W, is predicted to partially mimic JG-98.



mutant of human Hsc70, along with the corresponding Y145W mutant of *E. coli* DnaK. In this manuscript, we will refer to the Hsc70 variant as Y149W Hsc70 and the DnaK variant as Y145W DnaK, but these residue numbers signify the same structural position (see ESI Fig. 1†). In addition, we created the corresponding alanine mutants at these positions: Y149A Hsc70 and Y145A DnaK. These mutants were created to explore whether the traditional alanine-scanning approach might also be useful for this allosteric site. The purified WT and mutant proteins were generally well-folded, as judged by differential scanning fluorimetry (ESI Fig. 3A†). With these proteins in hand, we turned to studying them in a battery of biochemical and structural tests.

First, we measured the ability of the Hsc70 and DnaK variants to hydrolyze ATP using malachite green (MG) assays.<sup>47</sup> In these experiments, we added a J-domain protein (JDP) to the Hsp70s because these factors promote their very low, intrinsic ATP hydrolysis rates, increasing the signal-to-noise ratio of the assay.<sup>48</sup> Specifically, we chose human DnaJA2 as the JDP to activate Hsc70s, while *E. coli* DnaJ was used for the

corresponding DnaKs. Then, we tested the effects of mutations or inhibitor on the JDP-stimulated ATPase activity. As an inhibitor, we used a close analog of JG-98, JG-48 (see Fig. 2), because of a known, fluorescence spectral overlap between MG and JG-98 which prevents use of that particular analog in MG-based, ATPase assays.<sup>49</sup> When we measured ATP hydrolysis in this way, we found that the apparent  $K_m$  values for nucleotide turnover were not significantly different for any of the untreated proteins and, likewise, that this value was unaffected by treatment of Hsc70 WT with JG-48 (Fig. 2). Because the  $K_m$  value is a rough approximation of how tightly JDPs bind, this result suggests that physical interactions with JDPs were not dramatically affected by inhibitors or mutations. Indeed, this result was expected because the binding site of JDPs is far from residue Y149 or Y145.<sup>35,46</sup> However, we found that the  $V_{max}$  values for Y149W Hsc70 and Y145W DnaK mutants were reduced (approximately 2- to 4-fold). The decreased  $V_{max}$  values are consistent with partial stabilization of the ADP-state and a slower rate of nucleotide cycling. Strikingly, we found that JG-48 reduced  $V_{max}$  by roughly this same extent (~4-fold) as the

|       | Mutant     | ATPase activity             |             | protein binding        |                        |
|-------|------------|-----------------------------|-------------|------------------------|------------------------|
|       |            | $V_{max}$ ,<br>pmolP/μg/min | $K_m$ , μM  | $K_{app}$ (ATP),<br>μM | $K_{app}$ (ADP),<br>μM |
| Hsc70 | WT         | 20 ± 1.9                    | 0.03 ± 0.01 | 26 ± 4.6               | 5.5 ± 1.0              |
|       | Y149A      | 25 ± 2.2                    | 0.06 ± 0.02 | 5.2 ± 1.6              | 2.4 ± 0.7              |
|       | Y149W      | 4.8 ± 0.5                   | 0.03 ± 0.01 | 4.0 ± 0.9              | 1.8 ± 1.0              |
|       | WT + JG-48 | 5.0 ± 0.9                   | 0.02 ± 0.02 | 5.9 ± 1.1              | 5.2 ± 0.9              |
| DnaK  | WT         | 20 ± 0.8                    | 0.2 ± 0.03  | >30                    | 9.1 ± 2.6              |
|       | Y145A      | 26 ± 2.2                    | 0.2 ± 0.1   | >30                    | 9.5 ± 2.9              |
|       | Y145W      | 13 ± 1.8                    | 0.2 ± 0.1   | 3.9 ± 0.5              | 8.0 ± 1.9              |

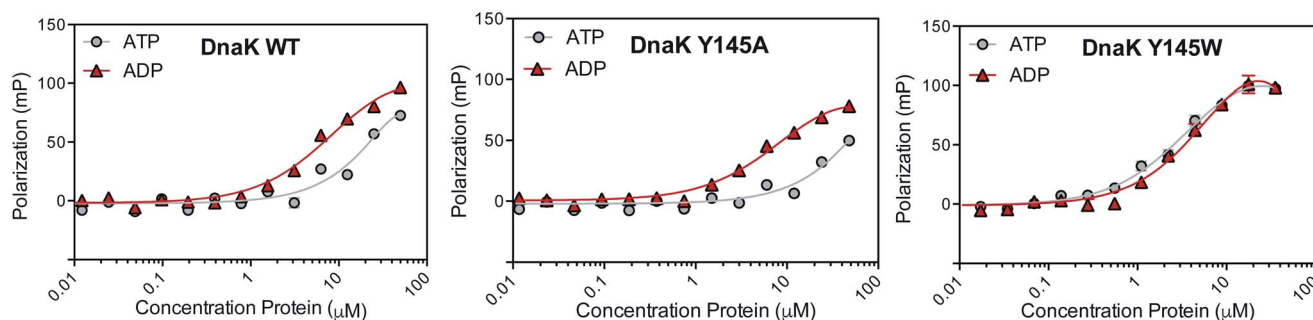
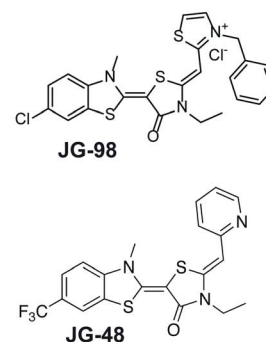


