# RNA structure modulates Cas13 activity and enables mismatch detection

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# 13 Abstract

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15 The RNA-targeting CRISPR nuclease Cas13 has emerged as a powerful tool for applications 16 ranging from nucleic acid detection to transcriptome engineering and RNA imaging<sup>1-6</sup>. Cas13 is activated by the hybridization of a CRISPR RNA (crRNA) to a complementary single-stranded 17 RNA (ssRNA) protospacer in a target RNA<sup>1,7</sup>. Though Cas13 is not activated by double-18 stranded RNA (dsRNA) in vitro, it paradoxically demonstrates robust RNA targeting in 19 20 environments where the vast majority of RNAs are highly structured<sup>2,8</sup>. Understanding Cas13's 21 mechanism of binding and activation will be key to improving its ability to detect and perturb 22 RNA; however, the mechanism by which Cas13 binds structured RNAs remains unknown<sup>9</sup>. 23 Here, we systematically probe the mechanism of LwaCas13a activation in response to RNA 24 structure perturbations using a massively multiplexed screen. We find that there are two distinct 25 sequence-independent modes by which secondary structure affects Cas13 activity: structure in 26 the protospacer region competes with the crRNA and can be disrupted via a strand-27 displacement mechanism, while structure in the region 3' to the protospacer has an allosteric 28 inhibitory effect. We leverage the kinetic nature of the strand displacement process to improve 29 Cas13-based RNA detection, enhancing mismatch discrimination by up to 50-fold and enabling 30 sequence-agnostic mutation identification at low (<1%) allele frequencies. Our work sets a new 31 standard for CRISPR-based nucleic acid detection and will enable intelligent and secondary-32 structure-guided target selection while also expanding the range of RNAs available for targeting 33 with Cas13.

34

# 35 Main text

36 The RNA-targeting CRISPR effector protein Cas13 holds tremendous promise for numerous

37 applications, such as RNA targeting, detection, editing, and imaging<sup>1–5,7,10</sup>. Cas13 is activated by

38 the hybridization of a CRISPR RNA (crRNA) spacer sequence to a complementary region in a

- 39 target RNA (the protospacer)<sup>7,11</sup>. Once activated, Cas13 cleaves both the target RNA (*cis*
- 40 cleavage) and other RNAs in solution (*trans* cleavage)<sup>2,3,7,9</sup>. However, the biophysical process
- 41 by which the Cas13-crRNA complex binds to and is activated by a target RNA is poorly
- 42 understood.
- 43 Understanding the mechanism of Cas13 activation would solve several key challenges. First,
- 44 even with perfect complementarity between crRNA and protospacer, Cas13 activity levels can
- 45 vary by several orders of magnitude<sup>12–14</sup>. While the specifics of the crRNA and target
- 46 sequences—including spacer length, nucleotide sequence, and crRNA/protospacer
- 47 mismatches—are known to affect Cas13 activity, much of this variation remains unaccounted
- 48 for<sup>12–14</sup>. RNA secondary structure is an intriguing candidate to explain this variation, since unlike
- 49 the CRISPR effector proteins Cas9 and Cas12, Cas13 is believed to be incapable of unwinding
- 50 structured targets<sup>11,15</sup>. Models including only sequence effects while excluding structural effects
- 51 have had success with a binary classification of active/inactive crRNAs, but have not been able
- 52 to solve the regression problem of quantitatively predicting Cas13 activity from the crRNA
- 53 sequence<sup>12,13,16</sup>. Second, although Cas13 activation requires crRNA/protospacer
- 54 complementarity, Cas13 is frequently activated to a similar or even greater degree in the
- 55 presence of single mismatches<sup>17,18</sup>. We hypothesized that these two poorly understood
- 56 characteristics of Cas13 could be addressed by studying the activation of Cas13 in more detail
- 57 using structured RNAs as a model system.

58 RNA molecules form intramolecular base pairs (secondary structures) that compete with

- 59 intermolecular RNA-RNA interactions. We sought to explore how this competition affects the
- 60 crRNA-target interactions underlying Cas13 activation. RNA secondary structure has long been
- 61 suspected to influence Cas13 activity due to its competition with the crRNA for target base
- 62 pairing, but this has been challenging to study in isolation, as primary sequence and secondary
- 63 structure are inextricably linked<sup>19</sup>. Abudayyeh & Gootenberg *et al.* showed a small but
- 64 significant negative correlation between secondary structure and Cas13a activity for crRNAs
- 65 targeting different regions of four genes in HEK293FT cells<sup>2</sup>. By tiling the long non-coding RNA
- 66 Xist in HEK293T cells, Bandaru et al. showed that crRNAs are typically more active when
- 67 targeting single-stranded regions than double-stranded regions<sup>20</sup>. By examining different
- regions of natural RNAs, prior studies have been unable to distinguish between effects on
- 69 Cas13 caused by changes to target structure, and those caused by changes to target
- sequence. Thus, the degree to which the RNA structure affects crRNA-target binding and
- 71 Cas13 activity remains unclear.

## 72 RNA structure reduces LwaCas13a activity

73 To isolate the effect of RNA structure on Cas13 activity, we designed an ssRNA protospacer

- 74 sequence to which we could add variable amounts of secondary structure by either
- intramolecular extension of an RNA hairpin, or by adding external complementary RNA or DNA
- oligonucleotides of different lengths, termed "occluders" (Fig. 1A). We designed the protospacer
- to reflect viral sequence diversity and to have minimal secondary structure in the absence of
- these modifications (see Methods). We tested the ability of these structured protospacers to
- 79 activate LwaCas13a using cleavage of a quenched fluorescent RNA to report activity. Increased
- 80 secondary structure decreased Cas13 activity across all three assay conditions (Fig. 1A). We
- 81 next quantified Cas13 activity by fitting the fluorescence curves to effectively first-order reaction
- 82 equations, defining activity as the rate of reporter cleavage (hr<sup>-1</sup>), a proxy for the concentration
- of active Cas13 in the system (see Methods). We observed a high degree of correlation
- between the three types of target occlusion (Fig. 1B). Cas13 activity varied by an order of
- 85 magnitude for the same sequence with different amounts of target occlusion (Fig. 1C).

