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TESTS OF FIT FOR THE CAUCHY DISTRIBUTION BASED ON THE EMPIRICAL DISTRIBUTION FUNCTION

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M. A. STEPHENS

TECHNICAL REPORT NO. 449 DECEMBER 2, 1991

PREPARED UNDER CONTRACT N00014-89-J-1627 (NR-042-267) FOR THE OFFICE OF NAVAL RESEARCH

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Tests of fit for the Cauchy distribution based on the empirical distribution function

by

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## Abstract

Points are given for testing goodness-of-fit to the Cauchy distribution, with unknown location and/or scale parameters. The tests are based on the empirical distribution function, and the asymptotic points round off work begun by Darling (]955) on the asymptotic theory of test statistics. Monte Carlo points are given for finite n and some discussion of power is included.

Key words: Goodness-of-fit Tests.

## 1. INTRODUCTION.

In a pioneering paper, Darling (1955) discussed the asymptotic theory of the empirical process and of certain goodness-of-fit statistics based on this process, when parameters must be estimated from the sample used in testing fit. The estimated parameters were location and scale parameters, and the theory was illustrated by a test for the Cauchy distribution. The statistics discussed were the Cramer-von Mises  $W^2$  and the Anderson-Darling  $A^2$ , statistics based on the empirical distribution function (EDF) of the given sample.

In this article we develop the tests for the Cauchy distribution, when either or both of the location and sclae parameters are estimated by efficient estimators given below. The tests are set out in Section 2. Asymptotic percentage points are given for  $W^2$  and  $A^2$ , and also for the EDF statistic  $U^2$  introduced by Watson (1961); they involve calculating weights in sums of weighted chi-square variables. This is done by techniques drawn from Darling (1955) and the details are given in Section 3. For finite samples, points for the three statistics have been found from Monte Carlo samples. Points for the well-known Kolmogorov statistic D, and for the related V were found at the same time, and a table for Case 3 is given for reference; the asymptotic theory used for the Cramer-von Mises statistics cannot be applied to these statistics. D is usually not as powerful as  $W^2$  or  $A^2$ , although V is sometimes competitive with  $U^2$ . A brief discussion of alternative statistics, and power, is given in Section 4.

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## 2. TESTS FOR THE CAUCHY DISTRIBUTION.

Suppose a given random sample is  $x_1, x_2, \ldots, x_n$ , with order statistics  $x_{(1)} < x_{(2)} < \ldots < x_{(n)}$ . The test discussed is a test of

 $H_{\Omega}$ : the X-sample comes from the distribution

$$F(\mathbf{x};\alpha,\beta) = \frac{1}{2} + \frac{1}{\pi} \tan^{-1}\left(\frac{\mathbf{x}-\alpha}{\beta}\right), -\infty < \mathbf{x} < \infty$$
(1)

with density function

$$f(\mathbf{x};\alpha,\beta) = \frac{1}{\pi\{1 + (\mathbf{x}-\alpha)/\beta\}^2}, -\infty < \mathbf{x} < \infty.$$
(2)

We can distinguish 4 cases, following Stephens (1974):

Case 0: parameters  $\alpha$  and  $\beta$  in (1) are both known.

Case 1: parameter  $\alpha$  is not known,  $\beta$  is known.

Case 2: parameter  $\alpha$  is known,  $\beta$  is not known.

Case 3: parameters  $\alpha$ ,  $\beta$  are both unknown.

In Cases 1, 2 and 3 estimates of  $\alpha$ ,  $\beta$  are obtained from the formulas  $\hat{\alpha} = \sum_{i} a_{i} X_{(i)}$  and  $\hat{\beta} = \sum_{i} d_{i} X_{(i)}$ , where  $c_{i} = \frac{\sin[4\pi\{i/(n+1) - 0.5\}]}{n \tan[\pi\{i/(n+1) - 0.5\}]}$ (3)

and

$$d_{i} = 8 \sin[\pi\{i/(n+1) - 0.5\}] \cos^{3}[\pi\{i/(n+1) - 0.5\}]/n .$$
 (4)

Here, and in later formulas, sums run for i from 1 to n.

