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# PRACTICAL APPLICATIONS OF THE RUIN FUNCTION

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## ABSTRACT

The following paper is intended to acquaint actuaries with a simple and, we hope, practical application of the ruin function technique in the determination of the C-2 mortality risk reserve needed for individual life insurance business. The goal is not the introduction of any new mathematical theory, as this field has been admirably explored by the more capable hands acknowledged herein. Rather, the paper seeks to provide working actuaries with a readable nontechnical introduction to this subject.

The paper gives a qualitative explanation of the theoretical basis of the ruin function technique. Several variations of the theory are discussed and then applied to an actual life insurance company situation. The results of each method are compared. Some of the limitations of the ruin function approach are pointed out. Finally, a mathematical appendix is presented to allow the reader to apply these techniques without having to consult outside references.

In the final analysis, the reader should realize that contingency surplus quantification is in its infancy in most life insurance companies. Therefore, the application of methods to determine the appropriate surplus level is as much an art as it is a science. That is, in spite of the high-powered mathematical theory underlying risk analysis, the results must be scrutinized under the light of reason and experience.

#### I. BACKGROUND

At some point in almost every life actuary's career, he will be asked to examine an insurance company's current retention limit or evaluate its contingency surplus requirements. Three commonly posed questions along these lines are the following:

1. How much contingency surplus is realistically needed to cover the risk of random mortality fluctuations?

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- 2. How much additional risk is entailed when an insurance company increases its retention limit by a given amount?
- 3. How much surplus should be made available to cover random claim variations if a new line of business is to be introduced?

These questions can be approached in several different ways. Historically, many insurance companies have related retention limits and surplus requirements using industry-wide practices or "rule of thumb" techniques. An example of this would be setting a company's retention limit equal to 1 percent of its total capital and surplus.

Recently, however, actuaries have turned to statistical means to quantify variations in mortality experience. One of the first approaches was to use the distribution branch of collective risk theory. This generally involved examining one year's claims and establishing "confidence limits" as upper bounds of claims variation.

An alternative to the distribution branch of collective risk theory is the ruin function. Ruin theory holds the advantage over distribution theory of looking at ruin continuously rather than at discrete points. Based on some of the texts listed in the bibliography, the four basic techniques used in evaluating ruin functions are (1) the convolution method, (2) the Monte Carlo method, (3) the Laplace transform inversion method, and (4) the method of moments. The first two methods lend themselves to numerical solutions but generally require advanced computer hardware and are expensive to use. The third method, involving the Laplace transform, offers few analytical solutions but some hope in using numerical means. The last approach, the method of moments, is easy to apply and inexpensive but is restricted by the accuracy and detail of the underlying data.

Using a variation of the method of moments suggested by Mr. Newton L. Bowers [13] and Mr. John A. Beekman [8], one can inexpensively produce reasonable results over finite or infinite time frames using only limited data.

Ultimately, the actuary must take the results of whichever method he chooses and employ his best judgment as to their reasonableness. Such judgment must include a basic understanding of the principles underlying the method used, knowledge of current industry practices, and reflection of state insurance department desires.

## **II. MATHEMATICAL BASIS OF THE RUIN FUNCTION**

The formulation of the ruin function as described in Mr. Beekman's paper "A Ruin Function Approximation" [8] is briefly summarized: Underlying all the ruin theory work used in formulating this paper is a distribution function, P(z), which is the probability that, given that a claim

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has occurred, its amount will be less than or equal to amount z. From a practical standpoint, it is the estimation of this function that takes the most time and incurs the greatest expense in the practical application of the method. A detailed breakdown of claims and in-force data by age and face amount, as required in the ideal application, is generally laborious and expensive to derive.

Also defined is another function, N(t), which is the random number of claims occurring in time period t. However, time t is generally defined in terms of operational time or the time for a claim to occur or N(t) = t. That is, if a life insurance company were to have 50 claims in a calendar year, then t = 50 would represent one calendar year from an operational time point of view. Generally, N(t) is assumed to have a Poisson distribution as discussed in Mr. Paul M. Kahn's "An Introduction to Collective Risk Theory and Its Application to Stop-Loss Reinsurance" [19].

Based on these definitions, a value  $p_1$  can be found that is the first moment (or mean) of P(z). That is,  $p_1$  is the average amount of a claim, given that a claim has occurred. Therefore, the quantity  $p_1t$  can be thought of as an aggregate net premium over time t.

If claims never deviated from the mean, a premium equal to the net premium would cover claims, and there would be no need for concern about financial ruin due to adverse claims experience. However, this is not the case in the real world. Therefore, in addition to the net premium, a company must protect itself from ruin due to adverse fluctuations in claims experience by starting with an initial risk reserve (initial contingency surplus), usually denoted by u, and collecting an amount in addition to the net risk premium. The amount paid in addition to the net premium is called a security loading and is really part of the gross premium profit margin that the policyholder pays. That is, the gross premium, besides covering expenses and benefits, inherently provides for periodic contributions to a risk reserve to offset adverse experience. The security loading is often represented by  $\lambda$ ; and  $\lambda t$  represents the aggregate security loading collected through time t.

An additional item to be defined is the random variable  $X_i$ , which represents projected claim amounts. Therefore, each random variable  $X_i$  has as its distribution P(z), and  $\sum_{i=1}^{N(i)} X_i$  represents the aggregate claims paid up to time t.

Thus, the company's current risk reserve U(t) at time t, which is a measure of the likelihood of ruin, can be symbolically stated by

$$U(t) = u + (p_1 + \lambda)t - \sum_{i=1}^{N(t)} X_i.$$

Since U(t) is useful as a measure of potential ruin (ruin occurring when U(t) < 0), the ruin function is the probability that U(t) will become less than zero within a time period t. The key is to try to quantify those elements that affect U(t) so as to minimize the probability of ruin within certain limits.

This is done by defining an additional random variable Z. Z is defined as the maximum excess of claims over income, examined continuously. Symbolically,

$$Z = \max_{0 \le t < \infty} \left[ \sum_{i=1}^{N(t)} X_i - t(p_1 + \lambda) \right].$$

Since it is the random variable Z that is to be quantified, Z must somehow be estimated. On the basis of the work of Mr. Beekman and Mr. Bowers, we assert that the incomplete gamma function is a good approximation to Z.

Several underlying assumptions of collective risk theory should be pointed out before proceeding. Generally, collective risk theory deals with an "open" group having the attributes of (1) independence, (2) stationarity, and (3) exclusion of multiple events. The concept of an open group is comparable to a stationary population in which claimants are continually replaced. It is because of the open group assumption that the underlying mortality rate can be assumed to remain constant over time.

The assumption of independence is the basis for analyzing random mortality fluctuations. Independence implies that the occurrence of any one event is not influenced by nor does it influence the occurrence of any other events.

The concept of stationarity deals with the independence of the events with regard to commencement time. That is, the occurrence of events may be a function of the *duration* of a time period, but their occurrence should not be affected by the point at which the time measurement period starts.

The exclusion of multiple events is a simplifying assumption closely related to the independence of individual events and the choice of the Poisson distribution. It states that the probability of more than one claim occurring during an infinitesimal time interval is zero.

# III. MODEL COMPANY

To determine the practical applicability of the ruin function to the contingency surplus problem, some actual insurance company in-force data are needed for a test case. Because the values that are of greatest interest to this analysis are extreme variations from the mean, the need for accurate data in testing is paramount.

Based on data available from a medium-sized, general agency life insurance company, a life insurance model was developed. The data consisted of 24,000 policies segregated into bands by issue age and policy size. From these data and some valuation information, the average duration from issue and composite death rate were determined within each policy-size band. These composite death rates were assumed to remain constant in the future because the insureds were assumed to comprise an open group, as is consistent with the collective risk compound Poisson process. This allowed P(z) to be determined. The model company in-force data are shown in Table 1.

