

1 What was known before:

2 Keratoconus may continue to progress even after cross linkage (CXL) Identifying eyes that have
3 progressed can be difficult Criteria to define progression vary, with no agreed definition

4

5

6 What this study adds:

7 The rate of keratoconus progression following CXL varies with the criteria adopted We have developed

8 95% Limits of Agreement for keratometry to account for all stages of keratoconus severity We have

9 compared this method with results using standard definitions

10

11 **A comparison of keratoconus progression following collagen cross-linkage using**
12 **standard or personalised keratometry thresholds**

13

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20 Running header: Keratoconus progression

21

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36

37 **Abstract**

38 **Objective:** To define how estimates of keratoconus progression following collagen cross-linking
39 (CXL) vary according to the parameter selected to measure corneal shape.

40 **Materials and Methods:** We estimated progression following CXL in 1677 eyes. We compared
41 standard definitions of keratoconus progression based on published thresholds for Kmax, front
42 K2, or back K2, or progression of any two of these three parameters, with the option of an
43 increased threshold for Kmax values $\geq 55D$. As corneal thickness reduces unpredictably after
44 CXL, it was excluded from the principal analysis. We then repeated the analysis using novel
45 adaptive estimates of progression for Kmax, front K2, or back K2, developed separately using
46 6463 paired readings from keratoconus eyes, with a variation of the Bland-Altman method to
47 determine the 95% regression-based limits of agreement (LoA). We created Kaplan-Meier
48 survival plots for both standard and adaptive thresholds. The primary outcome was progression
49 five years after a baseline visit 9-15 months following CXL.

50 **Results:** Progression rates were 8% with a standard ($\geq 1.5D$) threshold for K2 or 6% with the
51 static multi-parameter definition. With a $\geq 1D$ threshold for Kmax, the progression was
52 significantly higher at 29%. With adaptive Kmax or K2, the progression rates were similar (20%)
53 but less than with the adaptive multi-parameter method (22%).

54 **Conclusions:** Estimates of keratoconus progression following CXL vary widely according to the
55 reference criteria. Using adaptive thresholds (LoA) to define the repeatability of keratometry
56 gives estimates for progression that are markedly higher than with the standard multi-parameter
57 method.

58

59 **Key words:** Cornea, keratoconus, corneal cross-linking, Kaplan-Meier estimate

60 **Introduction**

61 Keratoconus is a common cause of visual disability in young people, with a prevalence in some
62 populations estimated to be as high as 1:50.¹⁻³ It is characterised by progressive corneal
63 thinning and distortion with visual loss.^{4,5} Corneal cross-linking (CXL) is a photochemical
64 treatment that can arrest progression.⁶⁻⁹ However, estimates of treatment success vary
65 (reported range 90.1% to 98.3%) in part due to the different definitions of progression adopted,
66 with no consensus on the best parameters to use.^{7,10-12} The heterogeneity of definitions of
67 progression and inconsistent or absent reporting of key outcome measures, is highlighted in a
68 recent systematic review.¹³

69

70 The primary options to identify keratoconus progression are to document an increase in corneal
71 power, a reduction in corneal thickness, or a loss of visual acuity, considered singly or
72 combined. Keratometry changes can incorporate either a single parameter, such as an increase
73 in the front K2 of $\geq 1.5\text{D}$ or an increase in Kmax of $\geq 1\text{D}$, with a single threshold applied across
74 the full spectrum of disease severity. However, as anterior keratometry values increase, the
75 measurement repeatability reduces.¹⁴⁻¹⁷ A modification that recognises this phenomenon is to
76 incorporate a second threshold, typically for a keratometry value of $>55\text{D}$, above which the
77 threshold increases,¹⁴ although with a low corneal power progression would still be missed if
78 small ($<1\text{D}$), but repeatable, changes are ignored. A solution to this would be a personalised
79 threshold that considers all grades of corneal power.