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These are not maximum likelihood estimators (MLEs) but are asymptotically efficient, an important requisite for the asymptotic theory of Section 3 to be valid. These estimators are used because MLEs are known to be difficult to work with; the likelihood can have local maxima and it is sometimes difficult to decide on the global maximum. When the estimates are obtained, the test continues with the following steps:

- (1) Calculate  $z_{(i)} = F(X_{(i)}; \alpha, \beta)$ , replacing  $\alpha$  and/or  $\beta$  by estimates where necessary;
- (2) Calculate the three test statistics from

$$W^{2} = \sum_{i} \{z_{(i)} - (2i-1)/(2n)\}^{2} + 1/(12n)$$
(5)

$$U^{2} = W^{2} - n(\bar{z} - 0.5)^{2}$$
, where  $\bar{z} = \sum_{i} z_{i}/n$  (6)

$$A^{2} = -n - n^{-1} \Sigma_{i} (2i-1) \{ \log(z_{i}) + \log(1 - z_{n+1-i}) \}.$$
(7)

Here log refers to natural logarithm.

(3) Refer the value of the statistic used to Table 1, for the appropriate Case:  $H_0$  is rejected at significance level  $\alpha$  if the test statistic exceeds the value given for the sample size n and the desired level  $\alpha$ .

The present Table for Case 0 is a more accurate update of a previously published table, (Stephens, 1974, 1976) although the changes are trivial in practice. For other Cases, the distributions of  $W^2$ ,  $U^2$  and  $A^2$  do not depend on the true  $\alpha$ ,  $\beta$ . The asymptotic points are calculated from the theory in the next section, and points for finite n are based on

Monte Carlo studies using 10,000 samples for each n. It can be seen that for this very heavy-tailed distribution, and with these estimators the points vary with n somewhat surprisingly; for other distributions (see, e.g., Stephens, 1974, 1977, 1979), and with MLES, they converge much more rapidly to the asymptotic points.

The statistics D and V are obtained from the  $z_{(i)}$  by  $D^{+} = \max_{i} \{(i/n) - z_{(i)}\}; \quad D^{-} = \max_{i} \{z_{(i)} - (i-1)/n\};$  $D = \max_{i} (D^{+}, D^{-}) \quad \text{and} \quad V = D^{+} + D^{-}.$ 

Monte Carlo points for  $D_n$  and for  $\mathbf{v}_n$  are given in Table 2, based on the same 10,000 samples as for the statistics  $w^2$ ,  $u^2$  and  $A^2$ .

## 3. THEORY OF THE TESTS.

The asymptotic distribution of any one of the three statistics is that of

$$S = \Sigma_{i} u_{i} / \lambda_{i}$$
,  $i = 1, 2, ...$  (8)

where  $u_i$  are independent  $\chi_1^2$  variables and  $\lambda_i$  are weights. The weights are found from the now-classical asymptotic theory of the empirical process of the z-values. Darling (1955) gave this theory for tests for absolutely continuous distributions and illustrated it for  $W^2$  with the Cauchy distribution, although details of how the  $\lambda_i$  are calculated were omitted except for Case 2. We now complete the calculations, following the steps and notation given in Stephens (1976, 1977). The empirical process, for all cases, becomes asymptotically a Gaussian process Z(s), with E(Z(s)) = 0, Z(0) = Z(1) = 0, and with the covariance  $\rho(s,t) \equiv E(Z(s)Z(t))$  varying with the Case. In Case 0  $\rho(s,t) = \rho_0(s,t) = \min s,t - st$ . For the other three cases  $\rho(s,t)$  takes the following form:

Case 1: 
$$\rho(s,t) = \rho_0(s,t) - \phi_1(s)\phi_1(t)$$

Case 2: 
$$\rho(s,t) = \rho_0(s,t) - \phi_2(s) \phi_2(t)$$

Case 3: 
$$\rho(s,t) = \rho_0(s,t) - \phi_1(s)\phi_1(t) - \phi_2(s)\phi_2(t)$$
 with

$$\phi_1(s) = -\sqrt{2}(\sin^2 \pi s)/\pi$$
 and  $\phi_2(s) = (\sin 2\pi u)/(\sqrt{2\pi})$ 