Fig. 2 Y149W and Y145W partially mimic the biochemical behavior of inhibitor treatment. Summary of ATPase activity and peptide-binding assays, using purified human Hsc70 or *E. coli* DnaK and the corresponding mutants. Steady state ATPase activity was measured using malachite green (MG) and binding to a fluorescent FAM-HLA tracer was measured using fluorescence polarization (FP). In the ATPase assays, a J-domain protein (JDP; either DnaJA2 or DnaJ) was added to increase signal intensity. Examples of the FP results for DnaK and its mutants are shown (bottom). Error bars represent SEM of two independent, biological replicates, each performed in technical triplicate. See the Methods for details.



point mutants. In addition, we found that the ATPase activity of the Y145W DnaK mutant was relatively resistant to JG-48 (ESI Fig. 3B†), consistent with occlusion of the binding site by the indole side chain. Together, these results suggest that the tryptophan mutants of Hsc70 and DnaK partially mimic the inhibitor-bound state. It is worth noting that traditional DN mutants of Hsc70, in which the catalytic lysine residue is mutated, lack any hydrolysis activity ( $V_{\max}$  and  $K_m$  values  $\sim$ zero).<sup>50</sup> Thus, the Y149W and Y145W mutants appear to be a better mimic of allosteric inhibitors than the typical DN.

Another sensitive indicator of nucleotide status in Hsp70 family members is their affinity for peptides.<sup>47,51</sup> This important function is commonly measured by using fluorescence polarization (FP) in which model peptides are attached to fluorophores and used as tracers. Briefly, Hsp70s bind more tightly to these tracer peptides in the ADP-bound state, when compared to the ATP-bound state.<sup>51</sup> JG-48 is known to enhance WT Hsc70's affinity for FAM-HLA in the FP experiment ( $\sim$ 5  $\mu$ M with either nucleotide).<sup>49</sup> Thus, we hypothesized that the Y149W and Y145W mutants might also have a tighter apparent affinity ( $K_{\text{app}}$ ) in the presence of either nucleotide. To test this idea, we used model peptide, HLA, attached to a FAM fluorophore (termed FAM-HLA) (see Methods). We predicted that addition of ATP would be unable to weaken the interaction of Y149W Hsc70 with FAM-HLA, because the mutants would be relatively "locked" into the tight-binding, ADP-state. Before asking this question, we first confirmed that FAM-HLA binds tighter to WT Hsc70 in the presence of ADP ( $K_{\text{app}} \sim$  5  $\mu$ M) than ATP ( $K_{\text{app}} \sim$  26  $\mu$ M). Similar results were obtained with WT DnaK, which had an affinity of 9  $\mu$ M in the ADP state and  $>$ 30  $\mu$ M in the ATP state (Fig. 2A). Consistent with the design, we found that Y145W DnaK bound to FAM-HLA, with relatively tight affinity in the presence of either ATP ( $K_{\text{app}} \sim$  4  $\mu$ M) or ADP ( $K_{\text{app}} \sim$  8  $\mu$ M) (Fig. 2). Likewise, the Y149W Hsc70 mutant bound relatively tightly in the presence of either nucleotide ( $\sim$ 4 to 5  $\mu$ M). In contrast, the control Y145A DnaK behaved similarly to WT DnaK, only binding tightly in the ADP-state ( $\sim$ 9  $\mu$ M), but not the ATP state ( $>$ 30  $\mu$ M). In the human system, the Hsc70 Y149A control still bound relatively tightly in the presence of ATP ( $\sim$ 4  $\mu$ M; Fig. 2). The reasons for this result are not clear at this time, but it is possible that this mutant may somehow affect NBD-SBD coupling.

Partial proteolysis is another diagnostic way to discern whether Hsp70s are in the ATP-like or ADP-like conformer.<sup>52</sup> Briefly, short treatments with trypsin cleave Hsc70 at the linker between the NDB and SBD (Fig. 3A), giving rise to a truncated product of  $\sim$ 55 kDa on a denaturing polyacrylamide gel (termed band 2). In the ADP-like state, this band is favored because the NBD and SBD are apart from each other.<sup>46</sup> In contrast, a mixture of products is formed between 50 to 60 kDa (termed bands 1, 2 and 3) in the ATP-bound state and the overall intensity of band 2 is typically reduced because the system is in a more compact state. Thus, the relative ratio of the intensity of band 2 to band 1 (band 2 : 1) can broadly diagnose whether the protein's structure is relatively more ATP- or ADP-like. Consistent with the literature, we found that proteolysis of WT Hsc70 yielded the predicted pattern of products (Fig. 3A). Specifically, treatment of

the apo-protein with ADP (1 mM) stabilized band 2 by  $\sim$ 3- to 4-fold, while ATP did not. In addition, we confirmed that JG-98 could produce the ADP-like banding pattern, even if ATP was added (ESI Fig. 3C†). Finally, we found that Y149W Hsc70 but not the alanine mutant, Y149A Hsc70, could also, like JG-98, favor the ADP-like conformation (Fig. 3A), regardless of whether ADP or ATP was added. Moreover, similar results were observed using DnaK and its variants, although the bands 1, 2 and 3 are located around 45 to 50 kDa in that protein system (Fig. 3B). Specifically, WT DnaK and Y145A DnaK gave the predicted pattern of three bands in the presence of ATP, but Y145W was able to resist this conformational change, staying in the ADP-like state (Fig. 3B). Together, these results support the idea that Y149W Hsc70 and Y145W DnaK behave as if bound to JG-98.

### Expression of Y149W DnaK phenocopies treatment with JG-98 in *E. coli*

One important way we anticipated using the Y145W mutant was to explore DnaK as a putative drug target in pathogens. This idea is based on studies in  $\Delta$ *dnaK* *E. coli* strains, which fail to grow at elevated temperature,<sup>53,54</sup> owing to an increase in aggregated protein.<sup>55</sup> Moreover, the infectivity of  $\Delta$ *dnaK* strains of *S. aureus* are significantly reduced in mouse models<sup>56</sup> and these strains are more sensitive to antibiotics.<sup>57</sup> Together, these findings broadly suggest that DnaK might be a new target for the development of anti-infectives. However, there are multiple ways of inhibiting DnaK; for example, one might block nucleotide binding,<sup>58</sup> collaborations with DnaJ<sup>59</sup> or allostery.<sup>60,61</sup> Which of these approaches would be predicted to be anti-bacterial? Answering this question is made more difficult by observations that DnaK's ATPase activity does not correlate directly with its function *in vivo*,<sup>62,63</sup> so traditional DN mutants do not produce informative results.

