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### Summary

Measurements of threshold contrast required for various resolution tasks at various background light levels are reported. The predictions of a simple statistical model based on photon-noise limited detection are compared with the empirical observations. Correspondence is encouraging provided care is taken to account for the variation of all important parameters such as spatial and temporal integration, pupil area, etc.

#### Introduction

Since the early work of Konig in 1879, it has been known that visual acuity, i.e. the ability to discriminate fine detail in an object, progressively deteriorates as the level of illumi-nation falls. Shlaer<sup>1</sup> has shown that this fall in visual acuity is dependent on the type of Thus at background acuity pattern used. luminances above 100 trolands, the gap in a 'Landolt C' pattern is easier to see than bars of a similar width in a parallel bar resolution At lower luminances, the reverse is pattern. The ultimate limit of acuity under true optimum viewing conditions depends critically on the nature of the task. For vernier acuity, a displacement of 2 seconds of arc between the top and bottom halves of a thin vertical black line has been detected. For the Landolt 'C' and the parallel bar pattern, gaps and bar widths of the order of 25' are the best that have been resolved.

It is generally agreed that the fall in visual acuity at low levels of illumination is connected with the changeover from using the small cone summation areas of the fovea at high adaptation levels, to using the larger rod summation areas of the periphery at low levels. Also, these summation areas are known to increase in size with decrease in the background level, to which the eye is adapted. This will also reduce acuity.

This account is concerned with the recognition of simple patterns of varying contrast at relatively low light levels and is an extension of work on detection previously described by the authors<sup>2</sup>. The empirical observations of detection threshold described in this reference have been compared with the predictions of a simple statistical model for a photon-noise limited detector. This work, which is to be published elsewhere, showed an encouraging correspondence, and the present paper describes the application of the same technique to resolution thresholds.

# The Ideal Detector

The original idea of comparing the actual performance of the human visual system with an 'Ideal Detector' is due to Rose<sup>3</sup>, although similar theories were developed independently by de Vries and also Pirenne. An ideal detector (or ideal picture pickup device) is one whose performance is limited only by the statistical fluctuations in the number of incident photons picked up by the device. Presented with the task of detecting a pattern distinguished by a small luminance, AI, superimposed on a uniform background of luminance I, this detector can do no better than count the photons arriving within the area where the pattern is anticipated, and compare this with the mean density of arrival of photons in the Background photons are considered background I. indistinguishable from target photons, and all these incident photons are given equal weight in the output of the device (i.e., it is linear), so that every effectively absorbed quantum is taken into account in the final decision.

In adapting this concept, the ideal detector has been assumed to be subject to certain limitation analogous to those of the eye. For example, it is taken to have the ability to integrate temporally for a period which is assumed to vary as empirical observation suggests it does for the eve. Then again it is assumed that there is spatial integration over an area the extent of which depends on the background light Some assumptions must be made about the level. method of determining I. For example, it may be assumed that the background can be sampled on a sufficient number of occasions or over a sufficient area by the ideal detector for the background luminance I to be known precisely. Alternatively, it may be assumed that the measurement of I is subject to error in the same way as the measurement of I+AI.

Now, it is generally accepted that the numbers of absorbed quanta fluctuate according to a Poisson distribution, the deviations from an average absorption of ft quanta thus having a root mean square value of  $n^{\circ}$  • Thus if i quanta are absorbed from the background, it is these fluctuations that interfere with the detection of a small change AI in illumination. If this small change in illumination, or 'signal', yields An absorbed quanta then, for a given reliability, the threshold of detection is given by

where k is a constant called the threshold signal-

to-noise ratio, its exact value depending on the required degree of certainty in detection. Equation (1) is the basic equation of the fluctuation theory of Rose. It is, however, an approximation, for it ignores the fluctuations in the signal. Thus, a more rigorous form of the equation is

$$\Delta n = k. (\bar{n} + \Delta n)^{0.5}$$
 .....(2)

For all except the lowest background levels, this equation approximates to (1), since An >> n, but at very low background levels when this condition does not apply, equation (2) must be used.