These results for Cases 1 and 2 were given by Darling: the simple result for Case 3 follows because the estimates of  $\alpha$  and  $\beta$  are asymptotically independent and the Fisher information matrix is diagonal (see Stephens, 1976, 1977). For Cases 1 and 2 the weights  $\lambda_i$  are found as follows. First calculate

$$\mathbf{a}_{j} = \int_{0}^{1} \phi_{1}(s) \sin \pi j s \, ds$$

and

$$b_{j} = \int_{0}^{1} \phi_{2}(s) \sin \pi j s \, ds , j = 1, 2, \dots$$

and define

$$s_{a}(\lambda) = 1 + \lambda \sum_{j=1}^{\infty} \frac{a_{j}^{2}}{1 - \lambda/(\pi^{2}j^{2})}, \quad s_{b}(\lambda) = 1 + \lambda \sum_{j=1}^{\infty} \frac{b_{j}^{2}}{1 - \lambda/(\pi^{2}j^{2})}.$$

Let  $d_0(\lambda)$  be the Fredholm determinant associated with  $\rho_0(s,t): d_0(\lambda) = \prod(\lambda - \pi^2 j^2)$ . For Case 1, the Fredholm determinant is  $D_1(\lambda) = d_0(\lambda) S_a(\lambda)$  and for Case 2 it is  $D_2(\lambda) = d_0(\lambda) S_b(\lambda)$ . The weights for these Cases are found by solving  $D_1(\lambda) = 0$  for Case 1 and  $D_2(\lambda)$  for Case 2.

<u>Case 1</u>. It is easily shown that  $a_j = 0$  for j even, and  $a_j = 8/\{\pi^2 j (j^2 - 4)\}$  for j odd. Setting  $D_1(\lambda) = 0$  gives a set of solutions  $\lambda_i^* = \pi^2 j^2$ ,  $j = 2,4,6,\ldots$ ; another set is found by solving  $S_a(\lambda) = 0$ (the solutions  $\lambda_j = \pi^2 j^2$  of  $d_0(\lambda)$ , for j odd, are not solutions of  $D_1(\lambda) = 0$ because of cancellation with the denominators in  $S_a(\lambda)$ ). To solve  $S_a(\lambda) = 0$  it is best to write  $\kappa = 1/\lambda$  and solve  $S_a^*(\kappa) = 1 + \sum_{j=1}^{\infty} a_j^2/\{\kappa - 1/(\pi^2 j^2)\} = 0$ ; a solution  $\kappa_i$  exists in each interval  $(1/(3^2\pi^2), 1/\pi^2), (1/(5^2\pi^2), 1/(3^2\pi^2))$ , etc. and these are easily found numerically.

<u>Case 2</u>. For Case 2, b = 0 except  $b_2 = 1/2\pi$ . The solutions of  $D_2(\lambda) = 0$ 

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are then  $\lambda_j = \pi^2 j^2$  except for j = 2. This rather curious result is remarked on by Darling as losing a "degree of freedom" by the estimation of  $\beta$ .

## Case 3. For Case 3, the Fredholm determinant becomes

$$\begin{split} & \text{D}_{3}(\lambda) = \text{d}_{0}(\lambda)\text{S}_{a}(\lambda)\text{S}_{b}(\lambda), \text{ (Stephens, 1976) and setting } \text{D}_{3}(\lambda) = 0 \text{ gives two sets of } \lambda; \\ & \text{the set } \lambda^{*} \text{ of } \text{S}_{a}(\lambda) = 0 \text{ already found as part of the solution for} \\ & \text{Case 1, and the set } \lambda_{j}^{**} = 1/\pi^{2}j^{2}, \text{ for all } j \text{ except } j = 2, \text{ found for Case 2.} \\ & \text{Cumulants of asymptotic distributions}. \text{ The cumulants of the distributions} \\ & \text{can be found by direct calculations} \quad \text{The mean for Case } j \text{ is} \\ & \mu_{j} = 1/6 - \int_{0}^{1} \phi_{j}^{2}(\text{s}) \text{ ds, } j = 1,2 ; \text{ the values are } \mu_{1} = 1/6 - 3/(4\pi^{2}) = 0.0907 \\ & (\text{note a misprint in Darling, 1955, Section 8A) and } \mu_{2} = 1/6 - 1/(4\pi^{2}) = 0.1413. \end{split}$$