The detailed in-force data in the table permit several things. The first three moments of P(z), necessary for the Beekman-Bowers approximation to the ruin function, can be calculated. Also, the policy-size data can be changed to test different retention limits. The table shown implies an unlimited retention limit. If a \$50,000 retention limit were to be tested, the average policy size for policies in excess of \$50,000 in the above table would be set equal to \$50,000. This is because the actual financial effect

Average Policy Size	Policy Count	Composite Death Rate 1,000q	p(z)	P(z)
5 2,000	6,903	2.98	30.75%	30.75%
4,000	2,455	5.63	20.66	51.41
6,000	5,877	2.55	22.40	73.81
11,000	3,399	1.69	8.59	82.40
16,000	1,361	1.78	3.62	86.02
22,000	907	2.04	2.77	88.79
26,000	685	2.15	2.20	90.99
33,000	610	2.13	1.94	92.93
44,000	282	2.27	.96	93.89
50,000	708	2.61	2.76	96.65
63,000	84	2.85	.36	97.01
73,000	93	2.98	.41	97.42
83,000	55	2.28	.19	97.61
93,000	43	2.05	.13	97.74
100,000	370	2.85	1.58	99.32
130,000	20	1.82	.05	99.37
155,000	43	2.78	.18	99.55
226,000	79	2.84	.34	99.89
355,000	16	2.31	.06	99.95
550,000	4	4.19	.03	99.98
1,000,000	6	2.60	.02	100.00

TABLE 1

MODEL LIFE INSURANCE COMPANY IN-FORCE DATA

on the life insurance company would be the same whether a claim was \$50,000 or \$500,000.

If the Beekman-Bowers approach is going to be used, either (1) data such as given in the table must be available, (2) the first three moments of the distribution of a claim, given that a claim occurs, must be known, or (3) the moments of P(z) must be derived by making assumptions as to the mathematical characteristics of the distribution.

## IV. APPLICATION OF THE RUIN FUNCTION

Based on the extensive data from the model company, the necessary parameters to utilize the Beekman-Bowers approximation of the ruin function can be derived. The first analysis looks at an unlimited retention limit and an infinite operational time frame. Later in this paper, the results assuming a finite time period are discussed.

From the calculation of the first three moments of the distribution P(z), a grid is constructed that summarizes the various initial risk reserves or contingency surplus amounts needed at various probabilities of ruin and security loading percentages. A particular probability of ruin reflects the assigned probability of claims exceeding income plus the initial risk reserve. That is, a 1 percent level from the grid gives the required value of the initial risk reserve so that, along with the security loading assumption, the probability of ruin is one chance in 100. This can also be thought of as a confidence limit: with the risk reserve shown and the assumed security load, there is a 99 percent probability that ruin will not occur. Again, it should be emphasized that this is over an infinite time frame.

As mentioned previously, another important aspect of establishing a level of contingency surplus is estimating the level of security loading that is appropriate. The grid of initial risk reserve values looks at various confidence levels for various security loading assumptions. The security loading,  $\lambda$ , is usually taken as a percentage of the mean claims,  $p_1$ . Since this security loading is explicitly or implicitly built into the gross premium when a product is priced, the security loading appears to be intrinsically related to the pricing profit margins. Because the profit margin inherently contains loads for adverse fluctuations in all assumptions (interest, expenses, lapses, deaths, and so on), a good estimate of  $\lambda$  for individual life insurance policies might be the ratio of the present value of statutory profits to the present value of premiums. That is,  $\lambda$  might typically be about 5–10 percent of mean claims for many blocks of nonparticipating individual life insurance.

A summary of the resulting initial risk reserves for the unlimited retention, infinite time horizon situation is given in Table 2.

## RUIN FUNCTION ANALYSIS MODEL COMPANY DATA WITH GAMMA DISTRIBUTION UNLIMITED RETENTION, INFINITE TIME PERIOD (Results in \$1,000s)

SECURITY LOADING	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:							
AS A PERCENTAGE OF MEAN CLAIMS	10%	5%	1%	.1%	.01%			
1%	\$9,649	\$12,620	\$19,540	\$29,466	\$39,407			
2	4,895	6,436	10,034	15,207	20,397			
3	3,309	4,372	6,862	10,452	14,057			
4	2,514	3,339	5,275	8,072	10,885			
5	2,037	2,718	4,321	6,642	8,980			
6	1,717	2,303	3,684	5,688	7,709			
7	1,489	2,005	3,228	5,005	6,799			
8	1,317	1,782	2,885	4,492	6,116			
	1,183	1,608	2,618	4,092	5,584			
	1,075	1,468	2,403	3,772	5,158			
	749	1,044	1,755	2,805	3,873			
	581	827	1,426	2,315	3,223			
	408	603	1,086	1,814	2,562			
	317	485	909	1,554	2,222			
	259	410	797	1,393	2,012			

One interesting sidelight of the infinite time period ruin function approach is that it is independent of the number of policies exposed to risk, unlike the methods used in distribution theory.

An analysis of several different retention levels under the infinite time period assumption reveals the effects of limiting the maximum risk retained by an insurance company. Tables 3–6 look at retention limits of \$25,000, \$50,000, \$100,000, and \$200,000. As might be expected, the initial risk reserves increase smoothly from the \$25,000 retention and approach the unlimited retention level as an upper bound.

As can be seen from the tables, the values of the initial reserve amounts appear to be relatively smooth and monotonically changing according to changes in the security loading and the probability of ruin. The results from the ruin function look plausible for several reasons:

- 1. For a given probability of ruin, the initial risk reserve declines smoothly as the security loading increases.
- 2. For a given level of security loading, the initial risk reserve increases as the probability of ruin decreases.
- 3. In the aggregate, the lowest initial risk reserves occur at the lowest retention level.
- 4. The risk reserves increase between grids as the retention limit increases with the unlimited retention limit being the upper bound.

## RUIN FUNCTION ANALYSIS MODEL COMPANY DATA WITH GAMMA DISTRIBUTION \$25,000 RETENTION, INFINITE TIME PERIOD (Results in \$1.000s)

SECURITY LOADING AS A PERCENTAGE OF MEAN CLAIMS	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
	10%	5%	1%	.1%	.01%		
1%	\$1,734	\$2,258	\$3,474	\$5,214	\$6,954		
2	872	1,136	1,749	2,626	3,504		
3	584	762	1,174	1,764	2,353		
4	440	575	886	1,332	1,778		
5	354	462	714	1,074	1,433		
6	296	387	599	901	1,203		
7	255	334	517	778	1.039		
8	224	294	455	685	916		
9	200	263	407	613	820		
10	181	238	369	556	743		
15	124	163	254	383	513		
20	95	125	196	297	398		
30	66	88	138	210	282		
40	51	69	109	167	225		
50	42	57	92	141	190		

## TABLE 4

# Ruin Function Analysis Model Company Data with Gamma Distribution \$50,000 Retention, Infinite Time Period

(	Resu	its	in	\$1	.000s)
- 1				Ψ.	100000

SECURITY LOADING	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
AS A PERCENTAGE OF MEAN CLAIMS	10%	5%	1%	.1%	.01%		
1%	\$3,047	\$3,969	\$6,109	\$9,170	\$12,231		
2	1,532	1,998	3,078	4,625	6,171		
3	1,027	1,341	2,068	3,110	4,151		
4	775	1.012	1,563	2,352	3,141		
5	623	815	1,260	1,897	2,535		
6	522	683	1.058	1.594	2,131		
7	450	589	914	1,378	1,842		
8	396	519	805	1,215	1,625		
9	353	464	721	1.089	1.457		
10	320	420	654	988	1,322		
15	218	289	452	685	918		
20	168	223	350	533	716		
30	117	156	249	381	513		
40	91	123	198	304	411		
50	75	103	167	258	350		