In the experiments on detection, it was shown desirable to assume that in what has been called a primary recipient unit<sup>2</sup> the sensitivity varies radially over the effective summation area over which spatial integration takes place, a fact which has been recognised in the literature<sup>4,5</sup>. The assumed variation is shown in Figure 1, <sup>2,5</sup> this curve representing a radial variation of the form

$$S = \frac{S_o r_m^3}{(r_o + r_m)^3}$$
 .....(3)

where  $r_m$  is a function of the background luminance, as shown in Figure 2. The adoption of this expression has been justified merely for convenience in calculation. It gives a good fit to the range of empirical results which it represents, but there is no reason to think that it has any biological significance. The summation time T and pupil area, ap, were assumed to vary with background luminance in accordance with the curve shown in Figure 3 and the data given in Table I.

With this knowledge of the spatial and temporal summation characteristics of the retina, it now becomes possible to calculate the number of photons An in a single sample taken by the eye from a pattern illuminated by AI. The mean number of quanta n from the background I may similarly be calculated. Substitution of these in equation (1) now gives an equation for AI in terms of background luminance I. As a rough approximation this is of the form

 $\Delta I = K(I)^{0.5}$ 

but the precise relationship is appreciably affected by the variation with light level of  $r_m$ , T and  $a_p$ . Since the technique of calculation is summarised in more detail in a companion paper<sup>8</sup>, it is not proposed to elaborate further on the details here.

It was found that for large objects at higher light levels the primary recipient detector was inadequate to explain the results, and it was essential also to assume the existence of elongated linear "edge" detectors<sup>2</sup>. The evidence suggested that these had a transverse variation of sensitivity similar to the variation across the diameter of the units already referred to. This could be the result of combining the output of a linear array of primary summation units. There was also evidence for a drop off in sensitivity towards the ends of these long summation areas and a law similar to equation (3) was assumed, replacing  $r_m$  with a length constant 1<sup>^</sup> which was also found to be a similar function of background level. Values assumed for all these parameters are given in Table I which also gives  $a_p$  the area of the natural pupil assumed in these calculations.

Since the detailed results of these experiments are to be published elsewhere, it will suffice here merely to say that for the patterns tested, discs, annuli and parallel bars, the correspondence between empirical thresholds and predicted thresholds was encouraging, discrepancies being typically less than 0.2 in logarithmic units to the base 10.

## **Resolution** Measurements

The experiments reported here were designed to compare the threshold contrast for resolution at various light levels of the following pattern shapes:

rarallel bars The "Foucault Fan" pattern The double disc pattern The 'Landolt C' A square equal to the gap in the 'Landolt C' A vernier acuity pattern

The shapes of these patterns are shown in Figure 4. Three different sizes of each pattern were used, and the object was to see whether the variations between resolution thresholds for different patterns could to any extent be accounted for by the application of the photon noise theory outlined above.

In these experiments the subjects were given adequate time to adapt to an evenly illuminated background, and the resolution pattern was superimposed on this, the colour temperatures being 3600°K and 3400°K respectively. The resolution thresholds were determined by the subject, who had control of the illumination of the pattern. He was asked to straddle the point at which the resolution feature of the pattern was just visible. It is thus possible to make a distinction between the "detection" threshold at which it is possible to see the pattern as a whole, and the recognition threshold at which is is possible to see the resolution feature (e.g. the bars in the parallel bar resolution pattern. With the exception of the square all the patterns have such a feature, e.g. the gap in the "Landolt C", the existence of two separate discs and the discontinuity in the vertical line. The square was included for comparison with the Landolt C where the task might be described as "seeing" the "missing square" where the gap is present.

# The Results

The averaged increment thresholds for the three subjects are given in Table II. For

simplicity, the thresholds for the patterns will be compared two at a time.

One simplifying feature of the results is that the corresponding bar and fan patterns (as defined in Figure A) have virtually identical increment thresholds. This is true for all three sizes and all background luminances. This is because the pointers indicating where 'z' is measured are centrally placed on the fan pattern. It has been found that if the pointers are used too near the top, the increment threshold for the fan is higher than for the bars. Thus, with the proviso that the pointers are used in the central region, the comparisons of performance that will be made with the parallel bar pattern would be the same if the comparisons had been made with the fan pattern.

In Figure 5, the first comparison is made between the increment thresholds for resolution of the Landolt 'C' and the parallel bar patterns. It is first noted that the increment thresholds for the bar patterns are considerably lower than the equivalent Landolt 'C' as defined in terms of z in Figure 4. There are major differences between the thresholds for these two patterns. For the large and medium sizes of both patterns, the increment threshold progressively decreases as the background level is lowered, but for the small patterns, the increment threshold is constant for background luminances of  $10\sim_4$  mL and below.