For Case 3,  $\mu_3 = 1/6 - 1/\pi^2 = 0.0653$  . Other cumulants may be calculated as described in Stephens (1976). The values are given for reference in Table 3. They may be used to provide checks on the calculations of the  $\lambda_j$ , since they may also be calculated from the distributional form  $S = \sum_i u_i / \lambda_i$ . The r-th cumulant is  $\kappa_2 = 2^{r-1} (r-1)! \sum_i 1/(\lambda_i)^r$ ; these converge sufficiently fast, for  $r \ge 2$ , to give excellent checks on the  $\lambda_i$ values by matching with the direct calculations.

When the  $\lambda_i$  were found, for the different cases, Imhof's (1961) method was used to give the percentage points for S. The points were checked, with excellent agreement, by fitting Pearson curves to the distribution, using the first four cumulants. The slight changes from earlier tables, for Case 0 points in Table 1 are due to replacing Pearson curve fits by points found from the Imhof method. Statistic  $U^2$ . The asymptotic distribution of  $U^2$  is that of  $\int_0^1 z_1^2(t)dt \quad \text{where} \quad z_1(t) = Z(t) - \int_0^1 Z(t)dt. \quad (\text{Watson, 1961}). \quad \text{The solutions}$ for  $\lambda_i$  are somewhat more complicated in principle (see Stephens, 1976) but in fact, for the Cauchy distribution, they work out easily; details will be omitted. For Case 1, the weights are the set  $\lambda_j^* = 4\pi^2 j^2$ , j = 1, 2, ...and a second set  $\lambda_j^{**}$  which are identical to  $\lambda_j^*$  except that  $\lambda_1^*$  is omitted. For Case 2, the weights work out to be the same as those for Case 1, a surprising result which means that the asymptotic distribution of  $U^2$  is the same in both Cases. This occurs also for the logistic distribution; see Stephens (1979). For Case 3 the weights are two sets of  $\lambda_j^{**}$ . The calculations for cumulants give the values in Table 3.

Statistic  $A^2$ . For  $A^2$  the process  $Q(t) = Z(t)/\omega(t)$  must be examined, where  $\omega(t) = \{t(1-t)\}^{\frac{1}{2}}$ . The details parallel those given in Stephens (1976) for the normal distribution. For Case 0, the weights, solutions of the corresponding Fredholm determinant  $d_0(\lambda)$ , are  $\lambda_j = j(j + 1)$ , j = 1, 2, .... For Case 1, the  $a_j$  work out to be zero for j even and must be found numerically for j odd. The weights  $\lambda_j$  are then the set  $\lambda_j^* = j(j + 1)$ , j = 2, 4, 6, ... and a second set  $\lambda_j^{**}$  which are solutions of  $S_a(\lambda) = 0$ . For Case 2,  $b_j = 0$ , for j cdd, and the weights are the set  $\lambda_j^* = j(j + 1)$ , j = 1, 3, 5, ..., and the second set  $\lambda_j^{**}$  for Cases 1 and 2. The calculations for cumulants give the values in Table 3.

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#### 4. FINAL REMARKS.

There are not many tests available for testing fit to the Cauchy distribution. In this article we have given points for EDF tests, tests which are consistent and unbiased and which for other distributions, are very effective in terms of power.