80

81 In this study, we compared estimates of keratoconus progression following CXL derived when
82 we apply different criteria to a single dataset. We first used standard definitions of keratometry
83 progression for Kmax, front K2, or back K2, or combinations of these keratometry values, with
84 the option of an increased threshold for front K2 for values $>55\text{D}$. We then compared these

85 results with a novel estimate of progression based on the 95% regression-based limits of
86 agreement (LoA) for all values of Kmax, front K2, or back K2. However, we excluded
87 pachymetry from our estimates due to the unpredictable corneal thinning after CXL and
88 measurement uncertainty from stromal compaction and light scatter.^{6,18–20} We used Kaplan-
89 Meier survival plots to compare the progression rates.

90

91 **Methods**

92 Moorfields Eye Hospital NHS Foundation Trust approved the study (references CA17/CED/03
93 and 22/PR/0249), which complied with the Interventional Procedure Guidance (IPG466) of the
94 National Institute for Health and Care Excellence (NICE) and adhered to the tenets of the
95 Declaration of Helsinki. We based the first diagnosis of keratoconus on computerised corneal
96 tomography parameters, such as the Belin-Ambrosio analysis of posterior corneal ectasia
97 (Oculus HD, Optikgeräte GmbH, Wetzlar, Germany), evaluated by experienced clinicians based
98 in a dedicated keratoconus clinic. For the cohort who had CXL we only included participants
99 who were ≥ 13 years of age who had epithelium-off accelerated pulsed high-fluence CXL (30
100 mW/cm², 1.5 sec on/off cycle, energy 7.2 J/cm² (Avedro KXL, San Clemente, USA) between
101 January 2014 and September 2021. We no longer use the Dresden protocol at our centre. We
102 included both eyes if they met the inclusion criteria. Demographic data included age, sex, and
103 self-identified ethnicity. Exclusion criteria included pregnancy or breastfeeding, uncontrolled
104 ocular surface disease, or a minimum corneal thickness measurement before treatment of < 375
105 μm . We also excluded patients with previous corneal surgery, pellucid marginal corneal
106 degeneration or other ectatic corneal disorders. We routinely scheduled slit-lamp examination
107 and Scheimpflug corneal tomography at 6 and 12 months after treatment and then as required
108 for up to six years, with data recorded on an electronic spreadsheet. For the progression
109 analysis, we defined the baseline visit as an examination 9 to 15 months after CXL.²¹ We then
110 recorded any change from the baseline keratometry to the subsequent measurements and

111 excluded eyes that did not have at least one valid scan after the baseline visit. We then
112 generated Kaplan-Meier survival curves for all the parameters of interest, with progression
113 defined as an increase in the parameter beyond the predefined thresholds (Table 1).

114

115 We used an overlapping dataset of repeat scans performed at the same visit for 9341 eyes with
116 keratoconus to define the adaptive thresholds for keratometry. We selected the first two scans
117 from each visit with an 'OK' Pentacam quality score (QS), so there was no variation in quality
118 between eyes or pairs of scans. After exclusions, there were 6463 paired readings available for
119 calculation of the LoA. We used a variation of Bland Altman analysis to generate regression-
120 based limits of agreement (LoA) for the whole range of keratoconus severity for Kmax, front K2
121 and back K2 (Supplementary text); this is an accepted method when the standard deviation of
122 repeated measurements varies according to the magnitude of the measurement.²² Then, for
123 each corneal parameter, we used steepening of keratometry above the 95% LoA as our
124 definition of progression. We included pachymetry in our evaluation of the LoA because it is
125 relevant when assessing suitability for repeat CXL, but it was excluded from our primary
126 analysis of progression as CXL can induce corneal thinning. We excluded visual acuity as it was
127 not measured objectively on multiple occasions at each visit and thus was not amenable to this
128 method.

129

130 For statistical analysis, we performed regression-based Bland Altman analysis in RStudio
131 version 1.3 (<https://www.rstudio.com>) and a non-parametric estimation of the risk of
132 keratometric progression using the Kaplan-Meier method (Stata 17, StataCorp LP, Texas,
133 USA). We used McNemar's test to compare corresponding eyes five years following the
134 baseline visit to establish whether the results from any two definitions of progression were
135 statistically significantly different.