# 86 Activity reduction is quantitatively explained by a kinetic strand

### 87 displacement model

- 88 An equilibrium model based on the free energy of each target RNA (see Methods) failed to
- 89 quantitatively account for the degree of structure-mediated Cas13 activity reduction (Fig. 1C
- 90 light green dotted line). Labeling the free energy of the target-occluder complex by  $\Delta G_{u}$ , the
- 91 disagreement between the large difference in thermodynamic drives ( $exp(-\beta\Delta G_u)$ ) ranges over
- 92 30 orders of magnitude) and the smaller difference in activities (ranging over 2 orders of
- 93 magnitude) cannot be explained by an equilibrium RNA-RNA hybridization framework. Given
- 84 known free energies of RNA-RNA binding<sup>21</sup>, the system temperature would have to be  $\sim$ 7500K
- to match an equilibrium model to the measured Cas13 activity reduction.
- 96 We next sought to find a suitable alternative framework to explain the measured activity levels;
- 97 a strand displacement model presents one such framework<sup>22</sup>. In this model, after initial binding
- 98 to the target, the crRNA and occluding strand compete through a random-walk-like process until
- 99 either the occluding strand is fully displaced or the crRNA-Cas13 complex dissociates from the
- target RNA<sup>23,24</sup> (Fig. 1D). We hypothesized that strand displacement must occur for Cas13 to
- 101 bind structured RNA.
- In our model, Cas13 first binds non-specifically to a region of RNA<sup>15</sup> and then performs a local 102 103 search for a sequence complementary to its bound crRNA. If Cas13 is not activated within a 104 given time t<sub>dwell</sub> (i.e. it does not fully bind to a protospacer sequence complementary to its 105 crRNA) it dissociates from the RNA and repeats the search process. This sequence of events is 106 analogous to the process by which enzymes such as the E. coli lac repressor search for their binding site on DNA<sup>25,26</sup>. However, the strand displacement model predicts that as secondary 107 structure length increases, the probability of Cas13 completing the strand displacement reaction 108 109 within the time t<sub>dwell</sub> decreases, leading to a proportional decrease in Cas13 activity. This model 110 fits our measured results with a value of t<sub>dwell</sub> equivalent to 100 steps of a strand displacement 111 reaction ( $\sim 2 \times 10^{-5} s$ ), in good agreement with direct measurements of typical dwell times for DNA-binding proteins<sup>25</sup> (Fig. 1C dark green dotted line; see Methods). 112

#### A massively multiplexed assay reveals structure effects are sequence 113 independent 114

115 To probe the limits of the strand displacement model, we used a massively multiplexed assay to

116 explore a broad range of target structure conditions for multiple sequences. Our assay uses

- 117 DNA oligos to create secondary structure at defined positions in the target, having previously
- 118 validated their effect as a proxy for RNA structure (Fig. 1B, 2A). We designed a single 1kb-long
- RNA molecule with minimal internal secondary structure<sup>27</sup> (Extended Data Fig. 1A-C); a 119
- 120 NUPACK prediction estimates its minimum free energy due to intramolecular contacts to be ~-6
- kcal/mol, on par with random 35-nt-long RNA sequences<sup>28</sup>. Our target RNA is divided into two 121
- 122 control blocks (one at each end of the molecule) and eight experimental blocks, allowing for
- 123 efficient multiplexing<sup>12</sup>. Each block contains a 28-nt-long protospacer flanked by two 34-nt buffer
- 124 regions. For occlusion, we used DNA oligos of lengths 10, 14, 21, and 28 nucleotides (nt) in 3-
- 125 nt-spaced tilings, for a total of 4.608 simultaneous conditions. We tested these conditions in
- 126 parallel using a microfluidic chip-based assay<sup>6</sup>. Summaries of the resulting dataset are shown in
- 127 Fig. 2B and Extended Data Figs. 2 and 3.

128 Our results demonstrate that the reduction in Cas13 activity as a result of target structure is

- 129 relatively sequence-independent, with the 8 experimental target blocks showing similar activity
- 130 profiles in spite of large variation in absolute activity across these blocks (Fig. 2C. Extended
- 131 Data Fig. 2). While 10- and 14-nt-long occluders had negligible effects on Cas13 activity, 21-
- 132 and 28-mers had a strong effect. Consistent with earlier results, occluders binding to more of
- 133 the protospacer typically led to a greater activity reduction. In agreement with our dwell time
- 134 model and in contrast to other strand displacement systems<sup>24,29,30</sup>, the presence or absence of
- 135 toeholds (unoccluded RNA) had little effect on Cas13 activity (Extended Data Figs. 4E-F).

136 The data also revealed an unexpected asymmetry among the effect of occluders on Cas13, in

- 137 which occluders binding to the 5' end of the protospacer had a larger effect on Cas13 activity
- 138 than occluders binding the same number of nucleotides at the 3' end (Fig. 2D, Extended Data
- 139 Fig. 4A-D). We accounted for the asymmetry in our model by adding a second parameter to the
- 140 model described above, creating a differential in t<sub>dwell</sub> depending on whether or not the 5' end of
- 141 the protospacer is occluded. We found that our revised dwell time model was able to
- 142 quantitatively capture the effects of secondary structure on Cas13 activity (Fig. 2D, E).

#### Structure occluding the region 3' of the protospacer inhibits Cas13 143

- 144 Surprisingly, when occluders are placed directly 3' to the protospacer, Cas13 activity is potently 145 inhibited. This second regime of inhibition exists across all tested crRNAs, and inhibition is 146 strong for both 21mer and 28mer occluders (Fig. 2C). The non-monotonicity of this second 147 activity trough cannot be explained using a strand displacement model, implying this drop in 148 activity is not due to a reduction in crRNA-target binding. 149

150 We sought to probe whether this effect on Cas13 activity is a result of competitive or allosteric

- 151 inhibition. For the protospacer occluder, but not for the 3' occluder, we observe full rescue of
- 152 Cas13 activity when the crRNA and occluder are added at the same time. Increasing the

153 concentrations of 3' occluder does not increase their inhibitory effect (Fig. 2F). These results

- 154 indicate that the activity reduction conferred by occluding the region 3' to the protospacer is
- 155 likely the result of an allosteric effect.

### 156 Strand displacement enhances mismatch detection

157 We hypothesized that the insights from our strand displacement model could help us 158 dramatically improve the specificity of Cas13-based RNA detection assays. Past work has shown that secondary structure can make nucleic acid hybridization more sensitive to 159 160 mismatches, both in CRISPR-based approaches and in other assays<sup>31–34</sup>; we hypothesized that 161 given the kinetic nature of our assays, we could take advantage of the kinetic nature of strand 162 displacement to similar ends without the necessity of a binding toehold required in other 163 approaches. With no internal structure, even a mismatched crRNA is expected to bind strongly 164 to the target; however, an occluding strand provides an extra kinetic barrier that is less likely to 165 be overcome by a mismatched crRNA than by one that is perfectly complementary, thus 166 improving specificity given the short dwell time of inactive Cas13 on the RNA (Fig. 3A). A 167 differential-equation-based strand displacement model inspired by Ref.<sup>35</sup> supported this 168 hypothesis, revealing that even when both perfectly-complementary and mismatched invader 169 strands bind strongly to the target in equilibrium, in the presence of an occluding oligo, the 170 mismatched invader takes much longer to do so than the perfectly-matched invader (Fig. 3B).