Possible alternative tests might be made using the correlation coefficient of the  $X_{(i)}$ , against  $m_i$ , where  $m_i$  is the expected value of the ith order statistic of a sample of size n from (1), with  $\alpha = 0$ and  $\beta = 1$ . The values of m, are not easily obtained, and m, might therefore be replaced by  $H_i = F^{-1}(r;0,1)$  with r = i/(n+1).  $H_i$  is a well known approximation for m, for most distributions; the approximation is less good in the tails, and of course for the Cauchy distribution the tails will be important. However, H, is easily calculated and tables based on the correlation coefficient between  $X_{(i)}$  and  $H_i$ , called R(X,H), have been given by Stephens (1986). The tables are for  $Z(X,H) = n(1-R^2(X,H))$ , and are given for complete and also for rightcensored samples. Other possible approaches to testing fit include tests based on spacings and tests based on the empirical characteristic function. It is hoped to develop such tests for practical use, and to include them, with EDF and correlation statistics, in an extensive power study. Preliminary work suggests that EDF statistics are much better than correlation statistics, at least, with  $U^2$  and V best overall.

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T	ab	le	1

	Upper	tail pe	rcentage	e points	for W <sup>2</sup> ,	$U^2$ and $A^2$	! _•
		s	ignifica	ance leve	<u>1</u> α.		
n	.25	.15	. 10	.05	.025	.01	
		Case	1. Stati	stic W <sup>2</sup>			
5	. 208	.382	. 667	1.26	1.51	1.61	
8	.227	.480	- 870	1.68	2.30	2.55	
10	.227	.460	- 840	1.80	2.60	3.10	
12	. 220	.430	.770	1.76	2.85	3.65	
15	.205	.372	.670	1.59	2.88	4.23	
20	.189	.315	- 520	1.25	2.65	4.80	
25	.175	.275	.420	.870	2.10	4.70	
30	.166	.250	.360	.710	1.60	4.10	
40	.153	.220	.290	.510	1.50	3.05	
50	.145	.200	.260	.400	.70	2.05	
100	.130	.170	.210	.270	.35	.60	
æ	.115	. 146	. 173	.216	.260	.319	
		Case	e 2. Stat	istic W <sup>2</sup>			
5	.199	. 236	.261	.338	.437	. 590	•
8	.211	.273	.321	.389	.463	- 564	
10	.212	.279	.332	.414	.501	.626	
12	.212	.281	. 337	.433	.525	.661	
15	.206	.279	. 339	.444	. 537	.684	
20	.199	.273	.333	.442	. 547	.698	
25	.194	. 268	.328	.437	.551	.704	
30	.189	. 265	.326	.435	. 553	.708	
40	.185	.260	• 32 <b>3</b>	.434	.555	.712	
50	.183	. 258	.321	.433	.557	.714	
100	.179	.254	.319	.432	.559	.715	
<b>ec</b>	.176	.250	.316	.431	. 560	.714	
		Cas	e 3. Sta	tistic W <sup>2</sup>	~		
5	.167	.242	.305	.393	.445	.481	
8	. 192	.315	.441	. 703	.940	1.13	•
10	. 197	.331	.481	. 833	1.201	1.571	
12	. 194	.329	.487	. 896	1.391	1.901	
15	. 185	.317	.472	. 904	1.54	2.33	
20	. 169	.281	.419	.835	1.63	2.96	
20 25	. 165	.253	.366	.726	1.47	3.08	
30	. 143	.235	.319	.615	1.25	2.90	
40	. 145	. 195	.263	.460	.850	2.17	
40 50	. 120	. 175	.205	.381	.642	1.56	
	. 1097	.175	.235		.508	1.07	
60 100				. 330		.544	
100	.098	.135	. 174	• 2378		• 074	

.080

.108

. 130

.170

.270

.212

.:

CASE 1. STATISTIC U<sup>2</sup>

5 8 10 12 15 20 25 30 40 50 100	.122 .121 .119 .114 .109 .100 .095 .090 .084 .080 .074	.173 .185 .180 .172 .158 .141 .128 .121 .121 .104 .095	.227 .270 .260 .240 .220 .190 .170 .150 .140 .130 .110	.315 .470 .500 .505 .480 .380 .280 .235 .195 .170 .145 .133	.387 .600 .720 .780 .813 .780 .650 .480 .330 .250 .180	.407 .650 .800 .960 1.160 1.340 1.340 1.230 .970 .600 .250 .204
<u>00</u> .	.071	.088	.105	.133	.163	.204