136

137 **Results**

138 We evaluated 5035 eyes that had CXL. Following exclusions, 1677 eyes (1217 patients) were
139 available for survival analysis. Of these patients, 72% were male, with a self-declared non-white
140 ethnicity in 373 (40%) of the 934 patients with available data. Figure 1 shows the reasons for
141 exclusion from the survival analysis. At the baseline appointment 9 to 15 months after CXL the
142 mean keratometry values were 57.7D for Kmax (standard deviation (SD) 8.0D, range 42.8D to
143 92.4D), 50.2D for front K2 (SD 5.2D, 36.7D to 74.4D), -7.6D for back K2 (SD 1.0D, -12.0D to
144 5.3D), and 447.8 μ m for minimum pachymetry (SD 40.7 μ m, 315 μ m to 579 μ m). Of the 1677 eyes
145 in the dataset used for the survival analysis, 11.9% had a K2 at baseline of <45D (mild
146 keratoconus).

147

148 Using 6463 paired readings of eyes, we generated v-shaped Limits of Agreement (LoAs) for
149 each of the four corneal parameters. The associated regressions demonstrated statistical
150 significance ($P < 0.001$). The Bland Altman plots for Kmax, front K2 and back K2 and minimum
151 corneal pachymetry are shown in Figure 2. For each plot, the red dashed lines represent the
152 95% LoA, which are v-shaped, with the LoA increasing as the value of mean Kmax and front K2
153 increases and the value of the back K2 and pachymetry decreases, suggesting that the
154 repeatability of the readings reduces in more advanced disease. The LoA for each dioptre of
155 keratometry for Kmax, front K2 and back K2 are shown in Supplementary Table 2.

156

157 The Kaplan-Meier survival curves for progression defined using six different keratometry indices
158 (Table 1) are shown in Figure 3, with confidence intervals added (Supplementary Figure 4 A
159 and B). The stepwise drop in survival at some points in the curves may result from predefined
160 follow-up intervals. For the fixed keratometry definition of an increase in Kmax of ≥ 1 D, the
161 proportion of eyes that had progressed at five years after the baseline visit was the highest
162 value in the series at 29%, or 18% if we increased the fixed threshold for Kmax to ≥ 1.5 D (data

163 not shown). However, with a fixed definition of progression of an increase in K2 of $\geq 1.5D$ or the
164 static multi-parameter definition of progression, the progressed proportion was lower at 8% and
165 6%, respectively. The results for all three thresholds were similar for the adaptive methods, with
166 22% of eyes progressing when we used the adaptive Kmax definition, 22% when we used the
167 adaptive K2 definition, and 20% with the adaptive multi-parameter method. When we use the
168 McNemar test to compare progression in these groups, we cannot conclude that the difference
169 between adaptive K2 and adaptive Kmax are different ($P=0.9468$). However, the progression
170 identified with the adaptive multi-parameter and adaptive K2 methods differ significantly
171 ($P<0.001$).

172

173 When we performed a survival analysis for pachymetry with progression-defined thinning
174 exceeding the adaptive threshold, there was an approximately 32% probability of progression
175 five years after the baseline visit (Supplementary Figure 4C).

176

177 **Discussion**

178 The primary method to identify keratoconus progression is to monitor for changes in corneal
179 shape, particularly an increase in keratometry. However, we have shown that with the same
180 dataset, different parameters, used singly or in combination, give widely different estimates. The
181 accuracy of keratometry reduces as the cornea becomes more ectatic and using one threshold
182 will not identify changes in keratometry with the same accuracy over the whole range of
183 keratoconus severity.^{15-17,23} As a result, with one threshold, there is a tendency to over-diagnose
184 progression in steep corneas and miss a repeatable increase in keratometry in flat corneas. A
185 partial solution to this problem is to use a higher threshold for more advanced disease.^{14,15} We
186 have refined this approach by identifying the regression-based 95% limits of agreement (LoA)
187 for keratometry to derive thresholds that can be applied individually to all corneal curvature
188 values. We have then used these adaptive thresholds to quantify keratometry changes in a