# Ruin Function Analysis Model Company Data with Gamma Distribution \$100,000 Retention, Infinite Time Period

#### (Results in \$1,000s)

SECURITY LOADING	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
AS A PERCENTAGE OF MEAN CLAIMS	10%	5%	1%	.1%	.01%		
1%	\$4,795	\$6,247	\$9,619	\$14,445	\$19,272		
2	2,413	3,148	4,855	7,299	9,743		
3	1,619	2,114	3,267	4,916	6,567		
4	1,221	1,598	2,473	3,725	4,978		
5	983	1,288	1,996	3,010	4,025		
6	824	1,081	1,678	2,534	3,390		
7	711	933	1,451	2,193	2,936		
8	625	822	1,281	1,938	2,596		
9	559	736	1,148	1,739	2,331		
10	506	667	1,042	1,580	2,119		
15	346	460	724	1,103	1,483		
20	266	356	564	864	1.164		
30	186	251	404	624	845		
40	145	198	323	504	685		
50	120	166	275	431	589		

#### TABLE 6

## RUIN FUNCTION ANALYSIS MODEL COMPANY DATA WITH GAMMA DISTRIBUTION \$200,000 RETENTION, INFINITE TIME PERIOD (Results in \$1,000s)

SECURITY LOADING	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
AS A PERCENTAGE OF MEAN CLAIMS	10%	5%	1%	.1%	.01%		
1%	\$6,184	\$8,060	\$12,420	\$18,661	\$24,904		
2	3,115	4,068	6,283	9,455	12,630		
3	2,092	2,737	4,237	6,386	8,538		
4	1,580	2,071	3,214	4,852	6,492		
5	1,273	1,671	2,600	3,931	5,264		
6	1,068	1,405	2,190	3,317	4,446		
7	922	1,215	1,898	2,878	3.861		
8	812	1,072	1,678	2,549	3,422		
9	726	961	1,507	2,293	3.081		
10	658	871	1,370	2,088	2,807		
15	452	604	960	1,472	1.987		
20	348	469	754	1,164	1.577		
30	243	334	546	854	1.164		
40	190	265	441	698	957		
50	157	222	377	603	831		

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Although these general trends are logical, they do not lend credence to the ruin function as an accurate method of measuring the risk of ruin due to random claims. This can only be done by comparing the results to other statistical methods.

## V. DISTRIBUTION THEORY

As was mentioned previously, another method of measuring the risk of adverse claims experience is to use the distribution branch of collective risk theory. Again, this method uses the same sort of in-force data as was used for calculating the parameters for the gamma distribution approximation to the ruin function. However, the distribution theory looks only at various levels of adverse claims experience for one year's claims.

There are several methods for utilizing the distribution branch of risk theory for a problem such as this. One of the most recent methods is a compound Poisson method presented by Mr. Harry H. Panjer in his paper, "The Aggregate Claims Distribution and Stop-Loss Reinsurance" [20].

Table 7 summarizes the results from the model company using the Panjer method. Several things should be pointed out:

- 1. The method looks at one year's claims and calculates the extra reserve, an amount in excess of the mean claim amount, that should be established for various confidence limits. A 99 percent confidence limit indicates that there is one chance in 100 that the aggregate claims will exceed the confidence amount *plus* the mean claim amount.
- 2. The results using the Panjer method are dependent on the number of policies in force. This is unlike the infinite time horizon ruin function, which is independent of the policy count.
- 3. The results assume an unlimited retention limit.
- 4. The Panjer distribution theory does not examine the probability of ruin at each point in time. It looks at claims and excess claims at discrete points in time rather than continuously. That is, under the distribution theory approach, the company may appear solvent even though points of insolvency exist between the discrete points in time examined.
- 5. If the confidence limits numbers from the table can be thought of as a risk reserve, the method ignores the infusion of additional surplus from the security loads built into gross premiums.

To be consistent with the previously given ruin function tables, the table heading is labeled "probability of ruin" rather than "confidence limit." Because the distribution theory is a function of the number of policies studied, Table 7 summarizes the results for various portfolio sizes.

Some important items can be pointed out from the table. First, the risk reserve increases when going from the 2,400 policy case to the 24,000

# DISTRIBUTION THEORY ANALYSIS Model Company Data Using Panjer Method Unlimited Retention, One Year's Claims

NUMBER OF Policies	Mean	VAL	UE OF RISK RES	ERVE WITH PRO	BABILITY OF RU	л <b>n:*</b>
	CLAIM Amount	10%	5%	1%	.1%	.01%
2,400 24,000 240,000	\$ 80 802 8,020	\$81 3,224 1,068	\$ 136 3,507 1,435	\$285 4,090 2,179	\$ 962 4,840 3,101	\$1,112 5,527 3,931

#### (Results in \$1,000s)

\* The probability of ruin represents the probability that aggregate claims for the year will exceed the risk reserve given plus the mean claim amount.

policy case but declines in going from the 24,000 policy case to the 240,000 policy case. The principal reason for the increase in going from the 2,400 policy case to the 24,000 policy case is the tenfold increase in the mean claim amount. The principal reason for the decline in the risk reserve in going from the 24,000 policy case to the 240,000 policy case is that as the sample size increases to very large amounts, the confidence limits approach the mean claim amount. If the model had an infinitely large number of policies, then the risk reserve under this method would become zero as the probability of aggregate claims exceeding the mean claim amount becomes zero.

Second, the risk reserve amount does increase monotonically as the probability of ruin declines.

Third, a comparison of the results in Table 7 to the unlimited retentioninfinite time period ruin function results presented in Table 2 indicates that, at a 1 percent probability of ruin, the risk reserve using the Panjer method for the 24,000 policy case compares to the risk reserve assuming a security loading of 5-6 percent. For the company of medium to large size, the infinite time period ruin function appears to produce reasonable results based on the Panjer method. However, the method appears to overstate the risk reserve for a small company.

#### **VI. EXPONENTIAL FUNCTION**

Thus far the use of the gamma distribution approximation to the ruin function has required as much in-force detail as the Panjer method. The principal advantages to the use of the ruin function over the Panjer method are (1) the ruin function examines insolvency continuously rather than discretely, and (2) the ruin function can be viewed over an infinite time horizon versus looking at claims in one-year increments.

The next step with regard to an analysis of the applicability of the ruin function is to determine if there are any simplifying assumptions that can be made. In particular, are there any general assumptions that can be made with regard to the shape of the distribution P(z) such that reasonable risk reserve results can be generated utilizing limited policy data such as found in the NAIC convention blank? If this were possible, then the questions with regard to surplus requirements and retention limits could be answered without requiring detailed policy data, the compiling of which is time-consuming and expensive. It should be emphasized that the gamma distribution is still assumed to be a reasonable approximation to the ruin function; the remaining goal is to find an easy way to estimate the first three moments of P(z).

One suggested simplifying assumption is that the function P(z), the probability density function of claim size, given that a claim has occurred, can be approximated by an exponential function. If a function f(x) is exponential in form, it can be generalized by

$$f(x) = \beta e^{-x\beta}.$$

A detailed analysis of this assumption is given in the mathematical appendix to this paper, but from a practical point of view it implies that what is needed for the ruin function analysis is the average policy size and a retention limit assumption.

Based on the exponential assumption and the model insurance company average policy size, initial risk reserve amounts were constructed comparable to the original gamma distribution results. Tables 8–12 use the exponential assumption in the gamma approximation to the ruin function over an infinite time horizon at several retention limits.