It will be seen that vertical displacement of the curves for the bar pattern by 0.7 log units gives reasonably close fits to the curves for the Landolt C. This is true to some extent for all the patterns, excluding the squares, and might suggest that once some allowance has been made for the overall inefficiency factor of each pattern, they would all give much the same results. This is, however, believed to be an oversimplification, and indeed is only a rough approximation Compared directly, there is little similarity between the results. For example, the large Landolt C and the small bar pattern require the same contrast threshold for resolution at a background level of -1.80 Log mL. Below this adaptation level, the threshold of the large Landolt C becomes progressively lower relative to that of the small bar pattern, while above this level, the reverse is true. Also for the highest background level, a contrast can be found for which all the bar patterns but none of the Landolt C's can be resolved, whereas at the lowest background luminances a contrast level which just allows all the bars patterns to be resolved, only leaves the small Landolt C unresolved. This again shows that the bar pattern becomes more visible in relation to this 'white' Landolt C if the background level is raised, at least for the range of background luminances used here. It will be suggested later that this is because the Landolt C is resolved using primary recipient units, while the bar pattern is resolved by line/edge detectors.

In Figure 6, the increment thresholds for the resolution of the 'double disc' and bar patterns The comparison shows some features are compared. similar to that between the Landolt C's and parallel bars. The double disc in general has a higher threshold, and the threshold increases relative to the bar pattern as the background level is raised. At the lowest background levels the thresholds for the double disc are much closer to the thresholds of the parallel bars than to those of the Landolt C. Thus, if we attribute the behaviour of the double disc to primary recipient units and that of the bar patterns to line/edge detectors, we must also explain the difference between Landolt C and double disc.

The increment thresholds for the resolution of the Landolt C and the detection of the squares are compared in Figure 7. For background luminances of 10"3 mL and above, the two sets of curves follow each other very closely. This suggests that in this region, resolution of the gap in these white Landolt C's is determined by the detectability of a square decrement of light equal in area to the gap, viewed against a similar background. This presupposes that increment and decrement thresholds for detection of a square are very similar. Below  $10^{-3}$  mL, the increment thresholds for the squares fall progressively below those of the Landolt C. The curves for the squares are the steepest of all the patterns at the very low background levels.

In Figure 8, the increment thresholds for the resolution of the broken line are compared with those for the detection of the square. For background luminances above IO-<sup>4</sup> mL, the curves are sufficiently close to suggest that the resolution of the broken line under these conditions is limited by the detectability of a square patch of light of side equal to the displacement between the top and bottom halves of the line. An interesting experiment might therefore be to compare the limit of vernier acuity as it is normally determined with the size of the smallest detectable black square, for a wide range of background luminances.

For background luminances above  $10^{m3}$  mL, it will be seen from Table II that the increment thresholds for resolution of the medium double disc pattern and detection of the large square are very close. The same is true for the small double disc and medium sized square at background luminances above  $10^{2}$  mL.

During the experiment, the subjects were asked whether they could still detect the presence of a pattern when its increment in luminance had been lowered so that it could no longer be resolved. Their verbal reports indicate that at high background levels, they could at best only detect the patterns very faintly in this non-resolving condition. Particularly with the large and medium sizes of pattern, resolution came with detection. At the very low background luminances, most of the large patterns were still only faintly detectable, but the large Landolt C was bright enough to be readily detectable. The medium sizes of pattern were all readily detectable, and the small sizes were very bright indeed compared with the background, and yet not resolved.

## Extension of the Detection Model to Resolution

Thus far, the results have only been discussed in qualitative terms. In this section, a more quantitative approach is taken by extending the model of detection referred to earlier, to cover the calculation of resolution thresholds. Theoretical curves of increment threshold for resolution,  $AI_R$ , against background luminance, I, are derived for the parallel bars, Landolt C and 'discs' patterns, and the effect of different assumptions is examined.

For detection of an increment in luminance AI, on a background luminance I the response of a detector optimally positioned with respect to the stimulus so as to sample 1+AI, was compared with the response of a detector sampling the background, I, alone. It was argued that the difference between the means of these two responses was the 'signal<sup>1</sup>, and that this signal must exceed the combined fluctuations in these two responses by a constant ratio in order for the signal to be detected.