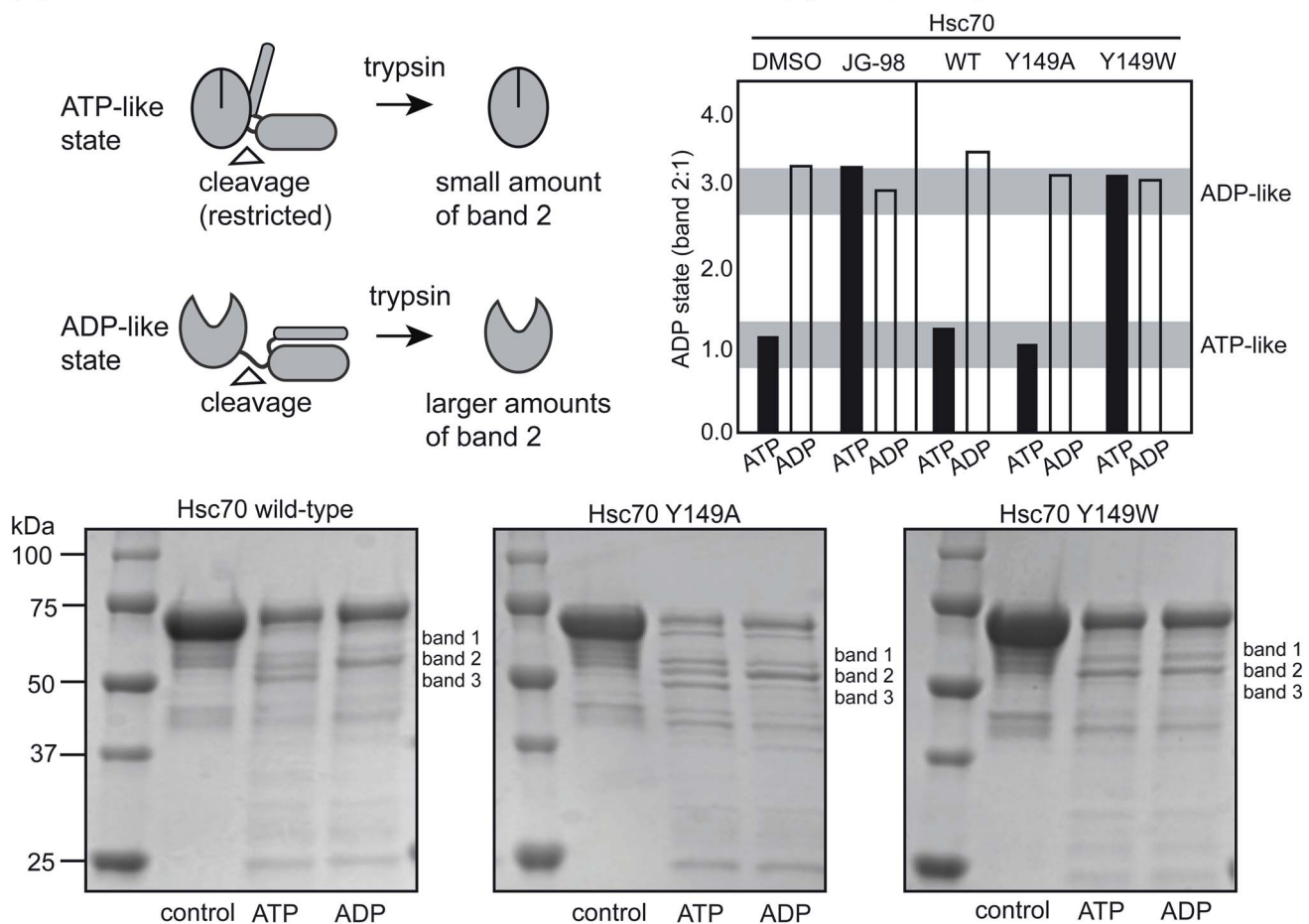
We reasoned that Y145W DnaK could be a useful tool for addressing this issue. Accordingly, we introduced WT, Y145W and Y145A DnaK into a  $\Delta$ *dnaK* strain of *E. coli*. Each of the proteins was expressed at similar levels (ESI Fig. 3D†). At permissive temperature, all of the strains were viable (Fig. 4A). However, Y145W was not able to complement growth at 40 °C. This result suggested that stabilizing the ADP-like state, as accomplished by Y145W, might be important for growth under these conditions. Indeed, we found that JG-319 (a more permeable analog of JG-98; see below), like Y145W, could partially suppress growth of *E. coli* in liquid cultures, especially at elevated temperature (Fig. 4B). Together, these studies support the idea that DnaK is a putative drug target.