A comparison of the results using an exponential distribution/gamma method and the full model detail using the gamma method is both encouraging and discouraging. The discouraging part arises because the results appear to be incompatible under the higher retention limit scenarios. This indicates that the exponential assumption is inappropriate for the model company on an unlimited retention basis. The principal reason for this is that the exponential function does not give adequate weight to the very large policy sizes. The results may also imply that the exponential assumption is inappropriate for most standard insurance companies.

The encouraging part is that the results assuming a smaller retention limit are much more compatible. Obviously part of the reason is that the low retention limits remove much of the weight that would be applied to

# RUIN FUNCTION ANALYSIS EXPONENTIAL CLAIM AMOUNT DISTRIBUTION, GAMMA DISTRIBUTION UNLIMITED RETENTION, INFINITE TIME PERIOD

#### (Results in \$1,000s)

SECURITY LOADING	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
AS A PERCENTAGE OF MEAN CLAIMS	10%	5%	1%	.1%	.01%		
1%         2         3         4         5         6         7	\$2,781	\$3,621	\$5,573	\$8,366	\$11,159		
	1,398	1,823	2,808	4,218	5,629		
	937	1,223	1,887	2,836	3,785		
	707	923	1,426	2,145	2,863		
	568	743	1,149	1,730	2,310		
	476	623	965	1,453	1,942		
	410	537	833	1,256	1,678		
8	361	473	734	1,107	1,481		
	322	423	657	992	1,427		
	292	383	596	900	1,204		
	199	263	411	623	835		
	153	203	319	485	650		
	106	142	226	346	466		
	83	112	179	276	373		
	68	93	151	234	317		

## TABLE 9

## RUIN FUNCTION ANALYSIS EXPONENTIAL CLAIM AMOUNT DISTRIBUTION, GAMMA DISTRIBUTION \$25,000 RETENTION, INFINITE TIME PERIOD (Results in \$1,000s)

SECURITY LOADING AS A PERCENTAGE OF MEAN CLAIMS	VAL	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
	10%	5%	1%	.1%	.01%			
1%	\$1,954	\$2,544	\$3,912	\$5,870	\$7,828			
2	982	1,278	1,967	2,953	3,938			
3	657	857	1,319	1,980	2,641			
4	495	646	995	1,494	1,993			
5	398	519	800	1,202	1,604			
6	333	435	671	1,008	1,344			
7	287	375	578	869	1,159			
8	252	329	509	765	1.020			
9	225	294	455	683	912			
10	203	266	411	619	826			
15	138	182	282	424	566			
20.	106	139	217	327	436			
30	73	97	152	229	307			
40.	57	76	119	180	242			
50	47	63	99	151	203			

## Ruin Function Analysis Exponential Claim Amount Distribution, Gamma Distribution \$50,000 Retention, Infinite Time Period (Results in \$1,000s)

SECURITY LOADING	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
AS A PERCENTAGE OF MEAN CLAIMS	10%	5%	1%	.1%	.01%		
1%	\$2,597	\$3,381	\$5,202	\$7,808	\$10,413		
2	1,305	1,701	2,619	3,933	5,246		
3	874	1,140	1,758	2,641	3,524		
4	659	860	1,327	1,995	2,663		
5	530	692	1,069	1.608	2,146		
6	444	580	897	1,349	1,802		
7	382	500	774	1,165	1,556		
8	336	440	681	1,026	1,371		
9	300	393	610	919	1,228		
10	271	356	552	833	1,113		
15	185	244	380	574	768		
20	142	188	293	445	596		
30	98	131	207	315	423		
40	77	103	164	250	337		
50	63	86	137	211	285		

#### TABLE 11

# RUIN FUNCTION ANALYSIS EXPONENTIAL CLAIM AMOUNT DISTRIBUTION, GAMMA DISTRIBUTION \$100,000 RETENTION, INFINITE TIME PERIOD

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(Results in \$1,000s)

SECURITY LOADING	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:						
AS A PERCENTAGE OF MEAN CLAIMS	10%	5%	1%	.1%	.01%		
1%	\$2,775	\$3,614	\$5,562	\$8,349	\$11.114		
2	1,395	1,819	2,802	4,209	5.616		
3	935	1.220	1.882	2,829	3.777		
4	705	921	1,422	2,140	2,857		
5	567	742	1,146	1,726	2,305		
6	475	622	962	1.450	1.937		
7	409	536	831	1.252	1.674		
8	360	472	732	1.105	1,477		
9	322	422	656	989	1.323		
10	291	382	594	897	1.201		
15	199	262	410	621	832		
20	152	202	318	483	648		
30	106	142	225	344	464		
40	82	111	179	275	371		
50	68	93	151	233	316		

## Ruin Function Analysis Exponential Claim Amount Distribution, Gamma Distribution \$200,000 Retention, Infinite Time Period

SECURITY LOADING AS A PERCENTAGE OF MEAN CLAIMS	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:					
	10%	5%	1%	.1%	.01%	
1%	\$2,781	\$3,621	\$5,573	\$8,366	\$11,159	
2	1,398	1,823	2,808	4,218	5,629	
3	937	1,223	1,886	2,836	3,785	
•	707	923	1,426	2,145	2,863	
5	568	743	1,149	1,730	2,310	
5	476	623	965	1,453	1,942	
7	410	537	833	1.256	1,678	
3	361	473	734	1,107	1,481	
	322	423	657	992	1.327	
10	292	383	596	900	1.204	
15	199	263	411	623	835	
20	153	203	319	485	650	
30	106	142	226	346	466	
40	83	112	179	276	373	
50	68	93	151	234	317	

(Results in \$1,000s)

the relatively few larger amount policies. If the retention limit being tested is relatively small (\$25,000-\$50,000) or the nature of the company's business is to issue smaller policies (less than \$100,000), the exponential assumption may be reasonable and only data found in the annual statement are required.

Further, if the actuary did not have the facility for a detailed in-force analysis or felt such an analysis would not warrant the expense, he might elect the exponential assumption realizing the results would not be as accurate as a more detailed model.

## VII. FINITE TIME RUIN FUNCTION ANALYSIS

Thus far, approximations to the ruin function have been viewed only over an infinite time horizon. An actuary might think that this is too conservative. Therefore, the question remains, can reasonable results be generated using some finite time period? The reader should be reminded that the time period is expressed in operational time, not in calendar time. A conversion from operational time to calendar time can be made by dividing the total operational units to be studied by the expected operational units in one calendar year. The expected operational units in one year is the expected number of claims in a year.

# 468 PRACTICAL APPLICATIONS OF THE RUIN FUNCTION

An approach to this question was suggested by Mr. Beekman and Mr. Bowers in their paper, "An Approximation to the Finite Time Ruin Function" [11, 12]. The results of using the Beekman-Bowers approximations for finite time intervals are summarized in Tables 13–16. The approximation was applied assuming an unlimited retention limit for calendaryear periods of one, five, ten, and twenty years.

Some anomalies occur that raise doubts concerning the reasonableness of the approximation, particularly when viewed over a short time period or at high probabilities of ruin. One of the anomalies is that the initial risk reserve, assuming a particular probability of ruin, first decreases but later increases as the security loading is increased. More reasonable results appear for the ten- and twenty-calendar-year scenarios with probabilities of ruin of 1 percent or less.

The reader should be cautioned with regard to the results of this method because of the inconsistencies in the reserve amounts and the limits posed by the use of operational time. With regard to the limits of operational time, the reader should be aware of the differences in operational time by company size. That is, the larger the company, the more units of operational time in one calendar year. The greater the number of units of operational time studied, the more the method approaches the infinite time situation and the more the results appear reasonable.