For resolution, it is proposed that the responses to be compared should be from two identical detectors, X and Y, which are centred over different regions of the resolution pattern. For the parallel bar pattern, one is centred over a bar, and the other is centred over an adjacent space between the bars. For the Landolt C. one is centred over the gap, and the other over a segment of the ring. In the case of the double disc pattern, one is centred on one of the discs, the other over or near the gap between the two Again, the difference between the mean discs responses of the two detectors is taken as the 'signal' and it is argued that this must exceed the combined fluctuations of the two responses by a constant ratio in order for the pattern to be resolved.

# Predicted Resolution of Parallel Bar Pattern

For reasons discussed in the last section, the resolution of the bars in the parallel bar patterns will be assumed to be performed by line Figure 9(a) represents a line detectors. detector, X, centred on a bar and a line detector, Y, centred on an adjacent space between The response of each detector to each bar8. point of the bar pattern is proportional to the product of the light intensity and the sensitivity of the detector at that point. Thus the effective areas,  $o'_{E}(X)$  and  $o'_{E}(Y)$  of the bar pattern in causing a response in the detectors X and Y respectively, may be found by integration. The 'signal' now becomes

$$\Delta n = C \Delta I \alpha_p T \left( \alpha_E^{\dagger}(X) - \frac{\tau}{E}(Y) \right)$$

where C is a constant embodying geometrical factors and the number of quanta per unit of light. The integrated background which contributes to noise becomes

$$\mathbf{n} + \Delta \mathbf{n} = C \alpha_{\mathbf{p}} T_{\mathbf{E}} \left( 2 \left( \mathbf{I} + \mathbf{I}_{\mathbf{D}} \right) \mathbf{r}_{\mathbf{m}} \mathbf{L}_{\mathbf{m}} + \Delta \mathbf{I} \left( \alpha_{\mathbf{E}}^{\dagger} \left( \mathbf{X} \right) + \alpha_{\mathbf{E}}^{\dagger} \left( \mathbf{Y} \right) \right) \right)$$

where  $I_D$  representing an "eigengrau" is unimportant except near absolute threshold. Thus from equation (2), by putting Ck - K'

$$\Delta \mathbf{I}_{\mathbf{R}} = \frac{\mathbf{K}}{\left(\alpha_{\mathbf{p}}^{\mathsf{T}}\right)^{\mathsf{O}^{\mathsf{T}^{\mathsf{T}}}}\left(\alpha_{\mathbf{E}}^{\mathsf{T}}(\mathbf{X}) - \frac{\mathbf{I}}{\mathsf{E}}(\mathbf{Y})\right)} \times \left\{2\left(\mathbf{I} + \mathbf{I}_{\mathbf{D}}\right) \mathbf{r}_{\mathbf{m}}^{\mathsf{T}} \mathbf{L}_{\mathbf{m}}^{\mathsf{T}^{\mathsf{T}}} \mathbf{L}_{\mathbf{R}}^{\mathsf{T}^{\mathsf{T}}}(\mathbf{X}) + \Delta \mathbf{I}_{\mathbf{R}}^{\mathsf{T}^{\mathsf{T}}} \mathbf{L}_{\mathbf{R}}^{\mathsf{T}^{\mathsf{T}}}(\mathbf{Y})\right\}^{\mathsf{O}^{\mathsf{T}^{\mathsf{T}}}} \dots (4)$$

At all but the lowest background luminances, the terms in  $I_D$  and  $AI_R$  on the right hand side of this equation are negligible.

The values of  $r_m$ ,  $L_M$ , T and  $a_p$  were first all considered to be set by the background luminance alone. The theoretical curves thus derived are compared with the empirical data in Figure 10. The values of K' and  $I_D$  used were -1.22 and  $7_10^{-7}$  mL respectively. It will be seen that the theoretical curves fit the empirical points well for the whole range of backgrounds. However, this good fit is thought to be misleading for reasons explained later.

In the section 'Results', it was noted that at low background luminances, the small bar pattern had to be very bright compared with the surrounding background, for it to be resolved. Therefore, in Figure 11, the theoretically fitted curves have been calculated assuming  $r_m$ ,  $L_m$ , T and  $a_p$  are set by (I+AI/2), the mean luminance within the bar pattern. The fit for the medium and large patterns is hardly affected, but for the small pattern at low background luminances, the theoretical prediction is slightly optimistic.