- 171 We tested Cas13's ability to differentiate between a perfectly complementary target and one
- 172 containing a single A>U mutation at position 5 of the protospacer with and without secondary
- structure occlusion. We tested both occluding the target (as we did previously) and occluding
- the crRNA, reasoning that strand displacement would in either case result in improved
- 175 mismatch discrimination. The presence of a crRNA occluder resulted in a ~50x enhancement of
- 176 specificity compared to the no-occluder condition, measured as the maximum ratio of
- 177 WT/mismatch fluorescence (Fig. 3C). This effect was robust to large variations in concentration,
- and was maximized at higher ~1-100 nM target input concentrations (Fig. 3D, Extended DataFig. 7B).
- 180 After testing target-occluding and crRNA-occluding oligos, and combinations of both (Fig. 3E,
- 181 Extended Data Fig. 5), we decided to focus on crRNA occluders. These provide the added
- 182 benefit of improving mismatch detection regardless of the identity of the mismatched target, and
- 183 they do not require any sample manipulation prior to detection.
- 184 We proceeded to explore the generality of Cas13 specificity enhancement by occluders. Using 3
- different targets, 4 positions on each crRNA, and 2 mutations for each position, we tested how
- 186 well a mismatch could be detected by Cas13 with and without a crRNA-occluder. We measured
- 187 Cas13 activity on the perfectly matched and mismatched targets, finding that although only
- 188 74/96 mismatches (77%) led to any activity reduction in the absence of a crRNA-occluder, all 96
- 189 (100%) led to a reduction with the occluder (Fig. 4A-B, Extended Data Fig. 6). Error was thus
- reduced from 23% to <1%. We found that without occlusion, the ability of Cas13 to distinguish
- between a perfectly-matched target and a mismatched target is not guaranteed for any crRNA,
- 192 for any of the mismatch positions we tested, nor for any specific type of mutation (with the

- exception of G>U, which has the fewest data points). However, using occluded crRNAs, Cas13
- can distinguish perfectly-matched from mismatched targets in a position- and mutation-
- 195 independent manner.
- 196 We performed a dilution series of perfectly matched target RNA and mixed it with background
- 197 RNA containing a single mismatch. Without occlusion, the perfectly matched target was
- detected at allele frequencies of 11% (a 1:8 ratio) but not 6% (1:16); with occlusion, it was
- 199 detected at frequencies as low as 0.4% (1:256) for all tested targets, an order-of-magnitude
- sensitivity enhancement (Fig. 4C, Extended Data Fig. 7A).
- To explore nucleotide-specific effects, we mutated the crRNA and target sequences to all possible nucleotides at position 5 of the spacer. When testing all pairwise crRNA/target
- 202 possible nucleotides at position 5 of the spacer. When testing all pairwise crRNA/target
- 203 combinations, we observed extensive cross-reactivity between crRNAs and targets in the
- absence of occlusion. With occlusion, we observed specific detection of each target only by its perfect-match crRNA (Fig. 4D, Extended Data Fig. 8). Occluded crRNAs can thus discriminate
- all four possible alleles at a given position, demonstrating the exquisite specificity of the
- 207 approach.
- 208 To test the efficacy of our occlusion strategy in a real-world detection scenario, we designed
- 209 crRNAs targeting a single locus in the SARS-CoV-2 spike gene containing lineage-specific
- 210 mutations in adjacent codons. In this way, it is theoretically possible to distinguish Delta and
- 211 Omicron strains with only a single crRNA designed to identify each strain. Targeting
- 212 polymorphic sequences with conventional Cas13 detection schemes is challenging, as crRNAs
- 213 targeting a given mutation are likely to be affected by nearby mutations, making it nearly
- 214 impossible to distinguish variants from one another. We found that with crRNA occlusion, but
- not in its absence, targeting this single locus leads to specific detection of the target strain in
- both synthetic RNA (Fig. 4E, Extended Data Fig. 9) and amplified viral seedstocks (Fig. 4F)
- 217 using a simple fluorescence readout.

### 218 Discussion

- 219 In this study, we quantified the reduction in Cas13 activity due to target RNA occlusion, showed
- that our results are quantitatively consistent with a strand-displacement-based model of Cas13
- activation, and used this model to improve Cas13's mismatch specificity by an order of
- 222 magnitude.
- 223 Importantly, our method is simple to implement experimentally as it merely requires annealing a
- DNA oligo to the crRNA prior to mixing with the target RNA. Unlike in other studies leveraging
- 225 RNA secondary structure to improve hybridization specificity, no toehold is required, enabling
- trivial construction of the DNA oligo: all crRNA occluders used occluded the entire crRNA
- spacer. The main downside of using crRNA-occluder duplexes to improve mismatch detection is
- a reduction in Cas13 activity. To counteract this, steps can be taken to increase overall activity
- such as increasing concentrations of Cas13, reporter, or target RNA.
- 230 While our experimental study focused on one ortholog of Cas13, LwaCas13a, our results are of 231 interest to many Cas13-based methods. Future work will explore to what extent the mechanism

- of activation described here is generic or specific to this ortholog. Furthermore, significant
- 233 questions remain regarding the mechanism by which secondary structure 3' to the protospacer
- leads to an allosteric reduction in Cas13 activity. For instance, extended complementarity
- between the target and the structural portion of the crRNA (known as the the tag-antitag effect)
- inhibits Cas13 activity by preventing the proper formation of the active site<sup>36,37</sup>. Future structural
- and biochemical characterization will reveal whether the inhibitory region we have discovered
- affects Cas13 by a similar or a different mechanism.
- 239 Due to its negligible cost, ease of implementation, orthogonality with existing approaches, and
- 240 marked improvement in detection specificity, we anticipate the adoption of our crRNA occlusion
- 241 approach into a wide range of Cas13-based techniques. Furthermore, our proposed strand
- displacement model addresses a long-standing paradox, namely how a purportedly ssRNA-
- 243 specific enzyme is able to robustly target RNAs in cellular environments where RNA structure is
- 244 ubiquitous.

# 245 Methods

### 246 General reagents

- 247 Oligonucleotides were ordered from Integrated DNA Technologies (IDT). Unless otherwise
- 248 noted, chemical reagents were ordered from Sigma. Oligonucleotide sequences are listed in
- 249 Supplementary File 1.
- 250

### 251 crRNA design

- Most crRNA spacers were designed to be perfectly complementary to their 28 nucleotide (nt)
- 253 protospacer region. For SARS-CoV-2 targeting sequences, a single synthetic mismatch was
- inserted at position 5 to improve baseline specificity. Spacers were appended to the 3' end of
- the consensus LwaCas13a direct repeat sequence
- 256 (AGACUACCCCAAAAACGAAGGGGACUAAAAC) and ordered from IDT as Alt-R guide RNA.
- 257

### 258 Target design

- For our tiling experiment, we designed an RNA molecule of length 961 nucleotides with minimal internal secondary structure. After an initial G nucleotide, the molecule is comprised of 10 target blocks, each defined by a 34-nt buffer region, a 28-nt protospacer, and a second 34-nt buffer
- region. We sought to have as many as possible of the 28-nt protospacers resemble natural sequences.
- 264
- To this end, we started with a set of 18,508 28-nt-long protospacer sequences compiled from
- the ADAPT dataset, which has a sequence composition representative of viral diversity<sup>12</sup>. 3,391
- sequences with poly-A, poly-C, or poly-U stretches  $\geq$ 5 nts or poly-G stretches  $\geq$ 4 nts were
- removed. Of the remaining sequences, we removed 6,459 which had low average measured
- 269 activity, defined as  $\langle out_log_k \rangle \leq -2$  (on a logarithmic scale from -4 to 0, where 0 is high
- activity) using the activity definitions and measurements from Ref<sup>12</sup>. We used LandscapeFold<sup>38</sup>
- 271 with parameter m = 2 (*m* represents the minimum allowed stem length), disallowing

pseudoknots, to predict the structure landscapes of the remaining sequences. LandscapeFold predicted that 1,287 of these remaining sequences had extremely low intramolecular structure, defined as all nucleotides having a  $\geq$ 40% probability of being unpaired in equilibrium.