#### TABLE 13

# RUIN FUNCTION ANALYSIS Model Company Data with Gamma Distribution Unlimited Retention, One Calendar Year

SECURITY LOADING AS A PERCENTAGE OF MEAN CLAIMS	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:					
	10%	5%	1%	.1%	.01%	
%	\$403	\$561	\$ 943	\$1,512	\$2,092	
	264	497	1,180	2,326	3,564	
	183	422	1,212	2,624	4,184	
	151	386	1,211	2,729	4,422	
	143	375	1.206	2,745	4,466	
	146	377	1,200	2,718	4,412	
	154	386	1.194	2,669	4,311	
	165	398	1.186	2,610	4,188	
	177	409	1,177	2,546	4.057	
0	188	420	1.166	2,482	3.927	
5	233	453	1.099	2.187	3.361	
0	255	459	1.029	1,959	2,952	
0	259	435	906	1.653	2,439	
0	242	399	813	1.464	2,145	
0	219	363	743	1.336	1.959	

(Results in \$1,000s)

# RUIN FUNCTION ANALYSIS Model Company Data with Gamma Distribution Unlimited Retention, Five Calendar Years

Security Loading as a Percentage of Mean Claims	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:					
	10%	5%	1%	.1%	.01%	
1%	\$511	\$1,044	\$2,682	\$5,506	\$ 8,589	
2	316	833	2,702	6,177	10,067	
3	355	876	2,673	5,946	9,590	
4	437	956	2,618	5,541	8,752	
5	513	1,018	2,536	5,122	7,931	
6	573	1.055	2,439	4,736	7,206	
7	616	1.072	2,335	4,391	6,583	
8	643	1,072	2,232	4,086	6,051	
9	657	1,062	2,131	3,819	5,596	
10	603	1.044	2,035	3,583	5,205	
15	619	914	1,649	2,763	3,913	
20	539	784	1,390	2,299	3,233	
30	404	599	1.082	1.811	2.561	
40	317	485	908	1,554	2,222	
50	259	410	797	1,393	2,012	

## (Results in \$1,000s)

## TABLE 15

## RUIN FUNCTION ANALYSIS MODEL COMPANY DATA WITH GAMMA DISTRIBUTION UNLIMITED RETENTION, TEN CALENDAR YEARS (Results in \$1,000s)

Security Loading as a Percentage of Mean Claims	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:					
	10%	5%	1%	.1%	.01%	
1%	\$520	\$1,268	\$3,839	\$8,517	\$13,719	
2	492	1,228	3,788	8,474	13.692	
3	666	1.395	3,666	7,608	11,919	
4	814	1.498	3,469	6,743	10,269	
5	905	1.531	3,241	5,997	8,926	
6	949	1.517	3.014	5.371	7.852	
7	961	1.476	2,800	4.851	6.991	
8	951	1.421	2.606	4.418	6.297	
9	928	1.359	2,432	4.056	5,733	
10	897	1.295	2.277	3.754	5.272	
15	720	1.016	1.735	2.801	3,890	
20	577	823	1.422	2.314	3.225	
30	408	603	1.086	1.814	2,562	
40	317	485	909	1.554	2.222	
50	259	410	797	1,393	2,012	

## RUIN FUNCTION ANALYSIS MODEL COMPANY DATA WITH GAMMA DISTRIBUTION UNLIMITED RETENTION, TWENTY CALENDAR YEARS (Results in \$1.000s)

Security Loading as a Percentage of Mean Claims	VALUE OF INITIAL RISK RESERVE WITH PROBABILITY OF RUIN:					
	10%	5%	1%	.1%	.01%	
1%	\$ 628	\$1,662	\$5,404	\$12,374	\$20,181	
2	920 1,220	2,157	5,214 4,789	9,106	17,134	
4	1,355	2,164	4,298	7,661 6 544	11,202	
<u>6</u>	1,340	1,942	3,434	5,686	8,007	
<i>1</i>	1,272	1,802	2,812	5,023 4,508	6,239	
9 10	1,113	1,543	2,577 2,380	4,102 3,777	5,655 5,197	
15	747	1,042	1,754	2,805	3,874	
30	381 408	603	1,426	1,814	2,562	
40 50	317 259	485 410	909 797	1,554 1,393	2,222 2,012	

One additional item from the Beekman-Bowers paper should be pointed out. The authors prove a theorem which places an upper limit on the value of the ruin function. Briefly put, if  $\psi(u, T)$  is the probability of ruin given initial reserve u and over finite operational time period T, then

$$\psi(u, T) \leq \frac{p_2 T}{u^2},$$

where  $p_2$  is the second moment of P(z) and u > 0.

## VIII. OTHER CONSIDERATIONS

In addition to the matters discussed in earlier sections, there are several items that should be addressed.

First, the results ignore the reserves released by death. That is, the risk reserves shown in the tables are conservative because they do not reflect that part of the face amount paid at death arises from the release of the reserve underlying the policy. One possible approximation to this quantity might be derived by taking the ratio of the reserves released by death from page 6 of the annual statement to claims incurred before reinsurance from Exhibit 11. One minus this ratio times the risk reserve might be thought of as the net risk reserve.

Second, the effects of interest were ignored. A zero interest rate is a simplifying and conservative assumption.

Third, the savings in reinsurance premiums were neglected. If a company increases its retention limit, an allocation of surplus is required to reserve for adverse claims fluctuation with regard to the additional risk. However, the cost of the allocation of surplus should be reduced by the loading portion of the additional reinsurance premiums that it would have paid if it had not increased its retention limit.

In conclusion, the ruin function can be an effective tool for measuring contingency surplus and retention limit requirements, provided the actuary understands and appreciates the limitations of the methods employed.

# MATHEMATICAL APPENDIX

# APPROXIMATION OF THE RUIN FUNCTION BY USE OF THE INCOMPLETE GAMMA DISTRIBUTION

Probability of ruin  $\psi(u)$  given an initial risk reserve of u and security loading of  $\lambda = \theta p_1$  ( $\theta = a$  percentage,  $p_1 = the$  expected amount of a claim, given that a claim occurs):<sup>1</sup>

$$\psi(u) = \frac{p_1}{p_1 + \lambda} \left[ \int_u^{\infty} \frac{t^{\alpha - 1} e^{-t/\beta}}{\Gamma(\alpha) \beta^{\alpha}} dt \right],$$

where

 $\Gamma(\alpha)$  = The complete gamma function =  $\int_0^\infty t^{\alpha-1}e^{-t}dt$ ;

$$\beta = \frac{2p_3}{3p_2} + \frac{p_2}{2\lambda} \left(1 - \frac{\lambda}{p_1}\right);$$
$$\alpha = \frac{p_2}{2\lambda} \left(\frac{p_1 + \lambda}{p_1}\right) \left(\frac{1}{\beta}\right);$$

 $p_n = n$ th moment of the distribution of the amount of claim, given that a claim occurs.

The initial integral shown above can be calculated by the following procedure.

The integral is standardized to the following:

$$\int_x^\infty t^{\alpha-1}e^{-t}dt, \quad x=u/\beta.$$

This integral is solved by two methods, the choice depending on whether x is greater or less than  $\alpha + 5$ . (This relationship was found to yield acceptable convergence for each method after some testing.)

<sup>1</sup> John A. Beekman [8].