In Table III, the absolute threshold values calculated from equation (4) assuming  $r_m$ ,  $L^A$ , T and  $\ll_p$  are set by Al/2 are compared with the measured values. Again, the fit is good for the large and medium patterns, and the prediction a little optimistic for the small bar pattern at low background luminances. This will be referred to later.

# Resolution of the Landolt C Pattern

For reasons discussed in the last section, we shall take it that the position of the gap in the Landolt C is discovered by light integrated in primary recipient units with radial symmetry as in equation (3). Figure 9(b) indicates the positions of the centres of the two units whose responses are compared in order to resolve the pattern. Unit Y was centred over the gap of the C. In the first case, unit X was considered to be diagonally opposite Y, since this would give the maximum difference in response. The effective areas  $a_E(X)$  and  $a_E(Y)$  of the pattern causing responses in the units X and Y respectively were calculated by numerical integration.

By adapting equation (4), the increment threshold for resolution,  $\Lambda \mathbf{I}_{R^*}$  is given by

$$\Delta \mathbf{I}_{\mathbf{R}} = \frac{K}{(\alpha_{\mathbf{p}}\mathbf{T})^{0.5}(\alpha_{\mathbf{E}}(\mathbf{X}) - \alpha_{\mathbf{E}}(\mathbf{Y}))} \times (2(\mathbf{I} + \mathbf{I}_{\mathbf{D}})\pi \mathbf{r}_{\mathbf{m}}^{2} + \Delta \mathbf{I}_{\mathbf{R}}\alpha_{\mathbf{E}}(\mathbf{X}) + \mathbf{I}_{\mathbf{R}}\alpha_{\mathbf{E}}(\mathbf{Y}))^{0.5} \dots (5)$$

At all but the lowest background levels, the terms in  $I_D$  and  $AI_R$  on the right hand side of the equation are again negligible.

Figure 12 compares the empirical data with the theoretical curves assuming that  $r_m$ ,  $T_m$ , T and op are functions of I alone or of ( $I+\Delta I$ ). The values of K and Ip used were -1\*22 log units and  $7 \times 10^{-7}$  mL respectively. For both sets of assumptions, the theory predicts thresholds considerably lower than were in fact measured.

It was therefore arbitrarily decided to derive the theoretical curves assuming that the comparison unit, X, was located only one gap's width away from the unit, Y, on the Landolt C ring (see Figure 9(b)). In Figure 13, the resulting theoretical curves are compared with the experimental data. The same values of K and  $I_{\text{D}}$  were used.  $r_{\text{m}},$  Lm, T and a were considered functions of I only. The fit is still not good, but is considerably better than that found when the unit X is diagonally opposite Y. The truth probably lies somewhere between, and it may be possible to improve this theory of the resolution threshold of the Landolt C by more refined positioning of the unit X. The unit should perhaps be positioned a fixed distance from Y rather than a distance related to the gap width.

#### Resolution of Double Pise Pattern

Resolution is again assumed to be performed by primary recipient units. Figure 9(c) represents the two cases considered. In both conditions, unit X was located at the centre of a disc, (see Figure 9). Unit Y was located (i) at the centre of the gap between the two discs. or (ii) at a distance of 1.64 times the disc radius from the centres of both discs. The effective areas  $a_E(X)$  and  $a_E(Y)$  of the discs in causing a response in the units X and Y respectively, were calculated by numerical integration. Theoretical increment thresholds for resolution were calculated for case (i) and case (ii) by substitution in equation (4).

Case (ii) provides the larger signal difference between the X and Y units and thus predicts the higher sensitivity. In Figure 14, the case (ii) predictions are compared with the empirical data for a value of K of -1.16 log units. The fit is reasonable at background luminances below  $10^{-2}$  mL, but above this adaptation level, the experimentally determined increment thresholds are lower than those predicted. It is possible

that part of the discrepancy at high background luminances may be due to edge detection superseding area detection. However, if K had been taken as 1.22, as in Figures 10, 11 and 12, the agreement would have been close at high light levels, but the predicted thresholds would have been 0.6 log units too low at low light levels. A possible reason for this will be discussed later.