275

276 We then aimed to find a set of these sequences that were all dissimilar from one another. First, 277 given a sequence s, we found all those sequences with a Hamming distance  $\leq 15$  from s. (A pair 278 of sequences with a Hamming distance of h share all but h nucleotides). Of these sequences, 279 we chose the one with the least secondary structure to keep and removed the others, with total amount of secondary structure quantified as  $\Sigma_n p_n$  where the sum is over nucleotides and  $p_n$  is 280 281 the probability of the nucleotide being paired in equilibrium. We repeated this step for each 282 sequence s we had not already removed. Next, we used a Smith-Waterman alignment<sup>39</sup> to 283 check for sequence similarity in non-identical nucleotide positions, repeating the same 284 procedure as above but, instead of Hamming distance, using the criteria of an alignment score 285  $\geq$ 9 to define sequence similarity, where the alignment score parameters were (+1, -2, -2) for 286 (match, mismatch, gap). This procedure resulted in a set of 20 sequences all distant from one 287 another in sequence space.

288

289 Finally, although we had ensured each of these sequences had low secondary structure, we 290 wanted to minimize binding between these sequences. For each pair of sequences, we used 291 LandscapeFold with parameter m = 3 to predict the structure of the two strands, allowing for 292 both intra- and inter-molecular interactions. We defined two sequences to be incompatible if the 293 resulting prediction had any nucleotide on either sequence with a <40% probability of being 294 unpaired in equilibrium. We exhaustively enumerated the possible ordered sets of mutually 295 compatible sequences, finding 60 ordered sets of 5 mutually compatible sequences, and no set 296 of 6 mutually compatible sequences. Of these 60 sets, we chose the one with the least 297 structure. Under the assumption that entropic loop closure costs will create a barrier to non-298 neighbor sequence pairing (i.e. that each sequence is less likely to pair to a sequence that isn't 299 its neighbor), we defined structure here as the sum, over the 4 pairs of neighboring sequences, 300 of the maximum probability of a nucleotide being paired in that sequence pair. Thus, we arrived 301 at a set of 5 distinct sequences from ADAPT with minimal intra- and inter-molecular structure. 302 These 5 sequences became the protospacer sequences corresponding to crRNAs 2, 4, 6, 8, 9. 303

304 The other 5 protospacer sequences as well as the buffer regions were compiled out of 64 16-ntlong DNA sequences with minimal internal structure from Shortreed et al.<sup>27</sup>. Seven of these 305 306 sequences with poly-A or poly-T stretches  $\geq 5$  nts were removed. Concatenating these sequences resulted in a long sequence with minimal structure, which we used to construct the 307 308 rest of the 961 nt-long RNA target. We used NUPACK 3<sup>40</sup> to predict the structure of the resulting 309 target, finding various predicted stems. We then made individual point mutations by hand in the 310 buffer regions and non-ADAPT-derived protospacers to minimize the probabilities of the 311 resulting stems (ensuring NUPACK predicted no base pair forming with probability  $\geq$ 60% in 312 equilibrium), as well as to remove sequence similarity between targets (ensuring there are no 313 more than 5 identical consecutive nucleotides between the protospacer regions, no more than 6 314 identical consecutive nucleotides between two regions spanning a protospacer and a buffer, 315 and no more than 8 identical consecutive nucleotides in buffer regions).

#### 316

Finally, we created a "shuffled" version of the target, placing the target blocks (numbered 1 - 10from 5' to 3' in the original target) in the following order: 1, 4, 2, 7, 5, 3, 9, 6, 8, 10. We ensured NUPACK 3 did not predict any base pair forming with probability  $\geq 60\%$  in the resulting

- 320 sequence.
- 321

For our initial experiments (Fig. 1) we filtered the ADAPT dataset sequences to those with high activity (<out\_log\_k> -2) and perfect complementarity between target and crRNA in the ADAPT dataset. We then measured LandscapeFold's prediction of the secondary structure of each candidate protospacer sequence. For each nucleotide, we calculated the total probability that the nucleotide is unpaired in equilibrium. The protospacer chosen had each nucleotide with at least a 92% probability of being unpaired in equilibrium.

328

#### 329 RNA preparation (including structured targets)

330 RNA targets were ordered from Integrated DNA Technologies as DNA containing a T7 promoter 331 sequence. Targets were then transcribed to RNA using the T7 HiScribe High Yield RNA 332 Synthesis Kit in 55  $\mu$ L reactions (New England Biolabs) with a 16h incubation step at 37 °C and 333 purified with 1.8X volume AMPure XP beads (Beckman Coulter) with the addition of 1.6X 334 isopropanol, then eluted into 20  $\mu$ L of nuclease free (NF) water. All RNAs were then quantified 335 using a NanoDrop One (Thermo Fisher Scientific) or Biotek Take3Trio (Agilent) then stored in 336 nuclease free (NF) water at -80 °C for later use.

337

338 Occluded targets and crRNAs were prepared by mixing DNA/RNA oligo occluders with target 339 RNA or crRNA in 60mM KCI (Invitrogen) in NF water at a ratio of 2:1 (BioMark assays) or 10:1 340 (plate reader assays) and put through an annealing cycle consisting of a high-temperature 341 melting step at 85 °C for three minutes followed by gradual cooling to 10 °C at 0.1 °C/sec 342 followed by cooling to 4 °C. For massively multiplexed assays, occluders were first pooled by 343 length and start position within the target block (see Extended Data Fig. 1D) such that each 344 resulting oligo pool contained all 8 n-mers binding to a given position within each of the 345 experimental target blocks. Targets and crRNAs were then used for detection assays 346 immediately as described below.

347

348 Targets were input into detection reactions at various concentrations. For experiments in Fig. 1, 349 targets were input at 7.5 x  $10^8$  copies/µL (cp/µL). For experiments in Fig. 2a-e, targets were input at 8 x 10<sup>8</sup> cp/µL. For Fig. 2f, targets were input at 5 x 10<sup>9</sup> cp/µL. For experiments in Fig. 3 350 351 and 4a-b, input concentrations of 7.5 x  $10^9$  cp/µL were used unless otherwise noted in figure 352 caption. For Fig. 4c, targets were spiked in at the indicated allele frequency into a background of 353  $5 \times 10^{10}$  cp/µL (for occluded conditions) or  $5 \times 10^{8}$  cp/µL (for non-occluded conditions). For Fig. 4d, occluded conditions used an input concentration of 5 x  $10^{10}$  cp/µL while non-occluded 354 355 conditions used a concentration of 5 x  $10^8$  cp/µL.

356

#### 357 Viral seedstock amplification

Extracted viral genomic RNA samples were acquired from BEI Resources (hCoV-19/USA/MD HP05285/2021 (B.1.617.2) Delta, hCoV-19/USA/GA-EHC-2811C/2021 (B.1.1.529) Omicron).