1. Series expansion  $(x < \alpha + 5)$ :

$$\int_0^x t^{\alpha-1}e^{-t}dt = e^{-x}\left[\frac{x^{\alpha}}{\alpha} + \frac{x^{\alpha+1}}{\alpha(\alpha+1)} + \frac{x^{\alpha+2}}{\alpha(\alpha+1)(\alpha+2)} \dots\right]$$

2. Continued fraction ( $x \ge \alpha + 5$ ):

$$\int_{x}^{\infty} t^{\alpha-1} e^{-t} dt = e^{-x} x^{\alpha} \left[ \frac{1}{x+1} \frac{1-\alpha}{1+x+1} + \frac{1}{x+1} \frac{2-\alpha}{1+x+1} + \cdots \right].$$

The fraction

$$\left[\frac{1}{x+1-\alpha}\frac{1-\alpha}{1+x+1}\frac{2-\alpha}{1+x+1}\frac{1}{x+1}\cdots\right]$$

is calculated by the method of convergents and is equal to the kth convergent when  $p_k/q_k = p_{k-1}/q_{k-1}$  within a specified degree of tolerance. Let

$$d_{2m} = m - \alpha, \quad d_{2m+1} = m;$$
  
 $p_0 = 0, \quad q_0 = 1, \quad p_1 = 1, \quad q_1 = x;$ 

then the convergents are calculated recursively by the following formula for  $m = 1, 2, 3 \dots k$ :

$$p_{2m} = p_{2m-1} + d_{2m}p_{2m-2};$$

$$q_{2m} = q_{2m-1} + d_{2m}q_{2m-2};$$

$$p_{2m+1} = xp_{2m} + d_{2m+1}p_{2m-1};$$

$$q_{2m+1} = xq_{2m} + d_{2m+1}q_{2m-1}.$$

To calculate u for a given value of  $\psi(u)$ , the following iterative formula was derived based on the initial formula using Newton's method. The starting value of u was set equal to  $\alpha\beta$ , which is the expected value of aggregate claims.

$$u_{n+1} = u_n + \beta \frac{\left[\left(\int_x^\infty t^{\alpha-1} e^{-t} dt\right) - \psi(u_n)(1+\theta)\right] \Gamma(\alpha)}{x^{\alpha-1} e^{-x}}.$$

FINITE TIME RUIN FUNCTION (GAMMA METHOD)<sup>2</sup>

This method approximates the function  $\psi(u, T)$  (the probability of ruin within T units of operational time given an initial risk reserve of u). Note: operational time is the average interval between claims; thus, one year of real time would equal the expected number of claims in a year's units of operational time.

<sup>2</sup> John A. Beekman and Newton L. Bowers [11].

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The method proceeds to develop  $\alpha$ ,  $\beta$ , and  $P(Z_T = 0)$ . Then

$$\psi(u,T) = [1-P(Z_T=0)] \left[ \int_u^\infty \frac{t^{\alpha-1}e^{-t/\beta}}{\Gamma(\alpha)\beta^{\alpha}} dt \right].$$

The above formula is calculated by the method shown previously. It should be noted that when  $T = \infty$ ,  $\psi(u) = \psi(u, T)$  and  $\alpha$  and  $\beta$  equal the  $\alpha$  and  $\beta$  defined in the initial formula, and  $[1 - P(Z_T = 0)] = p_1/(p_1 + \lambda)$ .

The following shows the development of  $\alpha$ ,  $\beta$ , and  $P(Z_T = 0)$  for the finite time gamma method.

 $\theta$  = Security loading percentage;

$$p_n = n$$
th moment of the amount of a claim given that a claim occurs;

$$\begin{split} \lambda &= \theta p_{1}; \\ A &= 1 - e^{-8.5\theta}; \\ B &= \frac{A(p_{2} - 2\lambda p_{1})}{p_{3}(3\lambda + p_{2}^{2}/2\lambda^{2})}; \\ \alpha_{1} &= \frac{1}{2}[A + \sqrt{(A^{2} - 4B)}]; \\ \alpha_{2} &= \frac{1}{2}[A - \sqrt{(A^{2} - 4B)}]; \\ C_{2} &= \frac{p_{1} - \alpha_{1}p_{2}/2\lambda}{\sqrt{(A^{2} - 4B)}}; \\ C_{1} &= -C_{2} - \frac{p_{2}}{2\lambda}; \\ C_{3} &= \frac{p_{3}}{3\lambda} + \frac{p_{2}^{2}}{2\lambda^{2}}; \\ C_{5} &= \frac{p_{2} - \alpha_{1}C_{3}}{\sqrt{(A^{2} - 4B)}}; \\ C_{4} &= -C_{5} - C_{3}; \\ C_{7} &= \frac{Bp_{2}/2\lambda - \alpha_{2}p_{1}}{(p_{1} + \lambda)\sqrt{(A^{2} - 4B)}}; \\ C_{6} &= \frac{p_{1}}{p_{1} + \lambda} - C_{7}; \\ E[Z_{T}] &= \frac{p_{2}}{2\lambda} + C_{1}e^{-\alpha_{1}T} + C_{2}e^{-\alpha_{2}T}; \end{split}$$

$$E[Z_{T}^{2}] = C_{3} + C_{4}e^{-\alpha_{1}T} + C_{5}e^{-\alpha_{2}T};$$

$$P[Z_{T} = 0] = \frac{\lambda}{p_{1} + \lambda} + C_{6}e^{-\alpha_{1}T} + C_{7}e^{-\alpha_{2}T};$$

$$\beta = \frac{E[Z_{T}^{2}]}{E[Z_{T}]} - \frac{E[Z_{I}]}{(1 - P[Z_{T} = 0])};$$

$$\alpha = \frac{E[Z_{T}]}{\beta(1 - P[Z_{T} = 0])}.$$

## GAMMA METHOD—EXPONENTIAL DISTRIBUTION

The following formulas show the development of the first three moments of p, for use with the gamma method, based on an exponential distribution.

$$R = \text{Retention limit;}$$

$$\beta = \frac{1}{(\text{Average policy size})} \qquad \text{(without regard to retention limit restrictions);}$$

$$f(x) = \beta e^{-x\beta} \quad (\text{exponential distribution});$$

$$p_1 = \int_0^R x\beta e^{-x\beta}dx + \int_R^\infty R\beta e^{-x\beta}dx$$

$$= \frac{1}{\beta} - \frac{e^{-R\beta}}{\beta};$$

$$p_2 = \int_0^R x^2\beta e^{-x\beta}dx + \int_R^\infty R^2\beta e^{-x\beta}dx$$

$$= \frac{2}{\beta^2} - \frac{2Re^{-R\beta}}{\beta} - \frac{2e^{-R\beta}}{\beta^2};$$

$$p_3 = \int_0^R x^3\beta e^{-x\beta}dx + \int_R^\infty R^3\beta e^{-x\beta}dx$$

$$= \frac{6}{\beta^3} - \frac{3R^2e^{-R\beta}}{\beta} - \frac{6Re^{-R\beta}}{\beta^2} - \frac{6e^{-R\beta}}{\beta^3}.$$

Exhibit 1 shows the function IGAM written in the APL language, which evaluates the incomplete gamma integral in the following form:

$$\frac{1}{\Gamma(\alpha)}\int_x^\infty t^{\alpha-1}e^{-t}dt.$$

EXHIBIT 1

```
V ZEA IGAM XIALIALIIZIIPIBIMIZO
```

```
E 1 3
       A EVALUATES THE INCOMPLETE GAMMA INTEGRAL BETWEEN X AND INFINITY FOR ALA.
```

[2]

C31 XEOFX & DOES NOT ALLOW X ( 0.

- r 4 1 +(X)A+5)/BR & ALLOWS BRANCHING TO 'BR' IF X)A+5.
- CS1 AL1+AL+A
- [6] 22+21+0
- C73 A THE FOLLOWING LOOP CALCULATES THE INTEGRAL BY SERIES EXPANSION.
- [B] LOOP1:21+21+.00000001xL.5+100000000x((\*-×)x(\*\*AL)+AL1)+:A-1
- [9] Z+1-Z1
- [10] -OX122=21 & PRANCHES OUT OF LOOP IF 22=21 TO 8 DECIMAL PLACES.
- E113 Z2+Z1

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- C12] AL1+AL1XAL+AL+1
- [13] →LOOF1
- [14] BR:F+0,M+1
- [15] @+1.X

[16] A THE FOLLOWING LOOP CALCULATES THE INTEGRAL BY CONTINUED FRACTIONS.