### Analogues of JG-98 have anti-bacterial activity

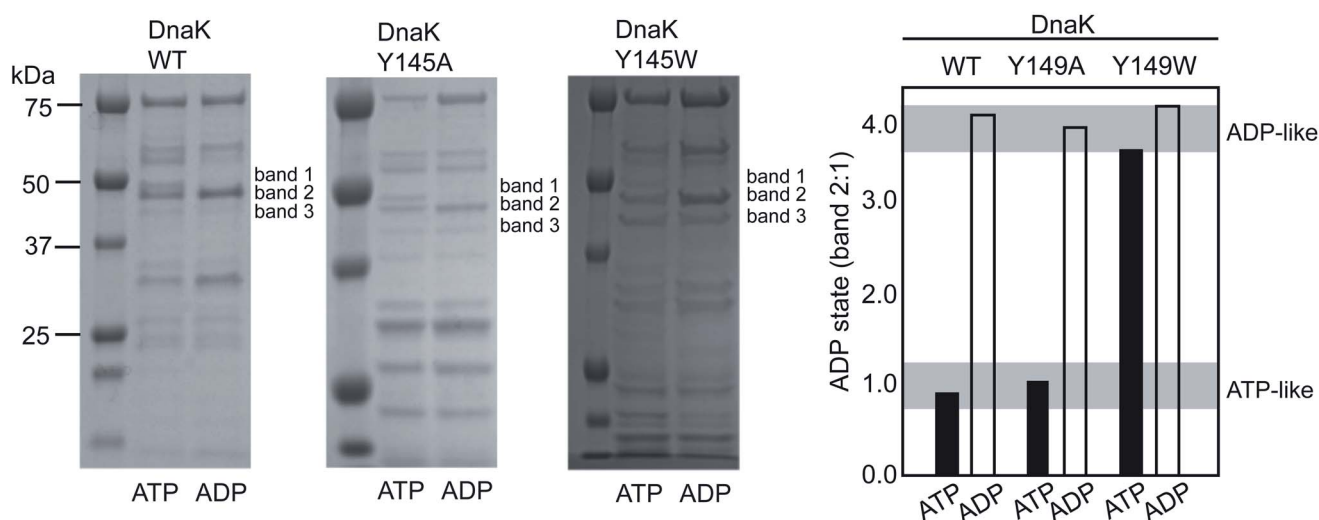
Inspired by these findings, we then tested a panel of  $\sim$ 54 recently reported analogues of JG-98 (ref. 17) at a single concentration (16  $\mu$ g mL<sup>-1</sup>) for the ability to suppress growth of six common strains, representing Gram-positive (*Bacillus subtilis*, *B. anthracis*, *B. cereus* and *S. aureus*) and Gram-negative (*E. coli* and *H. influenza*) bacteria. In these initial screens, we measured OD<sub>600</sub> in liquid cultures at 0, 3 and 6 hours at 37 °C and used



## (A) Y149W, like JG-98, stabilizes Hsc70 in an ADP-like state, by partial proteolysis



## (B) Y145W stabilizes DnaK in an ADP-like state



**Fig. 3** Y149W stabilizes the ADP-like state of Hsc70 and DnaK. (A) Treatment with trypsin is known to produce relatively more band 2 (composed of the NBD and a short section of the linker domain) in the ADP-like state because of the relative availability of the linker to proteolysis. Conversely, this cleavage site is relatively obscured in the ATP-like state. WT Hsc70 gives the expected banding pattern in the ATP- and ADP-like states. Y145W, but not Y145A, stabilizes the ADP-like state, even when ATP (1 mM) is added. Treatment of WT Hsc70 with JG-98 (100  $\mu$ M) mirrors the Y145W mutant. Band 2 intensity is plotted as a ratio of band 2 : 1. Results are representative of experiments performed in duplicate. (B) Similar results were observed with DnaK, with Y145W stabilizing band 2 and the ADP-like state.



(A) WT or Y149A DnaK, but not Y149W, can rescue growth of  $\Delta$ dnak at elevated temperature

(B) Allosteric inhibitor suppresses growth of *E. coli*, especially at elevated temperature