- 360 Amplification reactions using 2uL of viral RNA as the input (50uL total reaction volume) were
- 361 performed using the Qiagen One-Step RT-PCR kit according to the manufacturer's
- 362 specifications. The forward primer contained a T7 promoter sequence; 4uL of the RT-PCR
- 363 products were used as direct input for T7 transcription (see "RNA preparation" section above).
- 364

#### 365 Cas13 detection assays

- 366 Standard bulk detection assays were performed by mixing target RNA at a ratio of 10% v/v with
- 367 90% Cas13 detection mix. The detection mix consisted of 1X RNA Detection Buffer (20 mM 368 HEPES pH 8.0, 54 mM KCl, 3.5% PEG-8000 in NF water), supplemented with 45nM purified
- 369 LwaCas13a (Genscript, stored in 100 mM Tris HCl pH 7.5 and 1 mM DTT), 1 U/µL murine
- 370 RNAse Inhibitor (New England Biolabs), 62.5 nM fluorescent reporter
- 371 (/5FAM/rUrUrUrUrU/IABkFQ/; IDT), 22.5 nM processed crRNA (IDT), and 14 mM MgOAc. In
- 372 experiments using crRNA occlusion, crRNAs were pre-annealed to DNA occluders as described
- 373 above, and used at a final concentration of 22.5 nM. 15 µL reactions were loaded in technical
- 374 triplicate onto a Greiner 384 well clear-bottom microplate (item no. 788096) and measured on
- 375 an Agilent BioTek Cytation 5 microplate reader for 3 hours with excitation at 485 nm and
- 376 detection at 528 nm every five minutes.
- 377
- 378 For tiling assays, Standard Biotools genotyping IFC (192.24 format) was used in a BioMark HD
- 379 for multiplexed detection. Assay mix (10% of final reaction volume) contained 1X Assay 380
- Detection Mix (Standard Biotools) supplemented with 100 nM crRNA, 100 nM LwaCas13a
- 381 (Genscript, stored in 100 mM Tris HCl pH 7.5 and 1 mM DTT). Sample mix (90% of final 382 reaction volume) contained 1X Sample Buffer (44 mM Tris-HCl pH 7.5, 5.6 mM NaCl, 10 mM
- 383 MqCl, 1.1 mM DTT, 1.1% w/v PEG-8000), supplemented with murine RNAse Inhibitor (1 U/µL,
- 384 NEB), fluorescent reporter (500 nM, IDT), 1x ROX reference dye (used for normalization of
- 385 random fluctuations in fluorescence between chambers) (Standard Biotools), 1X GE Buffer
- 386 (Standard Biotools), 20mM KCI, and occluded RNA target (9 x 10<sup>8</sup> cp/µL).
- 387

388 Sample volumes of 3.5µL and assay volumes of 3.5µL, in addition to appropriate volumes of 389 Control Line Fluid, Actuation Fluid, and Pressure Fluid (Standard Biotools), were loaded onto

- 192.24 genotyping IFC chip (Standard Biotools). Chips were then placed into the Fluidigm 390
- 391 Controller and loaded and mixed using the Load Mix 192.24 GE script (Standard Biotools).
- 392 After mixing, reactions were run on BioMark HD at 37°C for 8 hours with measurements taken in
- 393 the fluorescein amidite (FAM) and the carboxyrhodamine (ROX) channels every five minutes.
- 394 Normalized and background-subtracted fluorescence for a given time point was calculated as
- 395 (FAM - FAM\_background) / (ROX - ROX\_background) where FAM\_background and
- 396 ROX background are the FAM and ROX background measurements.
- 397

#### 398 **Activity fits**

- 399 Fluorescence curves were converted to activity scores by fitting the curves to effectively first-
- 400 order reactions. With a certain amount of active Cas13, the concentration of uncleaved reporter
- 401 is expected to decrease exponentially according to the reaction
- 402  $E^{\star} + II \rightarrow E^{\star} + P$

403 where  $E^*$  is the concentration of active Cas13, *U* the concentration of uncleaved reporter, and *P* 404 the concentration of cleaved reporter RNA. Labeling the (second-order) rate constant of this 405 reaction as *r*, the concentration of *P* changes over time according to

406  $P(t) = P_{tot} - (P_{tot} - P(0))e^{-rEt}.$ 

407 Assuming that  $E^*$  is constant over time, we define an activity score  $v = rE^*$ , which is an 408 effective first-order rate constant (with units of inverse time). Assuming that r is constant across 409 our assays, the activity score v is thus a proxy for the amount of active Cas13. Given measured 410 P(0), we find best-fit values of P<sub>tot</sub> and v to fit the kinetic curves. To account for curves very far 411 from saturation (e.g. NTC data) we set a minimum value of P<sub>tot</sub> based on data from saturating 412 and near-saturating curves. For tiling data, we fit the first 50 timepoints (~4 hours) to discount 413 occasional apparent noise appearing at very late times.

414

415 Some assays including crRNA occluders displayed fluorescence curves that did not fit well to

this effective first-order reaction (Extended Data Figs. 5, 6, 7, 8) indicating a need to relax the

417 assumption that *A* is constant over time. For data shown in Extended Data Figs. 7A and 8, we

418 neglected the first several timepoints measured (15 and 10 timepoints, respectively,

419 corresponding to 75 and 50 min) since we found that doing so increased the goodness of fit. For
420 other assays using crRNA occluders—and those assays being directly compared to them (i.e.
421 those data shown in Extended Data Figs. 5, 6, 7B)---we fit the data to a series of two effective

422 first-order reactions:

423

#### $U \rightarrow I \rightarrow P$

424 Labeling the first-order rate constant of each reaction  $k_1$  and  $k_2$ , this model yields

425

$$P(t) = P_{tot} - (P_{tot} - P(0)) \frac{k_1 e^{-k_2 t} - k_2 e^{-k_1 t}}{k_1 - k_2}.$$

426 We define activity in this case as  $v = (1 / k_1 + 1 / k_2)^{-1}$ , verifying that if the equation is first order

427 (i.e.  $k_1 \gg k_2$ ), our previous definition of activity is recovered. We indeed find negligible change in 428 the measured activities for no-occluder control (NOC) fluorescence curves between these two 429 fits.

430

### 431 Tiling experiment activity correction

Each experimental condition in the tiling experiment was performed with four replicates: two
technical replicates for each of the two "shuffles" of the 961-nt-long target sequence. While we
found excellent agreement between technical replicates (Extended Data Fig. 3B), there was
some variation between the results from each of the two target "shuffles" (Extended Data Fig.
3H). This variation was apparent in and correlated between the positive controls of crRNAs 1
and 10, which were always unoccluded (Extended Data Fig. 3C, H). We hypothesized that this
variability results from small variations in target concentration in our different samples.

439

To correct for such variations, we sought to quantify how much each RNA sample differed from
the mean. The RNA samples were divided into 192 sample conditions, each corresponding to a
single oligo pool and one target shuffling (see "RNA preparation" section, Extended Data Fig.
1C). Each of these 192 conditions was mixed with 24 assay conditions, corresponding to 8

444 experimental crRNAs, 2 positive control crRNAs, one non-targeting crRNA, one no-crRNA

445 control (NPC) and two replicates of each.