189 population following CXL and then compared the rate of progression with values obtained with
190 standard methods and thresholds.^{7,10,11,24,25} We have also incorporated a delayed time point for
191 baseline observations to allow any acute changes of corneal shape following CXL to
192 stabilise.^{6,18–20}

193

194 Our results show that keratoconus can continue to progress after epithelium-off accelerated
195 pulsed high-fluence CXL for at least five years following the baseline, but with a wide range (6%
196 to 29%) in the estimates of progression depending on the parameter used. For example, with a
197 static front K2 threshold of $\geq 1.5D$, or the multi-parameter method, the number of eyes that had
198 progressed five years after the baseline visit was similar at 6% and 8%, respectively. However,
199 with a static Kmax threshold of $\geq 1.0D$, the progression rate was much higher at 29%, although
200 this reduced to 18% if we increased this threshold to $\geq 1.5D$. In contrast, the results using the
201 three adaptive thresholds were more uniform at 20% to 22%. Importantly, because there is no
202 reference standard (ground truth) to define progression, we can only compare the results
203 obtained with the different methods; we do not know which is the most accurate or best
204 represents progression. It is also difficult to compare our estimates with other case series due to
205 the variety of thresholds used in the literature, the lack of an agreed time-point for the baseline
206 readings, and variation in the reported follow-up. Overall reported values have ranged between
207 2% and 20%,^{7,26–32} and we previously reported that when measured from the time of treatment
208 and with a static multi-parameter method, progression was between 1.9% and 2.4% two years
209 after treatment.⁷

210

211 Monitoring for keratoconus progression after CXL is to determine whether the disease has
212 stabilised or whether a repeat CXL is indicated. Multiple surgeon and patient factors can
213 influence the decision to undergo retreatment, including patient reluctance following the
214 experience of the first procedure with little patient-perceived benefit, insufficient residual stromal

215 thickness, and the relative lack of clinical outcome data to support the effect of repeat CXL. We
216 found only a small number of reports of retreatment rates after CXL, which varied between 4 in
217 131 eyes (3%) to 45 in 230 eyes (20%).^{25,33} Interestingly, in our series, despite a minimum value
218 for progression at five years of 6%, only a minority of eyes (0.5%) had a repeat CXL, suggesting
219 CXL retreatment is not a good proxy for keratometric progression after CXL and that different
220 clinical criteria apply when considering treatment with primary CXL as opposed to repeat CXL.
221 As yet, there is also no agreement on when to perform retreatment. However, the threshold
222 differs from primary CXL, with criteria ranging from a >2D increase in Kmax within one year or
223 an increase in Kmax of >1D at two subsequent follow-up visits more than one year following the
224 primary treatment.^{25,33}

225

226 The strengths of our study include the large sample size available to develop the keratometry
227 LoAs and the large cohort with extended follow-up after CXL for validation. For the first time, we
228 have quantified the effect of using different keratometry parameters on the estimates of
229 progression. The limitations of this study are the high proportion of eyes with incomplete data
230 and follow-up, a risk inherent when analysing data retrospectively. We do not know if the
231 characteristics of the population censored from the survival curves are the same as the included
232 data. Because of the high attrition rate, our results best serve as a comparative analysis of the
233 included parameters as opposed to a statement of their relative utility to identify the actual rate
234 of progression, which is unknown. We included older children and young adults, although there
235 may be differences in their risk of progression. Although we confirmed that a proportion of eyes
236 had thinned after CXL, it is unclear if this is an effect of CXL or the progression of keratoconus,
237 and the role of pachymetry when monitoring for continued keratoconus progression after CXL is
238 uncertain. Monitoring for a change in visual acuity, not included in this study, may also have a
239 role in the detection of progression. We defined our new definitions of progression as
240 keratometry crossing an adaptive threshold after one appointment; requiring sustained

241 progression across at least two examinations may be more accurate. Finally, an unknown
242 proportion of the eyes in the original cohort with primary CXL may not have progressed even if
243 they did not have this treatment.¹⁰ These stable eyes would also be unlikely to progress further
244 after their primary CXL.