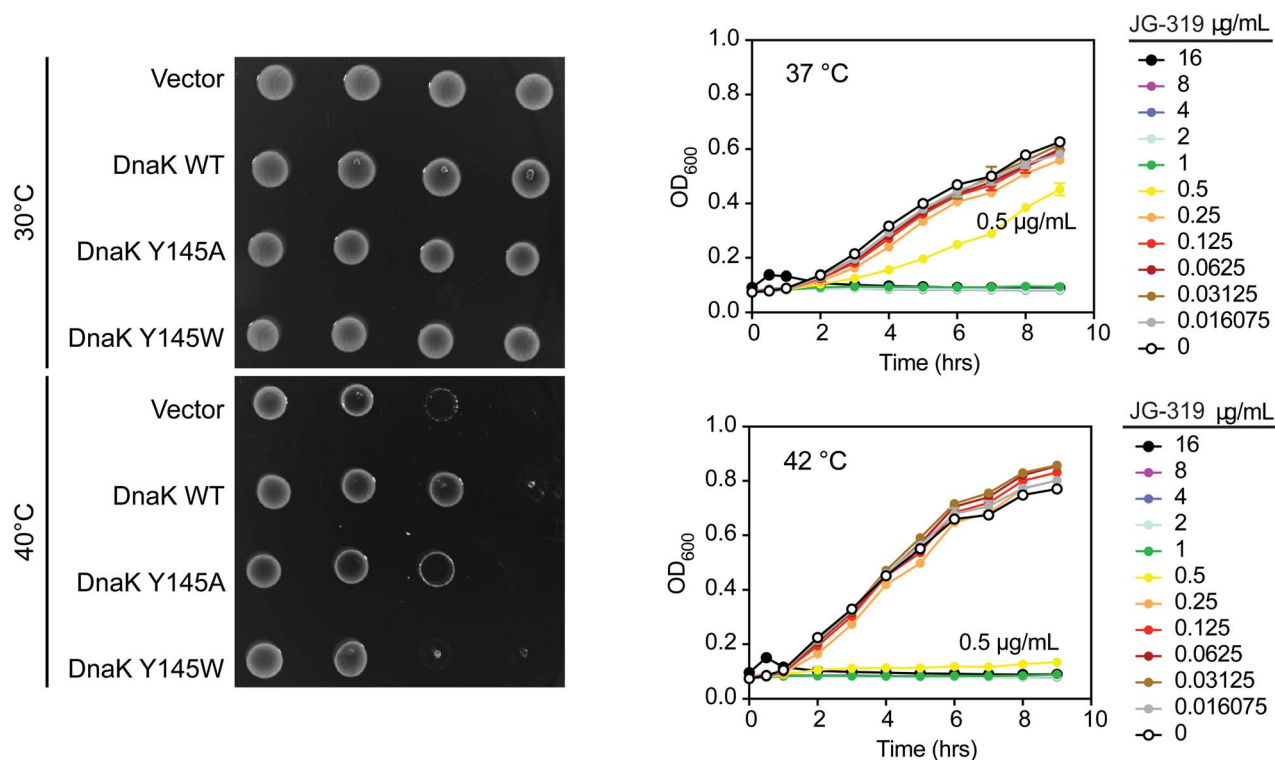


Fig. 4 Exploration of DnaK as a potential anti-bacterial target. (A) WT and Y145A DnaK, but not Y145W DnaK, complement for loss of DnaK in *E. coli*, as judged by spot dilution assays. These results are representative of experiments performed in duplicate. (B) Treatment with a representative allosteric inhibitor, JG-319, partially suppresses growth of *E. coli* (K12) in liquid media at elevated temperature (42 °C). The position of the JG-319 (0.5 µg mL<sup>-1</sup>; yellow) results are highlighted. Results are the average of experiments performed in duplicate.

tetracycline as a positive control (ESI Fig. 4A†). We found that 31/54 compounds (~57%) had measurable activity and 24/54 compounds (44%) had minimum inhibitory concentration (MIC) values below 16 µg mL<sup>-1</sup> in dose response curves (ESI Fig. 4B†). Of the active molecules, 18 suppressed growth of both Gram-negative and Gram-positive bacteria (ESI Fig. 4C†). Thus, DnaK does indeed seem to be a promising anti-infective target, at least for compounds with the MoA of JG-98. Guided by these results, we synthesized 29 additional analogs of JG-98 (ESI Fig. 5†). These analogs were synthesized through a reported route<sup>17</sup> and screened in dose response curves to calculate MIC values against a broader collection of clinically relevant, human pathogens, including *A. baumannii* ATCC 19606, *E. coli* MC1061, *P. aeruginosa* ATCC 27853, *L. monocytogenes* ATCC 19115, *M. smegmatis* MC122, multidrug-resistant *S. aureus* MRSA1, MRSA2, USA100, USA200, USA300, USA600 and ATCC 29213 and a vancomycin resistant enterococcal (VRE) strain.

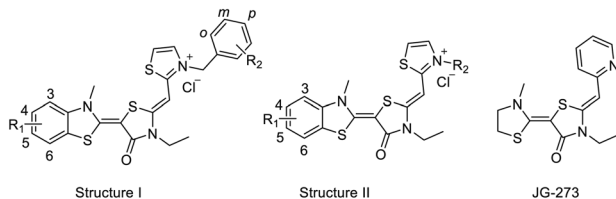
In the first 15 compounds, we retained the pendant benzyl moiety in JG-98 and varied the identity of substituents at R<sub>1</sub> and R<sub>2</sub> (structure I; Fig. 5). Although there were clearly strain-specific differences in sensitivity, we found that halogens at R<sub>1</sub> (compounds 12, 13 and 15) were generally less active than modest-sized alkyl groups, such as 5-methyl, 5-ethyl and 5-isopropyl. For example, a 5-isopropyl group (JG-325) was generally

more active than a 5-ethyl (5) or 5-bromo group (12). Substitutions at R<sub>2</sub> had less influence on activity; for example, analogs with *o*-Cl (3), *o*-Me (4) or *o*-OCF<sub>3</sub> (5) at R<sub>2</sub> had comparable MIC values. Because R<sub>2</sub> seemed to have relatively minimal effect in this context, we decided to explore distinct ring systems on that side of the molecule (structure II, Fig. 5). Although hetero-atom containing rings (furans 16–19, thiophenes 25–27) were not substantially better than the benzyl group in structure I, we found that adding a methyl group to the linker (JG-319, JG-320, 22–23) produced some of the most potent analogs in the series (MIC values of <0.125 µg mL<sup>-1</sup> against multiple strains). Importantly, JG-273, which is unable to bind DnaK because it is missing the critical benzothiazole, was inactive (MIC values >64 µg mL<sup>-1</sup>). Together, these results suggest that DnaK may be an under-explored target, because the best molecules had promising MIC values (~0.125 µg mL<sup>-1</sup>).

## Discussion

It is often difficult to compare knockdown phenotypes to the effects of chemical inhibitors, because many proteins serve scaffolding functions in addition to enzymatic activities.<sup>64</sup> Indeed, this is why DN mutants can be powerful probes, because they strategically remove catalytic activity without