#### 446

447 For the two replicates of crRNAs 1 and 10 (i.e. for each of the 4 positive control assay 448 conditions out of the 24 total assays), we considered the activity fit from the mean fluorescence 449 curve, averaging over the 192 sample conditions (Extended Data Fig. 3B, black dashed lines). 450 Then, for each sample condition, and for each positive control, we calculated the ratio of the 451 control's activity to its mean activity across all samples, obtaining an estimate of the degree to 452 which that sample's concentration deviated from the mean. We defined a correction factor as 453 the average of these ratios. We then divided all activities measured for that sample by this correction. This activity correction not only decreased the spread of activities measured by the 454 455 positive controls (Extended Data Fig. 3D-G) but also decreased the variance between 456 measurements made on the two target "shuffles" (Extended Data Fig. 3H).

457

#### 458 **Mismatch discrimination**

In Fig. 3D we show the results of one simple metric by which to measure mismatch 459

- 460 discrimination: the maximum of the ratio  $F_{PM}$  /  $F_{MM}$ , where  $F_{PM}$  is the average fluorescence
- 461 measurement across the perfectly matched conditions, and F<sub>MM</sub> across the mismatched
- 462 conditions. To account for the arbitrary offset of fluorescence, the minimum fluorescence
- 463 measured across the NTC experiments was subtracted from both F<sub>PM</sub> and F<sub>MM</sub> before taking the
- 464 ratio. Since  $F_{PM}$  and  $F_{MM}$  are each measured as the average across three replicates, each
- 465 measurement of  $F_{PM}$  and  $F_{MM}$  has an inherent error,  $\sigma_{PM}$  and  $\sigma_{MM}$  (respectively), which we 466 quantify as the standard deviation across the three replicates at each timepoint. The error of the
- 467 ratio is then propagated as

$$\frac{\sqrt{(F_{PM}\sigma_{MM})^2 + (F_{MM}\sigma_{PM})^2}}{(F_{MM})^2}$$

468 469

470 Elsewhere (Fig. 3E, Figs. 4A, B) we measure mismatch discrimination by a metric that relies on 471 activity fits:  $\log_2(\nu_{PM} / \nu_{MM})$ . Thus, a mismatch discrimination of 1 indicates that the measured 472 activity of the perfectly matched conditions is twice that of the mismatched conditions, and a 473 discrimination of 3 indicates the perfectly matched conditions had eight-fold higher activity than 474 the mismatched conditions. We used a similar measure for discrimination at low allele

475 frequencies (Fig. 4C), defining activity discrimination as  $\log_2(\nu_f / \nu_0)$  where  $\nu_f$  is the activity

476 measured at allele frequency f, and  $v_0$  the activity measured in the background alone.

477

#### 478 Equilibrium model

- 479 In an equilibrium model of crRNA-target hybridization, the target has a free energy  $\Delta G_{\mu}$  that
- 480 depends on occluder conditions, and the crRNA-target complex has free energy independent of
- 481 occluder. A kinetic model describing crRNA-target hybridization would be 482

$$T + E \leftrightarrow E'$$

- 483 with the ratio of forward to reverse rate constants determined by the free energy difference
- 484 between the target-unbound and target-bound states. Assuming that the target is in excess, we
- 485 define an unknown parameter  $\alpha_1$  such that at steady state, 486

$$E^{\star} = \frac{E_{tot}}{1 + e^{-\beta(\Delta G_u - \alpha_1)}}$$

487 where  $\beta = 1 / k_B T$ , with k<sub>B</sub> denoting Boltzmann's constant and T temperature (measured in 488 Kelvin), and  $E_{tot} = E + E^*$  is the total concentration of Cas13 enzyme in the system (measured in 489 Molar).

490

493

495

498

491 Our measured activity, v, is proportional to E<sup>\*</sup> as defined previously:  $v = rE^*$ . Considering v on a 492 logarithmic scale (as it is plotted in Fig. 1C) yields

$$log (v) - \alpha_2 = -log \left(1 + e^{-\beta(\Delta G_u - \alpha_1)}\right)$$

494 with  $\alpha_2 = log (rE_{tot})$ .

496 The two parameters  $q_1$  and  $q_2$  therefore only shift the curve relating log (v) to  $\Delta G_{u_1}$ , but cannot 497 alter the shape of the curve itself.

499 That the relationship between log(v) and  $\Delta G_{\mu}$  is approximately linear can be seen by 500 recognizing that if

501

503

506

 $e^{-\beta(\Delta G_u - \alpha_1)} \gg 1,$ 

502 as is typical in our system, we have

 $log(\nu) \approx \beta \Delta G_u - (\alpha_1 - \alpha_2),$ 

504 indicating that there is in essence only one free parameter in the system that shifts the line but 505 cannot change its slope. The slope is set by the temperature of the system.

#### 507 ODE model

508 We compared the binding rate of an invading strand to a target with and without an occluder in a model based on Srinivas & Oulridge et al. (2013) and Irmisch et al. (2020)<sup>29,35</sup>. The model 509 510 consists of a set of ordinary differential equations (ODEs) representing the flux into and out of 511 states, where each state is defined by the set of base pairs formed. Transitions between states 512 occur at a rate ke<sup> $\Delta G$ </sup> where  $\Delta G$  is the free energy barrier to the transition (in units of k<sub>B</sub>T where 513  $k_{\rm B}$  is Boltzmann's constant and T is temperature in units of Kelvin) and k is an overall rate 514 constant. An initial state consists of a target strand (bound to an occluding strand in the case 515 where an occluding strand is considered), with an invading strand unbound. Initial binding of the 516 invader strand to the toehold has a free energy barrier of  $\Delta G_a$ . The reverse step has a barrier of 517  $h\Delta G_{R}$  where h is the toehold length and  $\Delta G_{a}$  is the (absolute value of the) typical free energy of 518 an RNA-RNA base pair.

519

520 In the no-occluder case, subsequent forward steps (in which an additional base pair between 521 target and invader forms) have a free energy barrier of 0, while reverse steps have a free 522 energy barrier of  $\Delta G_a$ .

523

524 In the occluder case, the first step of the strand displacement reaction has barrier  $\Delta G_P + \Delta G_S -$ 

525  $(\Delta G_R - \Delta G_D)$ , where we have subtracted  $(\Delta G_R - \Delta G_D)$  from the models on which we base our 526 work to account for the fact that in our system, the invading strand is RNA while the occluding

- 527 strand is DNA;  $\Delta G_D$  is the (absolute value of the) typical free energy of an RNA-DNA base pair.

 $\Delta G_D$ ), while backward steps all have a barrier of  $\Delta G_S$ . The barrier from the final state, in which 529 530 the occluder has fully dissociated, back to the penultimate state, has a barrier of  $\Delta G_D$ .

531

532 Parameters were set following Irmisch *et al.* to:  $\Delta G_a = 18.6$ ;  $\Delta G_B = 2.52$ ;  $\Delta G_s = 7.4$ ;  $\Delta G_p = 3.5$ ;

533  $\Delta G_m = 9.5$  (all in units of k<sub>B</sub>T); and an overall rate constant of  $k = 6 \times 10^7$ /s. We set  $\Delta G_D = 1.2$  to

534 be roughly half of  $\Delta G_{R}$ , and  $\Delta G_{D} = 25$  to be large enough to prevent reassociation on the

535 timescales considered. In Fig. 3C we plot the results of h = 3, b = 27, with a mutation at the first position after the toehold.