The theoretical values derived for case (i) with the unit Y positioned centrally between the two discs have not been plotted because the results showed no improvement.

#### Detection of Squares

Increment thresholds for the area detection of squares were calculated using equation (5), simplifying integration by assuming that a square is as detectable as an equal area disc for this type of detection. It can be shown numerically that the error in the calculated increment threshold in making this assumption is less than The theoretical increment thresholds thus 0\*5%. derived are compared with those obtained experimentally in Figure 15. The values of K and In used were -0.98 log units and 7><10-7 respectively. The former was chosen to give the best approximation at low light levels and for background luminances below  $10^{-2}$  mL the predicted values are in good agreement with the empirical measurements, but above this background level we find that the predicted thresholds are about 0.25 log units higher than those measured. To test whether or not this discrepancy is due to edge detection predominating at these light levels, theoretical edge detection curves were derived using equation (4), with the value of K' made equal to that of K used in the case of area detection. The theoretical area detection. The theoretical area and edge detection curves for the squares are shown in Figure 16. It will be seen that edge detection only supersedes area detection for the large square at the highest background luminance. Thus, the simple edge detection so far developed cannot explain the discrepancies at high background luminances. Summation of the four border effects is a possible factor.

A feature of the theoretical curve fitting to the data of this experiment is that the value of K which has been chosen for the squares (-0.98 log units) is considerably lower than the value of K' used for the resolution of the bar pattern (-1.22 log units). Indeed, if the value K = -1.22 log units had been taken, the fit would have been good at high levels of background luminance, at the expense of the fit at the lowest light level, which would then be optimistic by 0.24 log units.

#### General Comments

We have seen that depending on the choice of K, it is possible to fit theoretical curves either at the upper end or at the lower end of the background luminance range covered in these experiments. If K is chosen for a good fit at the lower end, the theory is a little pessimistic at the upper end. If K is taken as -1.22 log units for the best compromise at the upper end, the theory is slightly optimistic at the lower end.

The discrepancy of up to 0.25 log units is in fact a very small one, considering that we are concerned with a range of five orders of background luminance, but it is, nevertheless, of interest to consider possible reasons for it. There is firstly the possibility that the inherent sensitivity or photon detecting efficiency changes with light levels. There is in fact a change from the use of rods at the lower end of the range used in these experiments, to the predominant use of cones at the upper end. This could readily alter the balance between the receptor sensitivity at the lower and upper ends of the range, by the small amount in question.

Secondly, there is some evidence that the inverse cubic law adopted for convenience in describing the distribution of sensitivity across a primary recipient unit may be unduly sharp in the centre. Moreover, the use of the same law to describe the transverse variation of sensitivity across each component of a boundary detector may also be unjustified, because almost any means by which the outputs from primary recipient units were combined to form linear detectors would introduce at least some rounding of the peak.

The data which originally justified the use of the inverse cubic law is not very sensitive to the sharpness of the central peak, but resolution threshold data, such as that for parallel bars, is very sensitive to the peak when the width of the bar is small compared with rm. This could account for the discrepancy between the predicted and observed thresholds for the small parallel bar patterns at low light levels in Figure 11. The modification to the peak of the inverse cubic curve necessary to allow for this is indicated by the dotted curve in Figure 1. Some comparisons have also been made with published data on contrast sensitivity functions<sup>6</sup> which support the idea of a slightly more rounded peak than the pure inverse cubic curve employed, and the question is being investigated further. At high light levels the rounding may be partly due to the influence of the optical system of the  $eye^5$ .

Thirdly, there is the question of boundary detection taking over from the radially symmetrical primary recipient units. This has been considered earlier in relation to the square pattern, but there is some uncertainty regarding the relative sensitivity of the two processes and this can influence the balance between recognition thresholds at the two ends of the scale.

## Discussion

The outstanding fact about the results reported here is that, within the limits of the

slight discrepancies which have just been discussed, it is possible to work on the assumption of such a uniform sensitivity of photon detection. Thus, once one has recognised the limitations of temporal and spatial summation in the retina, the efficiency of utilisation of the information in the incoming photon flux appears to be very nearly uniform over a very wide range of light levels. Considering the variety of visual tasks included in these experiments the uniformity of behaviour is surprising. Thus the theory gives some insight into the reasons for the characteristic differences in observed thresholds between the different forms of resolution test pattern.