| cmpd        | Structure | R <sub>1</sub>       | R <sub>2</sub>               | <i>L. monocytogenes</i> |          | <i>M. smegmatis</i> |       |       | <i>S. aureus</i> | <i>S. aureus</i> | <i>S. aureus</i> | <i>S. aureus</i> | <i>S. aureus</i> |
|-------------|-----------|----------------------|------------------------------|-------------------------|----------|---------------------|-------|-------|------------------|------------------|------------------|------------------|------------------|
|             |           |                      |                              | ATCC 19115              | MRSA1    | MRSA2               | MC122 | VRE   | USA100           | USA200           | USA300           | USA600           | ATCC 29213       |
| 1           | I         | 5 - isopropyl        | <i>o</i> - H                 | 0.5                     | <0.125   | 0.25                | 2     | 0.5   | 0.5              | 1                | 1                | 0.5              | 0.25-0.5         |
| 2           | I         | 5 - Me               | <i>o</i> - O CF <sub>3</sub> | 1-2                     | <0.125   | <0.125              | 32    | 1-2   | 1-2              | 2                | 2                | 2                | 0.25             |
| 3           | I         | 5 - ethyl            | <i>o</i> - Cl                | 4                       | <0.125   | 0.25                | 16    | 1     | 4                | 4                | 2                | 4                | 0.25             |
| 4           | I         | 5 - ethyl            | <i>o</i> - Me                | 0.25-0.5                | <0.125   | 0.25                | 1     | 0.25  | 0.5              | 0.5-1            | 1                | 1                | 0.25-0.5         |
| 5           | I         | 5 - ethyl            | <i>o</i> - O CF <sub>3</sub> | 0.5                     | <0.125   | <0.25               | 1     | 0.5   | 1                | 0.5              | 1                | 0.5              | <0.25            |
| 6           | I         | 5 - ethyl            | <i>o</i> - CF <sub>3</sub>   | 4                       | <0.125   | 0.5                 | >64   | 2     | 8                | 4                | 2                | 1                | 1                |
| 7           | I         | 5 - OCH <sub>3</sub> | <i>o</i> - CF <sub>3</sub>   | --                      | --       | --                  | --    | --    | --               | --               | --               | --               | --               |
| 8 (JG-324)  | I         | 5 - isopropyl        | <i>o</i> - Me                | <0.125                  | <0.25    | 0.5                 | 1-2   | <0.25 | 1                | 1                | 1                | 1                | 0.25-0.5         |
| 9 (JG-325)  | I         | 5 - isopropyl        | <i>o</i> - O CF <sub>3</sub> | <0.125                  | <0.25    | 0.25                | >128  | 0.5   | 1                | 1                | 1                | 0.5              | 0.25             |
| 10          | I         | 5 - isopropyl        | <i>o</i> - CF <sub>3</sub>   | <0.25                   | <0.125   | 0.5                 | >64   | 0.5   | 0.5              | 1                | 1-2              | 1                | 0.25-0.5         |
| 11          | I         | 5 - Me               | <i>o</i> - CF <sub>3</sub>   | >64                     | 0.5      | 0.5                 | >64   | >64   | >64              | >64              | >64              | >64              | 0.5-1            |
| 12          | I         | 5 - Br               | <i>o</i> - O CF <sub>3</sub> | 4                       | 0.5      | 1                   | >64   | 0.5-1 | 4                | 4                | 6                | >64              | 0.5              |
| 13          | I         | 5 - Br               | <i>o</i> - CF <sub>3</sub>   | >64                     | 1        | 2                   | >64   | >64   | >64              | >64              | >64              | >64              | 1                |
| 14          | I         | 5 - isopropyl        | <i>o</i> - Cl                | 0.5                     | 0.25     | 0.5                 | 4     | 0.25  | 0.5              | 0.5              | 0.25-0.5         | 0.5-1            | <0.5             |
| 15          | I         | 5, 6 - F             | <i>o</i> - CF <sub>3</sub>   | >64                     | 1        | 2                   | >64   | >64   | >64              | >64              | >64              | >64              | 1                |
| 16          | II        | 4 - Cl               |                              | 2-4                     | <0.125   | 0.25-1              | 8-32  | 8-16  | 2                | 2-4              | 2                | 4                | 0.25-1           |
| 17          | II        | 5, 6 - F             | Same as 16                   | 0.5-1                   | <0.125   | <0.25               | 4     | 0.5   | 0.5-1            | 1                | 2                | 1                | 0.25-0.5         |
| 18          | II        | 5 - isopropyl        | Same as 16                   | 2                       | <0.125   | 1-2                 | >64   | 2     | 4                | 2-4              | 2                | 1                | 1                |
| 19          | II        | 5 - ethyl            | Same as 16                   | 16                      | 2        | 16-32               | >64   | 16    | 64               | 16               | 32               | 64               | 8                |
| 20 (JG-319) | II        | 5 - isopropyl        |                              | <0.125                  | <0.25    | <0.125              | 1-2   | 0.5   | 0.5-1            | 1                | 1                | 1                | <0.25            |
| 21 (JG-320) | II        | 5 - ethyl            | Same as 20                   | <0.125                  | <0.25    | <0.125              | 2     | 0.5   | 1                | 1                | 1                | 1                | <0.125           |
| 22          | II        | 5 - Br               | Same as 20                   | 0.25                    | 0.25     | <0.125              | 4     | 0.5-1 | 0.5              | 0.5              | 0.25             | 0.5              | <0.125           |
| 23          | II        | 5 - Me               | Same as 20                   | 0.25-0.5                | 0.25-0.5 | 0.25-0.5            | 1-2   | 1-2   | 1                | 1                | 0.5-1            | 1                | 0.25             |
| 24          | II        | 5 - isopropyl        |                              | 1                       | 0.5      | 0.25-0.5            | >64   | 0.5-1 | 1                | 2                | 1                | 1                | 0.5              |
| 25          | II        | 5 - ethyl            | Same as 24                   | 8                       | 2        | 2-8                 | >64   | 8     | 16               | 32               | 16-32            | 32               | 8-16             |
| 26          | II        | 5, 6 - F             |                              | 2                       | 0.25     | 0.5                 | 4-8   | 1-2   | 1                | 2                | 1                | 1-4              | 0.5              |
| 27          | II        | 5, 6 - F             |                              | 0.5                     | 0.25     | 0.25                | 1     | 1     | 0.5-1            | 0.5-1            | 0.5              | 0.5              | <0.125           |
| 28          | II        | 5, 6 - F             |                              | 2-4                     | 0.25     | 0.5-1               | 2-4   | 2-4   | 4-8              | 4                | 8                | 4                | 2                |
| JG-273      | -         | -                    | -                            | >64                     | >64      | >64                 | >64   | >64   | >64              | >64              | >64              | >64              | >64              |

All MIC values in  $\mu\text{g/mL}$ .