536

### 537

#### 538 Strand displacement model

539 In the strand displacement model, non-specific binding of Cas13 to the RNA (independent of 540 RNA sequence) leads to Cas13 activation, and a corresponding decrease in Cas13 dissociation 541 rate, when the crRNA fully binds to the protospacer complement. We denote the typical dwell 542 time of Cas13 on the RNA in the absence of this activation by t<sub>dwell</sub>, the main parameter in the 543 model. Secondary structure affects activity by modulating the probability that a strand 544 displacement reaction completes within this time t<sub>dwell</sub>. We assume that activity is directly 545 proportional to this probability. To estimate this probability, for each occluder, we simulated 10<sup>5</sup> 546 unbiased random walks of length equal to the number of occluded protospacer nucleotides with 547 a reflecting boundary at 0, measuring the number of steps taken to complete the random walk, 548 and therefore the probability of completing the random walk within a desired number of steps. 549 The number of trials chosen leads to errors in our estimate of this probability < 3% in all cases

(determined by the maximum ratio of standard deviation to the mean of our estimate across 10 550 551 replicates of 10<sup>5</sup> random walks).

552

553 To estimate a typical value of t<sub>dwell</sub>, we turn to classic studies of the *E. coli lac* repressor, a DNA-554 binding enzyme which searches for its binding site on the DNA by iteratively binding nonspecifically to the DNA, performing a local search, and dissociating<sup>25,26</sup>. The dissociation rate of 555 556 the lac repressor when non-specifically binding DNA (i.e. the inverse of its dwell time) has been 557 estimated<sup>25</sup> to be 5 x 10<sup>4</sup>/s. This dwell time corresponds to the time it would take for ~100 steps 558 of a strand displacement reaction, where the rate of individual steps has been estimated<sup>35</sup> to be  $6 \times 10^7 \text{ x} \text{ e}^{-2.5/\text{s}} \approx 5 \times 10^6/\text{s}$ . This dwell time varies with ionic concentration (among other 559 560 factors), with dwell time decreasing anywhere from 2-10-fold upon doubling KCI concentration<sup>25</sup>. 561 Given the different conditions used in the plate-reader assays and in the tiling experiments, 562 including different ionic conditions—with the former having ~2.5-fold higher KCI concentrations 563 than the latter—we fit t<sub>dwell</sub> separately for the two experimental methods. We used a dwell time 564 of 100 steps of a strand displacement reaction for the plate-reader assays, and a dwell time of 565 300 steps for the tiling experiments.

566

567 To account for the asymmetry seen in our data (Fig. 2D, Extended Data Fig. 4A-D) we allowed 568 for dwell time to change depending on whether the 5' end of the protospacer was occluded or unoccluded. For the plate reader assays, our final model has a dwell time of 100 steps for those 569 570 cases where the 5' end of the protospacer was occluded, and a dwell time of 200 steps for

571 those cases where it wasn't. For the tiling assays, the dwell times used are 300 and 600 steps,

572 respectively.

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### 663 Author contributions

All authors (O.K., B.B.L., O.R.S.D., A.J.W.t.V., C.M) designed research. B.B.L. and O.R.S.D.
performed experiments. O.K., B.B.L., O.R.S.D., and C.M. performed data analysis. O.K. and
C.M. performed modeling. All authors (O.K., B.B.L., O.R.S.D., A.J.W.t.V., C.M) wrote the article.

### 667 Competing interests

668 C.M. is a co-founder and consultant to Carver Biosciences and holds equity in the company. All
669 authors (O.K., B.B.L., O.R.S.D., A.J.W.t.V., C.M) are co-inventors on a patent application
670 relating to this study.

671

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# 681 Figures

682



683 Fig. 1: RNA structure leads to a reduction in Cas13 activity due to strand displacement.

684 A: Different amounts of structure were introduced into the target via intramolecular structure, 685 RNA oligos, and DNA oligos; resulting fluorescent kinetic curves. Target input concentration: 7.5 x 10<sup>8</sup> copies/µL. "Mut" denotes 28nt of occlusion with nine mismatches to weaken binding. Data 686 687 from n=3 technical replicates are shown (dots). B: Scatter plot comparing the impact of the 688 different occlusion types depicted in (A) on Cas13 activity; x axis: Cas13 activity when occluded 689 by DNA oligos, y axis: Cas13 activity when occluded by intramolecular RNA or RNA oligos. C: 690 Cas13 activity vs. occluder length for RNA occluders is compared to two single-parameter 691 models: an equilibrium model based on crRNA-target hybridization free energies(pink) and a 692 free-energy-independent strand displacement model (green). Effects of changing the single 693 parameter are indicated by arrows. Gray bar is NTC. D: Overview of strand displacement 694 reactions. After initial binding to part of the target (blue), the crRNA (pink) and occluder (red) 695 undergo a random walk process until one or the other is fully displaced. Displacement of the 696 occluder leads to Cas13 activation. Error bars in B and C show standard deviation.



698 Fig. 2: A massively multiplexed assay modulating secondary structure. A: Overview of the 699 multiplexed assay, in which a total of 4,608 simultaneous assays were performed, with oligo 700 occluders of lengths 10, 14, 21, 28 tiling each protospacer region in 3-nt increments. Made 701 using BioRender. B: Overview of the Cas13 activity data from the multiplexed assay. Each data 702 point represents the mean activity resulting from averaging four time series curves (see 703 Methods), normalized to the non-occluded condition; positive and negative controls are not 704 shown (Extended Data Fig 3). C: Heat map showing the degree of activity reduction (darker 705 greens) by each 21mer and 28mer occluder. D: Cumulative histogram of inhibition asymmetry, 706 defined as the ratio of activities when the same numbers of nucleotides are occluded at the 3' 707 vs. 5' ends of the protospacer (see Extended Data Fig. 4C,D). E: Normalized Cas13 activity for 708 21mer (green) and 28mer (purple) occluders with different start positions in the region around 709 the protospacer. Each line represents one crRNA. F: Bar chart showing the inhibitory effect of 710 28mer occluders overlapping the protospacer or the region 3' to the protospacer, at different 711 occluder concentrations and when annealing the occluder before or at the same time as the 712 crRNA. In E and F, error bars show standard deviation.

697



713

714 Fig. 3: Designed secondary structure enhances Cas13 mismatch detection. A: Schematic 715 showing strand displacement by Cas13 with a perfectly-matched target sequence versus one 716 containing a mismatch. B: ODE-based model predictions of crRNA/target hybridization kinetics 717 with and without occlusion and mismatches. C: Kinetic curves showing detection of a target 718 sequence with and without a single A>U mismatch at spacer position 5, in the presence and 719 absence of occlusion. Shaded region shows range of fluorescence measurements for each 720 condition across replicates. D: Maximum fluorescence ratios with and without occlusion at a 721 variety of target input concentrations (see Methods). E: Mismatch discrimination, defined as 722 log<sub>2</sub>(perfect match activity / mismatch activity), for two single mutations and one double mutation 723 using occluders blocking either the target, the crRNA, or both. Error bars in D and E show 724 standard deviations propagated through the relevant formulae (see Methods).