245

246 In conclusion, a missed diagnosis of keratoconus progression can lead to visual loss. We have
247 confirmed that the choice of parameter and the associated threshold used to define progression
248 will affect estimates of treatment failure following CXL. With a single or multi-parameter
249 threshold definition of keratoconus progression, the clinician could misclassify measurement
250 error in advanced disease as progression and miss repeatable changes in keratometry in early
251 disease. Therefore, we recommend adaptive thresholds as a consistent and personalised
252 method to identify keratoconus progression. Until this data is incorporated into tomography
253 summary displays, we encourage clinicians to refer to the estimates of the LoA for each dioptre
254 of keratometry provided in Supplementary Table 2.

255

256 Supplemental material is available at Eye's website.

257

258 **Data availability statement:** Additional data are available from the corresponding author on
259 reasonable request

260

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265

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267

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280 DG resources; HM, ML data curation; OL, HM, ST, DG writing; all authors approved the final draft.

281

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376

377

378 **Figure 1.** Reasons for exclusions from the survival analysis following collagen cross linking for
379 progressive keratoconus. K keratometry

380

381 **Figure 2.** Bland-Altman plots for Kmax, front K2, back K2, and minimum pachymetry with 95%
382 limit of agreement for 6463 paired readings. The red dashed lines show the 95% regression-
383 based limits of agreement (LoA) for each parameter. The blue dashed lines on the Kmax and
384 front K2 plots represent the standard thresholds defined in Table 1. The rug plots on the vertical
385 and horizontal axes of each chart show the frequency of the data. For Kmax and front K2, the
386 LoA increases as the mean keratometry value in dioptres increases. For back K2, the LoA
387 increases as back corneal negative power (D) increases. The LoA for thinnest pachymetry is
388 also greater for the thinner corneas. K keratometry.

389

390 **Figure 3.** Kaplan Meier survival curves based on 1677 eyes following corneal cross-linking and
391 using six different definitions of progression. The results using the three adaptive methods give
392 similar rates of progression (middle three lines). However, with the fixed threshold method, the
393 use of Kmax gives a markedly higher rate (bottom line) compared to the K2 and multiparameter
394 methods (top two lines), that both indicate a lower rate of progression than the adaptive
395 methods. Two years after the baseline visit there were 1451 eyes at risk, 983 at 3 years, 674 at
396 4 years, and 307 at 5 years.

397

398 **Figure 4 (supplemental).** Survival plots with confidence intervals for the two general methods
399 used to calculate progression

400

401 **Table 1.** Definitions of keratoconus progression based on fixed or adaptive thresholds

402

403 **Table 2 (supplemental).** 95% limits of agreement for Front K2, Back K2 and Kmax.

404 A) For the static methods there is overlap of the confidence intervals for the static single
405 threshold K2 and the dual threshold multi-parameter method, but not for the static single
406 threshold Kmax method. The survival rates calculated using the fixed threshold for K2 and the
407 dual threshold multi-parameter methods are also similar, but both are significantly different from
408 the fixed threshold Kmax method.

409 B) There is an overlap of the confidence intervals for the three adaptive thresholds. This
410 suggests that there is not a statistically significant difference between the survival rates for the
411 three adaptive threshold methods. However, when we use the McNemar test to compare
412 progression in these groups, we cannot conclude that the difference between adaptive K2 and
413 adaptive Kmax are different ($P=0.9468$). The progression identified with the adaptive multi-
414 parameter method and the adaptive K2 methods are significantly different ($P<0.001$). K
415 keratometry.

416 C. Survival analysis for pachymetry, with progression defined as thinning exceeding the
417 adaptive threshold. There was an approximately 32% probability of progression five years after
418 the reference visit.

419

420 **Supplementary Text.** Adaptive Thresholds: A variation of Bland Altman analysis was used to
421 generate regression-based limits of agreement (LoA)

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