CASE 2. STATISTIC U<sup>2</sup>

5 8 10 12 15 20 25 30 40 50 100	.120 .122 .119 .115 .109 .101 .095 .091 .086 .082 .076	.140 .154 .149 .144 .137 .126 .118 .113 .105 .102 .096	.156 .177 .175 .169 .161 .148 .137 .131 .123 .117 .111	.183 .221 .226 .225 .210 .190 .176 .166 .154 .148 .138 .138	.202 .280 .296 .294 .276 .247 .220 .202 .187 .180 .169 .163	.217 .358 .400 .430 .403 .355 .305 .270 .240 .230 .210 .204
00	.011	.088	.105	.133	.163	.204

CASE 3. STATISTIC U<sup>2</sup>

5 8 10 12 15 20 25 30 40 50 60 100	.105 .107 .104 .100 .093 .083 .075 .069 .069 .062 .057 .054 .047	.133 .151 .150 .144 .132 .116 .101 .091 .079 .070 .066 .057	.160 .198 .203 .200 .183 .159 .134 .117 .096 .085 .078 .065	.202 .293 .324 .339 .330 .295 .242 .202 .147 .121 .104 .080	.226 .386 .461 .504 .542 .548 .486 .402 .274 .197 .149 .098	.243 .466 .597 .712 .844 .974 .999 .940 .697 .505 .344 .154
~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~~	.047	.047	.052	.060	.070	.08

5	1.19	2.22	3.83	8.00	12.75	17.980
8	1.33	2.62	4.7	10.0	17.4	25.0
10	1.34	2.52	4.5	10.6	18.2	29.0
12	1.31	2.42	4.1	9.9	18.8	32.0
15	1.30	2.15	3.5	8.2	17.2	31.2
20	1.17	1.86	2.8	6.5	14.4	27.5
25	1.12	1.68	2.3	4.7	10.8	23.0
30	1.08	1.55	2.1	3.8	8.2	20.0
40	1.02	1.38	1.8	2.9	5.2	15.5
50	.970	1.29		2.4	3.8	10
100	.890	1.16		1.8		3.5
<b>~</b>	. 834	1.02	1.219	1.519	1.812	2.212
		Cas	e 2. Sta	tistic A <sup>2</sup>		
5	.974	1.131	1.239	1.59	2.08	2.84
8	1.085		1.560			
10	1.110	1.414	1.653	2.04	2.38	2.89
12	1.117		1.710		2.55	3.15
15	1.117	1.449	1.728			3.31
20	1.101	1.444	1.728	2.24	2.73	3.44
25	1.083	1.432	1.727	2.25	2.77	3.50
30	1.064	1.422	1.724	2.25	2.80	3.53
40	1.051		1.723	2.26	2.82	3.56
50	1.045	1.405	1.722	2.27	2.83	3.59
100	1.038	1.40	1.718	2.28	2.86	3.64
••	1.034	1.409	1.716	2.283	2.872	3.677
		Ca	ase 3. S	tatistic A	2	
5	- 835	5 1.14	1.40	1.77	2.00	2.16
8	. 992		2.06			
10	1.04	1.63	2.27	3.77		•
	1.04	1.65	2.33	4.14	6.43	9.51
12		1.61	2.28	4.25	7.20	
15		1.01	2.20		( • 20	
15 20	.975	1.51	. 2.13			
15 20 25	.975 .914	1.51 1.40		4.05		14.57
15 20 25 30	.975 .914 .875	1.51 1.40 1.30	. 2.13	4.05 3.57	7.58	14.57 14.96
15 20 25 30 40	.975 .914	1.51 1.40 1.30	. 2. 13 1. 94	4.05 3.57 3.09	7.58 6.91	14.57 14.96 13.80
15 20 25 30 40 50	.975 .914 .875 .812 .774	1.51 1.40 1.30 1.16 1.08	2.13 1.94 1.76	4.05 3.57 3.09 2.48	7.58 6.91 5.86	14.57 14.96 13.80 10.20
15 20 25 30 40 50 60	.975 .914 .875 .812 .774 .743	1.51 1.40 1.30 1.16 1.08 1.02	2.13 1.94 1.76 1.53	4.05 3.57 3.09 2.48	7.58 6.91 5.86 4.23	14.57 14.96 13.80 10.20 7.49
15 20 25 30 40 50	.975 .914 .875 .812 .774	1.51 1.40 1.30 1.16 1.08 1.02	2.13 1.94 1.76 1.53 1.41 1.30	4.05 3.57 3.09 2.48 2.14	7.58 6.91 5.86 4.23 3.37	14.57 14.96 13.80 10.20 7.49 5.32