Fig. 5 Summary of minimum inhibitory concentration (MIC) values from growth assays in a panel of human pathogens. JG-98 analogs were tested as described in the Methods. Compound 7 was not soluble enough for testing (-). All MIC values are in  $\mu\text{g mL}^{-1}$ .

impacting other protein functions. However, DN mutants completely ablate enzymatic activity (in most cases), making it harder to compare to treatment with allosteric inhibitors that might only tune  $K_{\text{cat}}$  or  $K_{\text{m}}$ . Indeed, during our ongoing efforts to develop inhibitors of Hsp70s, we found that it was difficult to satisfyingly link JG-98 to Hsp70s using DNs. Accordingly, we envisioned an adaptation of tryptophan scanning mutagenesis to create DN-like point mutants that act as if bound to the allosteric inhibitor. This approach clearly requires substantial, pre-existing knowledge of the compound's binding site and

MoA; therefore, it is likely less amenable to systems in which these features are not yet defined. However, we reasoned that tryptophan scanning mutagenesis may still find use in exploring targets, such as Hsp70s, that have available structures and multiple, allosteric binding sites. In those cases, traditional DN approaches, such as enzyme-dead mutants lacking catalytic residues, would not be expected to fully recapitulate the inhibitor MoA. Indeed, this is what we observed with Hsc70 Y149W and DnaK Y145W, which behaved more similarly to JG-98 than a typical DN in a series of biochemical and functional





assays. Thus, we suggest that tryptophan scanning mutagenesis might be especially useful for studying the selectivity of allosteric inhibitors and their targets.

To explore the approach's possible utility, we used the DnaK Y149W mutant to implicate DnaK as a putative drug target in bacteria. Perhaps more pointedly, our results suggested that compounds able to stabilize the ADP-like state of DnaK would be promising to explore. Indeed, this prediction led us to design, synthesize and screen JG-98 analogs, revealing promising MIC values ( $<0.125 \mu\text{g mL}^{-1}$ ) against a number of important, human pathogens. Although the conservation of the JG-98 binding site with mammalian orthologs likely makes DnaK a challenging target for developing clinical candidates, our studies suggest that JG-98 analogs might still be useful chemical probes for studying DnaK's role(s) in virulence. It will also be interesting to see if minor differences between DnaKs (see ESI Fig. 1†) could be exploited to develop selective inhibitors. It will also be interesting to confirm that JG-98 analogs are selective for DnaK, using complementary approaches, such as CETSA and/or screening for resistance mutants.

For the human Hsp70 system, our ongoing inquiries suggest that it will be important to knockdown or knockout the WT Hsp70 isoform in each experiment, much like what was done with the  $\Delta\text{dnaK}$  strain. Advances in CRISPR and shRNA technologies may make this objective more tractable. Despite these hurdles, we posit that tryptophan scanning mutagenesis might serve as an effective way to build tools for human Hsp70 family members and maybe other chaperones. More broadly, this approach might be useful in making DN variants for a wider range of protein targets. We predict that it may be especially useful for those targets with allosteric binding sites, where traditional DNs are less effective.

## Methods

### Molecular dynamics (MD) simulations

MD simulations of Hsc70 NBD (PDB code: 3C7N) and its mutants were performed using the protocol previously described in Rinaldi *et al.*<sup>37</sup> using the AMBER 16.0 package<sup>65</sup> with the AMBER ff99SB force field.<sup>66</sup> Mutants described in the text were generated using the Pymol mutation tool, selecting the best possible rotamer for the corresponding structure. The simulations were run in the presence or in the absence of ATP or ADP in the orthosteric site. All the structures were solvated with TIP3P water molecules,<sup>67</sup> counter-ions were randomly added to ensure overall charge neutrality. The system was first minimized using the steepest descent scheme. Secondly a 0.4 ns simulation was run in an NVT (constant Number, Volume and Temperature) ensemble in which the positions of alpha carbons were weakly restrained (force constant  $10 \text{ kcal mol}^{-1} \text{ \AA}^{-2}$ ) and slowly increasing the temperature up to 300 K. Later a 0.2 ns simulation in an NPT (constant Number, Pressure and Temperature) ensemble maintaining the restraints on alpha carbons was performed. Finally, for each system we ran two independent MD replicas for each system under NPT conditions, each simulation being 500 ns long. All the simulations were performed in periodic boundary condition (PBC). Short-range electrostatic and van der

Waals interactions were calculated within a 10 Å cutoff, whereas long-range electrostatic interactions were assessed using the particle Ewald method.<sup>68</sup> The Shake algorithm was used to treat all bonds involving hydrogen atoms.<sup>69</sup> All simulations were run in two independent replicates.

The docked co-structures of JG-98 were generated by docking the molecule into the representative conformation of the most populated structural cluster of the allosteric site induced by MKT077, described previously.<sup>36</sup> This strategy was shown to be efficient and effective in the design allosteric modulators of chaperone proteins.<sup>70,71</sup> Briefly, JG-98 was docked using both Induced Fit and Glide docking software (Software Suite 2017-3, Schrodinger Inc).

### Calculation of predicted lobe I/II angle

To calculate the angle between lobes I and II, we defined two axes of inertia, one for each lobe. The angle defined by such axes is referred to as the I/II angle. Axes and angles were calculated using the program Chimera (UCSF). All the trajectories were sampled every 500 ps starting at 50 ns. On each extracted structure, to determine the axes, we used only residues forming the conserved secondary structures along the simulation time. Next, we calculated the distribution of the values of the I/II angle for each simulated system.