[17] LOOP2;Z+\*1+Z1+.0000001xL.5+10000000x(P+0)x(x-X)x(XxA)+:A-1

[18] +0x1=/21 & BRANCHES DUT OF LOOP IF THE LAST 2 CONVERGENTS ARE EQUAL TO 8 DECIMAL FLACES.

[19] P+1+P++/(M+X)xP+1+P+/Px(M-A)+1

- $[20] = R+1+R_{+}/(M_{+}X) \times R+1+R_{+}/R \times (M-A) + 1$
- [21] M+M+1
- [22] +LOOP2
  - Ð

PRACTICAL APPLICATIONS OF THE RUIN FUNCTION

The function is dvadic with the left argument being the value of  $\alpha$  and the right argument being the value of x. The function eliminates the need to use tables of the incomplete gamma density function and greatly reduces the effort required in applying the methodology outlined in the paper.

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# DISCUSSION OF PRECEDING PAPER

#### JOHN A. BEEKMAN:

The authors of this paper have performed a great service by demonstrating uses of collective risk theory in the determination of the C-2 mortality risk reserve needed for individual life insurance business.

Since the publication of references [8], [9], [11], [12], and [14] of the paper, there have been a number of articles written which have discussed the accuracy of the gamma function approximate method for computing  $\psi(u)$ . The following contains my observations on those papers in addition to the present one.

The results on E(Z) and Var(Z) derived in [7] were accurate, subject to the Poisson distribution for N(t),  $t \ge 0$ . It was acknowledged from the outset that the method was more accurate for  $\psi(u)$  than for  $\psi(u, T)$ . However, for a large portfolio,  $E\{N(t)\}$  could be 1,000 or so per year, justifying the use of the  $\psi(u)$  technique. A key point is that some alternative techniques are so complicated that few practicing actuaries would use them. A very fine technique for approximating  $\psi(u)$  developed by Olof Thorin and Nils Wikstad is introduced in [10], pages 74–76. However, to understand their method, the actuary should study the theory of functions of complex variables. One idea in the Thorin-Wikstad papers, which is helpful and can improve the accuracy of the gamma function methods, is to use a weighted sum of five exponential distributions, rather than a single exponential distribution, for P(z), the distribution of a single claim given that a claim has occurred. (See [10], 45, 46, 183, and 184.)

Another convolution type series for  $\psi(u)$  is in [7], but it seemed to have little utility. It now appears to offer potential for practical calculations. Some approximations to the series, including error analyses and examples, are presented in:

- J. A. Beekman and C. P. Fuelling, "Risk Convolution Calculations," Scandinavian Actuarial Journal, 1981, 151-64.
- J. A. Beekman, "Risk Convolution Calculations II," pages 19-30 of *Premium Calculation in Insurance*, F. deVylder et al. (eds.), D. Reidel Publishing, Dordrecht, Holland, 1984.

I am pleased that the authors applied the techniques of Harry Panjer to the same problem. Dr. Panjer's method is excellent and very helpful to the actuary. Section V of this paper is most valuable.

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The ruin function ideas can also be used in other settings. Dr. Clinton P. Fuelling and I used the same methods in modeling computer usage at our university. That paper ("A Stochastic Model of Computer Use," C. P. Fuelling and J. A. Beekman, *Scandinavian Actuarial Journal*, 1980, 43–52) also contained a simple algorithm for computing gamma distribution values. We join the authors in wanting to eliminate the need for using tables of the incomplete gamma density function.

Collective risk theory has been studied for many years and includes beautiful mathematical work by Professor Harald Cramér and other researchers. (See [6].) But the ultimate test of the theory is whether it will be used. This excellent paper by Reckin, Schwark, and Snyder assures me that it will.

## ELIAS S.W. SHIU:

In applying the method described in the paper, one should keep four points in mind. First, as pointed out in section VIII of the paper, the rate of interest is assumed to be zero in the model. However, in individual life insurance the interest rate is usually a much more dominant factor than the mortality rates. Second, it seems doubtful that the concept of an "open" group can be applied to individual life insurance. Indeed, H.L. Seal [11] concluded his note "The Poisson Process: Its Failure in Risk Theory" with the statement: "Poisson, renewal and Ammeter point processes have never been shown to occur in actuarial work." Third, the Beekman-Bowers approximation may not be sufficiently accurate. Seal ([10], p. 62) wrote that he would be reluctant to recommend its use. H.U. Gerber ([7], p. 128) suggested that "unless  $\alpha = 1$  and  $\beta = 1/R$ , the relative error of this approximation may become considerable if u is very large." (Here R denotes the adjustment coefficient, not the retention limit as in the paper.) Fourth, no limit is imposed on the growth of the risk reserve ([6], p. 10).

It should be pointed out that if the probability density function of claim size given that a claim has occurred, p(x), is exponential, the Beekman-Bowers approximation is exact ([1], p. 50). Let

$$p(x) = be^{-bx}, \qquad x \ge 0.$$

It is easy to verify that

$$\beta = \frac{1+\theta}{b\theta}$$

and

 $\alpha = 1.$ 

Hence,

$$\frac{1}{1+\theta}\int_{u}^{\infty}\frac{t^{\alpha-1}}{\Gamma(\alpha)\beta^{\alpha}}dt=\frac{1}{1+\theta}e^{-ub\theta/(1+\theta)}.$$
 (1)

On the other hand, we have the following exact formula ([3], equation (12.6.9)):

$$\int_0^{\infty} e^{ur} (-\psi'(u)) du = \frac{\theta}{1+\theta} \cdot \frac{M_X(r) - 1}{1+(1+\theta)p_1r - M_X(r)}.$$
 (2)

Since  $M_X(r) = b/(b - r)$ , we have

$$\psi(u) = \frac{1}{1+\theta} e^{-ub\theta/(1+\theta)},$$

which is the right-hand side of equation (1). Thus the Beekman-Bowers approximation is exact when p(x) is an exponential function. For details of the last calculation, see example 12.9 of [3].

A variant of formula (2) in queueing theory is called the Pollaczek-Khintchine formula ([9], p. 120). An elegant proof of it can be found in section 6 of [8]. We now give a proof of formula (2) which is perhaps more direct than the proof given in [3]. (Cf. [2], p. 272; [4], p. 149; [7], p. 114.) Assume that  $E(N(t)) = \lambda t$ . The probability that the first claim shall occur at time t is  $\lambda e^{-\lambda t} dt$ . The probability that this claim shall amount to x is p(x)dx. The company is ruined by this claim if and only if

$$x > u + ct$$

where

$$c = (1 + \theta)\lambda p_1.$$

Thus, we have the integral equation

$$\psi(u) = \int_0^\infty \left( \int_0^{u+ct} \psi(u + ct - x)p(x)dx + \int_{u+ct}^\infty p(x)dx \right) \lambda e^{-\lambda t} dt.$$

With the change of variable s = u + ct, this equation becomes

$$\psi(u) = \frac{\lambda}{c} \int_{u}^{\infty} \left( \int_{0}^{s} \psi(s-x)p(x)dx + \int_{s}^{\infty} p(x)dx \right) e^{-\lambda(s-u)/c} ds.$$

Putting  $\rho = c/\lambda$  and using the notation

$$(f * g)(z) = \int_0^z f(z-x)g(x)dx, \qquad z > 0,$$

we have

$$\rho \psi(u) = e^{u/\rho} \int_{u}^{\infty} [(\psi * p) (s) + 1 - P(s)]e^{-s/\rho} ds.$$