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<u>Statistic</u>	D	Sig	nificance	level $\alpha$ .		
_n	.25	.15	.10	.05	.025	.01
10	1.05	1.22	1.42	1.75	2.06	2.37
12	1.00	1.22	1.42	1.83	2.22	2.62
20	.946	1.14	1.32	1.73	2.25	3.05
30	0.889	1.05	1.21	1.54	2.06	2.98
40	0.850	0.993	1.12	1.37	1.77	2.61
50	0.822	0.949	1.06	1.28	1.58	2.29
60	0.802	0.921	1.02	1.21	1.42	1.95
100	.755	.755	.925	1.07	1.23	1.49

# Upper tail percentage points for D and V, Case 3.

# Statistic V

n	.25	.15	.10	.05	.025	.01	
10	1.30	1.48	1.65	1.96	2.27	2.57	
12	1.31	1.48	1.65	2.01	2.39	2,79	
20	1.24	1.39	1.53	1.89	2.36	3.15	
30	1.18	1.30	1.42	1.69	2.20	3.09	
40	1.15	1.25	1.34	1.53	1.91	2.74	
50	1.12	1.21	1.30	1.46	1.72	2.40	
60	1.10	1.19	1.26	1.40	1.47	2.10	
100	1.06	1.14	1.20	1.30	1.41	1.64	

# Table 2

		10µ	$\sigma^2 \times 10^2$	κ <sub>3</sub> × 10 <sup>3</sup>	κ <sub>4</sub> λ 10 <sup>4</sup>
w <sup>2</sup>	Case 0:	1.666	2.222	8.466	50.79
	Case 1:	.9068	.4052	.5099	.1015
	Case 2:	1.413	2.094	8.336	.5060
	Case 3:	.6585	.2769	. 3799	.8187
<sup>2</sup> ט	Case 0:	.8333	.2777	.2645	. 3968
	Cases 1,2:	.5800	.1495	.1345	. 1992
	Case 3:	. 327	.0211	$4.51 \times 10^{-3}$	1.58 x 10
		μ	$\sigma^2$	к <sub>3</sub>	ĸ4
a <sup>2</sup>	Case 0:	1	.5797	1.043	3.040
	Case l:	.6638	. 1872	. 1579	.2137
	Case 2:	.8422	.5249	1.006	3.003
	Case 3:	.5060	.1324	.1211	.1768

## Cumulants of asymptotic distributions

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Table 3

449         Trute (and Second)         Tests of fit for the Cauchy distribution based on the empirical distribution function         AuthoR(a)         M. A. Stephens         CAPORNING ORGANIZATION HAME AND ADDRESS         Department of Statistics         Stanford University         Stanford, CA 94305         CONTROLLING OFFICE NAME AND ADDRESS         Defice of Naval Research         Statistics & Probability Program Code 1111         Ib         MONITORING AGENEY NAME & ADDRESS(II different free Controlling Office)         Ib         ONSTRIBUTION STATEMENT (of the Aspect)         Approved for public release; distribution unlimited         OISTRIBUTION STATEMENT (of the observed in Block 70, If different free Reg         SUPPLEMENTARY NOTES         ASSTRACT (Confinement on records of the Inscensery and Identify by Noted matter)         Goodness-of-fit tests         ASSTRACT (Confinement on records of the Inscensery and Identify by Noted matter)         Goodness-of-fit tests	BEFORE COMPLETING FORM
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