727 Fig. 4: crRNA occluders enable consistent and sensitive mismatch discrimination. A: Violin plots showing the ability of Cas13 to distinguish between wildtype targets and targets 728 729 containing mutations at four different positions in the protospacer both with and without 730 occlusion; position is relative to the 5' end of the protospacer. Each data point is the 731 discrimination ratio of perfect-match to mismatched sequence (defined as in Fig. 3E; see 732 Methods). B: Data from A, but organized by mutation type. C: Heatmap showing the ability of 733 Cas13 to detect spiked-in target in a background of mismatched sequence at decreasing allele 734 frequencies, both with and without occlusion. Asterisks indicate statistically significant detection 735 over the no-spike in control. Significance determined by one-tailed t-test p<0.05. Activity 736 discrimination is defined analogously to mismatch discrimination (see Methods). D: Specificity 737 matrix showing Cas13 activity normalized for each target, with and without occlusion, for all 738 possible crRNA and target nucleotides at position 5. E: Detection of synthetic Delta and 739 Omicron SARS-CoV-2 Spike gene RNA with crRNAs specific to Delta or Omicron using total 740 fluorescence after 90 minutes. Fluorescence of each target was normalized independently after 741 subtracting minimum NTC at 90 minutes. F: Same as in E, but using amplified viral seedstocks.

725

# 742 Extended data figures

743



#### 745 Extended Data Fig. 1: Multiplexing RNA secondary structure for Cas13-based assays. A.

- 746 Criteria used in the design of target RNAs for multiplexed detection assays. **B.** Histogram
- showing the minimum and total structure free energies of randomly generated RNA sequences,
- compared to the free energy of the two target RNAs used in the tiling experiment. **C.** NUPACK 3
- 749 predicted minimum free energy structures for the two experimental targets<sup>40</sup>. **D.** Overview of the
- 750 multiplexed tiling experiment. Made using BioRender.



751

Extended Data Fig. 2: Activity profiles of Cas13 targeting occluded RNAs. A-D. Cas13
 activity as a function of occluder start position in each 96 nt target block. A: 28-mers. B: 21-

mers. **C:** 14-mers. **D:** 10-mers. **E-H.** Same as A-D, with activities normalized to the non-

occluded condition for each target block **I.** Activities of all negative control conditions. **J.** 

Normalized activities as a function of occluder start position for a single target with all four

757 occlusion lengths.



758

759 Extended Data Fig. 3: Controls and data normalization for multiplexed tiling assay. A.

Fluorescence curves for the set of experimental conditions chosen for the multiplexed tiling
 assay. **B.** Scatter plot showing activity correlation between technical replicates in the tiling

experiment. C. Raw activity curves from the control (unoccluded) targets across all conditions in
 tiling assay. D. Swarm plot showing control target activities before and after correction. E.

764 Cumulative histogram showing activity distribution for control target 1 before and after

correction. **F.** Same as in E, but for control target 10. **G.** Dot plot showing activity correlations

between the two control targets for all conditions before and after correction. **H.** Scatter plot

showing activity correlation between the two target shufflings for all tested conditions, before

and after correction. Inset: histogram of ratio of activities of points of the two target shufflings,

before and after correction, excluding negative controls. In E, F, H (inset),  $\sigma$  represents standard

770 deviation.



771

772 Extended Data Fig. 4: Strand displacement-based tdwell model accounts for asymmetries 773 in occlusion pattern. A. Activity as a function of DNA occluder length for occluders of different 774 lengths extending inwards from 3' and 5' ends of the protospacer. Strand displacement model 775 predictions shown as dashed lines. B. Data from tiling experiment plotted as in A and also 776 including oligos occluding the middle of the protospacer (yellow). Small dots show individual 777 data points from each crRNA; large dots show the mean; error bars show standard deviation. Model predictions shown as dashed lines. C. Ratio of activities resulting from 21-mer occluders 778 779 targeting 3' end of protospacer to those resulting from occluders targeting 5' end, plotted as a 780 function of occluder length. Each curve shows a different crRNA. Model prediction shown as 781 dashed line. Cumulative histograms of these data are shown in Fig. 2D. D. As in C, for 28-mer 782 occluders. E-F. Correlation between activities resulting from 21-mer occluders and 28-mers 783 occluding the same nucleotides. In E, 28-mers starting at positions 1, 4, 7, etc are matched with 784 21-mers starting at positions 3, 6, 9, etc; in F they are matched with 21-mers starting at 785 positions 6, 9, 12, etc.



786

787 Extended Data Fig. 5: Occlusion of target RNA and crRNA increase Cas13's sensitivity to 788 mismatches. Note on occluder nomenclature: occluders are named according to their start 789 position from the 5' end of the target block; all occluders here are 28nt in length. Occluder s19 790 binds to nucleotides 1-13 of the protospacer and extends into the 5' flanking region, s31 binds to 791 nucleotides 1-25 and extends slightly into the 5' flanking region, s52 binds to nucleotides 18-28 792 and extends into the 3' flanking region, and s61 binds to nucleotide 28 of the protospacer and 793 extends into the 3' flanking region. A. Bar charts corresponding to Fig. 3E, representing Cas13 794 activity for perfectly-matched and mismatched targets when occluded by several different targetblocking occluders, as well as crRNA occluders and combinations thereof. Upper dotted line 795 796 indicates activity saturation point; curves above saturation are not fit well by exponentials and 797 therefore bars in this region are not accurate measurements of activity. B. NTC (no-target 798 control) raw curves for conditions with and without a crRNA occluder. C. Raw fluorescence 799 curves and fits for the data shown in A.



800

801 Extended Data Fig. 6: Mismatch detection using different types of occlusion. Raw

802 fluorescence curves corresponding to Fig. 4A-B detecting various mismatches within three

803 different target sequences for no occlusion, target occlusion, crRNA occlusion, and

804 target+crRNA occlusion conditions.

805



806

807 Extended Data Fig. 7: Fluorescence curves from experiments probing Cas13 mismatch 808 detection at low allele frequencies and varying target concentration with occlusion. A.

- 809 Raw fluorescence curves corresponding to Fig. 4C detecting mismatch detection sensitivity at
- 810 decreasing allele frequency with and without occlusion. **B.** Raw fluorescence curves
- 811 corresponding to Fig. 3D detecting presence of a mismatch at different target RNA
- 812 concentrations with and without occlusion. Shaded regions show the range of fluorescence
- 813 measurements for each condition across replicates.



814

815 Extended Data Fig. 8: Fluorescence curves from Cas13 specificity matrix experiment with

816 **different types of occlusion.** Raw fluorescence curves corresponding to Fig. 4D using all

817 possible crRNA and target nucleotides at a given position. Semi-transparent dashed lines show

818 curve fits (see Methods).



819

820 Extended Data Fig. 9: Fluorescence curves for SARS-CoV-2 variant calling experiments.

Raw fluorescence curves corresponding to Figs. 4E and F targeting both Delta and Omicronvariants with guides specific to each variant.