Differentiating, we obtain the integro-diffential equation

$$\rho \psi'(u) = \psi(u) - [(\psi * p)(u) + 1 - P(u)].$$
(3)

Let us multiply equation (3) by  $e^{ru}$  and integrate with respect to u from 0 to  $\infty$ . Integrating by parts, we have

$$\int_0^\infty e^{ru} \psi(u) du = \left[ -\psi(0) + \int_0^\infty e^{ru} (-\psi'(u)) du \right] / r$$

and

$$\int_0^\infty e^{ru} (1 - P(u)) du = [-1 + M_X(r)]/r.$$

Since

$$\int_0^\infty e^{ru}(\psi * p)(u)du = \left(\int_0^\infty e^{ru} \psi(u)du\right)M_X(r),$$

we obtain

$$\int_0^\infty e^{ru}(-\psi'(u))du = (1 - \psi(0)) \frac{M_X(r) - 1}{1 - M_X(r) + \rho r}.$$
 (4)

Hence formula (2) is proved if we can show that

$$\psi(0) = 1/(1 + \theta).$$
 (5)

To prove (5), consider equation (4) with r tending to zero. The left-hand side of (4) converges to

$$-\int_0^\infty \psi'(u)du = \psi(0) - \psi(\infty)$$
$$= \psi(0).$$

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By L'Hôpital's Rule, the right-hand side of (4) converges to

$$(1 - \psi(0)) \frac{M'_X(0)}{-M'_X(0) + \rho}.$$

Since

$$M_X'(0) = p_1$$

and

 $\rho = (1 + \theta)p_1,$ 

formula (5) is proved.

We now give another proof of (5) which might be of pedagogical interest since we are treating the convolution as the multiplication operator in a commutative ring. Consider the convolution of (3) with the constant function 1:

$$\rho \psi' * 1 = (\psi - \psi * p - 1 + P) * 1$$
  
= \psi \* 1 - \psi \* p \* 1 - (1 - P) \* 1.

Since

$$(f * 1)(u) = \int_0^u f(x) dx$$

and P(0) = 0 by hypothesis,

$$\rho(\psi(u) - \psi(0)) = (\psi * 1)(u) - (\psi * P)(u) - \int_0^u (1 - P(x))dx$$
$$= (\psi * (1 - P))(u) - \int_0^u (1 - P(x))dx.$$
(6)

It can be shown that

.

$$\lim_{u\to\infty} (\psi * (1 - P))(u) = 0;$$

thus

$$\rho(0 - \psi(0)) = 0 - \int_0^\infty (1 - P(x)) dx$$
$$= -p_1.$$

Hence

$$\psi(0) = p_1/\rho$$
$$= 1/(1 + \theta)$$

as required. We note that exercise 11 in chapter 12 of [3] is an immediate consequence of equations (5) and (6).

In theory, formula (2) can be used to determine  $\psi$  for each given  $M_X$ . The appendix gives an integral representation for  $\psi$ , but such contour integrals can be difficult to evaluate. However, if p is a finite sum of exponential functions, we can derive an elegant expression for  $\psi$  as follows. By the method of partial fractions, we have

$$\frac{\theta}{1+\theta} \cdot \frac{M_X(r) - 1}{1+(1+\theta)p_1r - M_X(r)} = \sum_{i=1}^n \frac{C_i r_i}{r_i - r}$$
(7)

(see section 12.6 of [3]). Thus, by formula (2)

$$\Psi(u) = \sum_{i=1}^{n} C_i e^{-r_i u}.$$
 (8)

To find the coefficient  $C_j$ , multiply (7) by  $r_j - r$  and let r tend to  $r_j$ . Since

$$\lim_{r \to r_j} \frac{r_j - r}{1 + (1 + \theta)p_1 r - M_X(r)} = \frac{-1}{(1 + \theta)p_1 - M'_X(r_j)},$$

we obtain

$$\frac{\theta}{1+\theta}\cdot\frac{M_X(r_j)-1}{M'_X(r_j)-(1+\theta)p_1}=C_jr_j,$$

or

$$C_{j} = \frac{\theta p_{1}}{M'_{X}(r_{j}) - (1 + \theta)p_{1}}.$$
(9)

Formula (9) can be found on page 82 of [5], where it is derived by the residue theorem.

The following two relations can be useful for checking values. From equations (5) and (8) we immediately have

$$\frac{1}{1+\theta} = \sum_{i=1}^n C_i.$$

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Multiply (7) by r; since  $\lim_{r \to \infty} M_X(r) = 0$ , we obtain

$$\frac{\theta}{(1+\theta)^2 p_1} = \sum_{i=1}^n C_i r_i.$$

To conclude this discussion let me mention some references on ruin probabilities. Seal's book [10] is concerned with numerical probabilities of ruin in a finite time period for nonlife insurance companies. There are thirtythree pages of FORTRAN computer programs in its appendix. The book is supplemented by [12]. Thorin's paper [14] is a systematic review of his results on ruin probabilities. Its emphasis is on the calculation of the ruin probability for a finite time period by the Wiener-Hopf technique, under the assumption that the epochs of claims follow a renewal process.

## APPENDIX

Denote the right-hand side of (2) by g(r). Since

$$\int_0^\infty e^{ru} \psi(u) du = \left[-\psi(0) + g(r)\right]/r,$$

applying the complex inversion formula for the Laplace transformation ([13], chapter 7) gives

$$\psi(u) = \frac{1}{2\pi i} \int_{a-i\infty}^{a+i\infty} \frac{-\psi(0) + g(r)}{r} e^{-ru} dr, \qquad a < 0.$$
(10)

As

$$\lim_{r \to 0} g(r) = 1/(1 + \theta)$$
$$= \Psi(0),$$

the point r = 0 is a removable singularity. Thus formula (10) can be simplified as

$$\psi(u) = \frac{1}{2\pi i} \int_{c-i\infty}^{c+i\infty} \frac{g(r)}{r} e^{-ru} dr, \qquad 0 \le c \le R,$$

where R is the adjustment coefficient. This formula is equation (118) of [5].

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#### (AUTHORS' REVIEW DISCUSSION)

GEORGE E. RECKIN, DANIEL J. SCHWARK, AND JOHN B. SNYDER:

We wish to thank Professors Beekman and Shiu for the thought provoking comments outlined in their discussions.

Professor Beekman has pointed with encouragement to several alternative ruin probability evaluation methods. These methods would appear to hold considerable promise in areas of practical application. We would encourage all interested readers to investigate them more fully. It is unfortunate, however, that so much of the literature on this exciting subject is available only through foreign publications which are not often accessible to practicing actuaries.

Professor Shiu raises some fine points concerning the accuracy of the gamma approximation. We agree that ignoring interest in an infinite time ruin model is very conservative. In practice, however, we have found that the ruin technique still generates much higher feasible retention limits and lower risk reserve requirements than most insurance executives would comfortably employ.

## DISCUSSION

We disagree with Professor Shiu's comments concerning the inaccuracy of the Poisson process in a real insurance company. In this regard, Professor Beekman was kind enough to supply some unpublished data developed by the late David Halmstad concerning the accuracy of the Poisson assumption in a large life insurance company. The results of this study verified the accuracy of the Poisson assumption using chi-square tests.

Professor Shiu also questions the accuracy of the Beekman-Bowers approximation. Although the accuracy of the method cannot be proven in a purely mathematical sense, except under some restricted assumptions, our experience with this and other risk theory techniques indicates that the method remains very useful as a guide to working actuaries. Practical work in this area is as much art and politics as science, and no method can be ascribed full credibility.

We hope that this paper and its discussion will encourage other actuaries to investigate and utilize the variety of statistical techniques that exist in this field. .

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