### Protein expression and purification

Human Hsc70 (HSPA8) WT, Y149W and Y149A were expressed in *E. coli* BL21 (DE3) cells. Cultures were grown at 37 °C until an OD<sub>600</sub> of 0.6, then the temperature was adjusted to 25 °C and expression was induced with isopropyl  $\beta$ -D-1-thiogalactopyranoside (IPTG; 500  $\mu\text{M}$ ). Induced cultures were grown overnight at 25 °C before sonication and centrifugation, then the pellets were re-suspended in His-binding buffer (50 mM Tris, 10 mM imidazole, 500 mM NaCl, pH 8.0) supplemented with protease inhibitor cocktail. The supernatant was then applied to Ni<sup>II</sup>-NTA His-Bind Resin (Novagen, Darmstadt, Germany) and washed twice before elution with His-elution buffer (50 mM Tris, 300 mM imidazole, 300 mM NaCl, pH 8). A nearly identical protocol was used for human DnaJA2 and *E. coli* DnaJ and DnaK (WT, Y145A, Y145W), as described.<sup>47,62</sup> Eluted proteins were concentrated and stored in 50 mM Tris, 300 mM NaCl, pH 7.4 buffer.

### ATPase assays

Nucleotide turnover was measured using malachite green (MG) assays, as previously described.<sup>72</sup> Briefly, the steady state ATPase activity of Hsc70 or DnaK (1  $\mu\text{M}$ ) was measured in the presence of increasing concentrations of DnaJA2 or DnaJ (0 to 10  $\mu\text{M}$ ), respectively. The background signal from non-specific ATP hydrolysis was subtracted and a phosphate standard curve (potassium dibasic phosphate) was used to calculate pmol Pi per  $\mu\text{M}$  protein per min. Experimental data were analyzed using GraphPad Prism 6 software, fitting to the Michaelis–Menton equation. Here, the  $V_{\text{max}}$  is defined as the maximum turnover at saturating DnaJA2/DnaJ, while the  $K_{\text{m}}$  is the apparent half maximum amount of DnaJA2/DnaJ that is needed for



stimulation. The effects of JG-48 (10  $\mu\text{M}$ ) on turnover by Hsc70 and DnaJA2 was previously reported.<sup>49</sup> As mentioned above, JG-98 has a fluorescence overlap with MG, so the close analog JG-48 is used in these experiments.

### Fluorescence polarization

Peptide binding to Hsc70 or DnaK was measured using a fluorescent peptide FAM-HLA (AnaSpec), as described.<sup>47</sup> Briefly, the HLA peptide is known to bind the canonical, binding cleft in the SBD of Hsp70 family members. The addition of the FAM fluorophore is commonly used to convert this peptide into a FP tracer. In these experiments, apo-Hsc70 (0 to 50  $\mu\text{M}$ ) and FAM-HLA (25 nM) were mixed with nucleotide (1 mM, ATP or ADP) and incubated for 30 minutes at room temperature in assay buffer (100 mM Tris, 20 mM KCl, 6 mM  $\text{MgCl}_2$  pH 7.4). After incubation, fluorescence polarization was measured (excitation: 485 nm emission: 535 nm) using a SpectraMax M5 plate reader. The apparent half-maximum is reported as  $K_{\text{app}}$ .

### Partial proteolysis

Partial proteolysis experiments were performed using the procedure described.<sup>42</sup> Briefly, samples of Hsc70 or DnaK were prepared in a partial proteolysis buffer (40 mM HEPES, 20 mM NaCl, 8 mM  $\text{MgCl}_2$ , 20 mM KCl, 0.3 mM EDTA, pH 8.0) with either 1 mM ATP or ADP. Samples were incubated at room temperature for 30 minutes prior to addition of trypsin (EC 3.4.21.4, Sigma) at a 1 : 4 molar ratio (trypsin : Hsc70). Proteolysis was carried out for 40 minutes and quenched with 25  $\mu\text{L}$  of SDS loading buffer (240 mM Tris, 6% (w/v) SDS, 30% (v/v) glycerol, 16% (v/v)  $\beta$ -mercaptoethanol, 0.6 mg  $\text{mL}^{-1}$  bromophenol blue, pH 6.8) and then heated at 95  $^\circ\text{C}$  for 3 minutes. Samples were separated by SDS-PAGE using 10% Mini-PROTEAN TGX Precast Gels and stained with Coomassie blue.

### DnaK growth complementation

$\Delta\text{dnaK}$  *E. coli*<sup>35</sup> were transformed with plasmids containing L-arabinose-inducible 6xHis-tagged *dnaK* variants or the empty vector. A single colony was cultured overnight in Luria Broth at 30  $^\circ\text{C}$ . The OD value of each culture was then adjusted to 0.5 and the expression of DnaK variants was induced by 20  $\mu\text{M}$  L-arabinose (Sigma Aldrich) for 2 hours at 30  $^\circ\text{C}$ . 3-fold serial dilutions were spotted onto LB-agar plates. Plates were then incubated at 30  $^\circ\text{C}$  or 40  $^\circ\text{C}$  overnight. DnaK expression levels after L-arabinose induction for 2 hours were verified by immunoblotting using anti-Tetra-His antibody (QIAGEN).

### Synthesis of JG-98 analogs

Synthesis of JG-98 analogs was carried out as reported.<sup>17,44</sup> For each purified compound, <sup>1</sup>H-NMR spectra were obtained using a Bruker 400 or 500 Ultrashield™ spectrometer and analyzed using Bruker TOPSPIN. Active analogs were soluble in aqueous solutions at 50  $\mu\text{M}$ , as determined by DLS and turbidity measurements.

### Anti-bacterial MIC assays

MIC experiments were performed using the double dilution method. Briefly, inoculum of each strain was prepared by diluting a fresh culture of an OD<sub>600</sub> of  $\sim 0.4$  1 : 1000 and 100  $\mu\text{L}$  was added compound (100  $\mu\text{L}$ ) to generate a 2-fold dilution series (final concentrations in the range of 64 to 0.125  $\mu\text{g mL}^{-1}$ ). Plates were covered and incubated at 37  $^\circ\text{C}$  16–24 hours before MIC values were determined visual inspection or staining with MTT when needed. For pathogens, 37  $^\circ\text{C}$  was considered a mild temperature stress.

### Conflicts of interest

The authors claim no competing financial interests.

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