The theory and its application to the experimental data is aimed at discovering how efficiently the eye uses the light in the retinal It has not primarily been concerned with image. the detailed nature of the mechanism by which the eve performs the operation. Thus, there is no attempt to identify the cause of the variation of  $r_m$ ,  $L_m$ , etc. as a function of light level. Nor has there been any attempt to explain what neural mechanism would provide such uniform efficiency of extraction of information from the incoming liaht This is an interesting field for conjecture, but there are many alternative possibilities to choose from, and a proper discussion of these must await a later occasion.

It is encouraging to find in the need to invoke line/edge or 'boundary' detectors some measure of correspondence with recent physiological findings<sup>7</sup>. For the present, whatever may be the biological significance of the summation areas and edge detectors, their practical significance as parameters determining the performance of the eye is a real one. They indicate clearly the nature of the limitations under which the eye operates when detecting patterns under conditions of poor visibility. Moreover, the concept of a photon noise limited threshold is supported by further experiments reported separately<sup>8</sup> in which artificial noise, deliberately introduced into retinal images, appears to have an analogous effect on detection.

The work reported here has been on relatively simple patterns and, perhaps in consequence, fairly simple detecting mechanisms have come to light. The situation may well be complicated when one considers more complex patterns, especially if these are seen against an inhomogenious background. It may well be that there exist more specialised detectors for particular patterns or features of patterns. Indeed, recent physiological evidence suggests there may be, but their existence cannot be deduced from these experiments. Then again, both types of detector discussed here are taken to represent the mean performance averaged over all the detectors which take part in the recognition of different patterns on different It is, however, clear from physiooccasions logical evidence that there is appreciable variation between the response of different

ganglion cells and this may make the concept of an "average" detector shape of less value when more complex patterns are considered. The problem may resolve itself round the question of connectivity between less and more complex detectors. If the more complex detectors are formed by combining the outputs if simpler detectors then the former may be expected to be subject to the inherent limitations of the latter. If, on the other hand, more complex detectors can obtain their information directly from receptor cells, these limitations may not The facts will only become apparent apply. with further work.

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님	280'	200.	.002	200	200'	300.	, 391	133'	,611	3	. 89
	. 12	40'	361	32 '	28'	22,51	17.7'	10.6'	8.5'	5.3'	3.2'
106 1 (m1)	8 1	-5.03	-4.50	-3.92	-2.50	· 3. W	-2.50	-1.80	-1.50	-0.80	+0.40

Values of $r_{m}$ , $l_{m}$ , $T_{E}$ and $d_{p}$ used in the	calculation of theoretical curves from	Equations (4) and (5). Luminance	measured in millilanderts and visual	angle in minutes of arc.	
Table 1					

-1.67 -1,68 -1.17 -1.32 -1.04 -1.04

-2,52 -2.49 -1.96 -2.15 -1.79 -1.86

-2.92 -2.89 -2.30 -2,62 -2.19 -2.33

-3.27

-3.42 -3.39

-3,44 -3,56 -2,65 -3.46 -3,57 -3.13

-3.52 -3,52

Small Bars

Small Fan Small C

-3.23 -2.63

> -2.79 -3.20 -2.95

-2.77

-2.89 -2,59 -2.60

-3.41 -3,96 -3.22

Small Square Small Discs

Small Line

-2.90

Sma 11	-3.98 -3.52	
Medium	-4,81 -4,85	
Large	-5 <b>.50</b> -5.50	
	Predicted Measured	

Table III Comparison of predicted and measured absolute thresholds, in log (mL), for resolution of the parallel bar gratings.

Background Luminance

Increment thresholds,  $\Delta I_{R}$ , in Log (mL), for resolution of the six patterns. Table II

Background luminances (mL): (1) zero; (2) 7.4 x 10<sup>-f</sup> (3) 1,2 x  $10^{-4}$ ; (4) 9,4 x  $10^{-4}$ ; (5) 1.5 x  $10^{-2}$ ;

(6)  $1.5 \times 10^{-1}$ ; (7) 2.5.



<u>Fig.1</u> Sensitivity distribution across a detector whose sensitivity falls with distance from its centre according to the inverse cubic law adopted.



 $\frac{Fig.2}{from the data of Fig.2}$  Variation of  $r_m$  with background luminance, I, derived





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**Datterns.** 





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