

# Application Of Munich Chain Ladder For An Albanian DMTPL Portfolio

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**Abstract**—The most used method for the estimation of claims reserve is the Chain Ladder method. The actuaries apply the chain ladder method independently to the paid claims and to the incurred claims triangles. The Munich Chain Ladder method combine both triangles, by taking the paid-incurred ratios into account in projections.

**Keywords**—Munich Chain Ladder; Standard Chain Ladder; Run-off triangle; Claims reserving; Incurred Claims, Paid Claims; P/I ratios

## I. INTRODUCTION

Using the Standard Chain Ladder (SCL) method the claims reserve is calculated based on the run-off triangles of paid claims and on the run-off triangles of the incurred claims. Many times the projections based on the paid claims are different that the projections based on the incurred claims. The solution for this problem is the Munich Chain Ladder (MCL) method. We apply MCL to an Albanian DMTPL portfolio. The paid (P) claims triangle and the incurred (I) claims triangle cover ten accident years and also ten development years. The values are in Albanian currency.

## II. MUNICH CHAIN LADDER METHOD

### A. Mack Chain Ladder Model

We denote  $n \in \mathbb{N}$  the number of accident years and  $T = \{1, 2, \dots, m\}$  the development years,  $m \in \mathbb{N}$  and generally  $m = n$ ;  $P_i = (P_{i,t})_{t \in T}$  and  $I_i = (I_{i,t})_{t \in T}$  denote respectively the paid claims process and the incurred claims process. The processes  $P_i$  and  $I_i$  describe the development of the paid and the incurred claims.

$P_i(s) = \{P_{i,1}, \dots, P_{i,s}\}$  represent the condition that the paid development of accident  $i$  is given until the end of development year  $s$  and  $I_i(s) = \{I_{i,1}, \dots, I_{i,s}\}$  for the condition that the incurred development of accident  $i$  is given up to and including  $s$ . [2]

The assumptions for the paid processes are:

- Expectation assumption PE
- Variance assumption PV
- Independence assumption PU, that means the accident years are stochastically independent

The assumptions for the incurred processes are:

- Expectation assumption IE
- Variance assumption IV
- Independence assumption IU, that means the accident years are stochastically independent

These assumptions does not say anything about the relationships between paid and incurred processes. If we knows the paid run-off triangle and the incurred run-off triangle, we can make projections based on the conditional expectations [2]

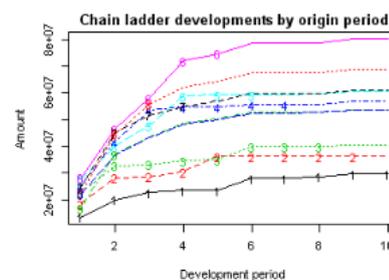
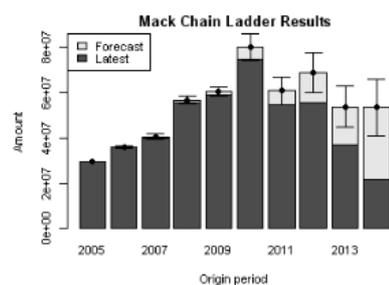
$$E\left(\frac{P_{i,t}}{P_{i,s}} | \mathcal{B}_i(s)\right) \text{ and } E\left(\frac{I_{i,t}}{I_{i,s}} | \mathcal{B}_i(s)\right)$$

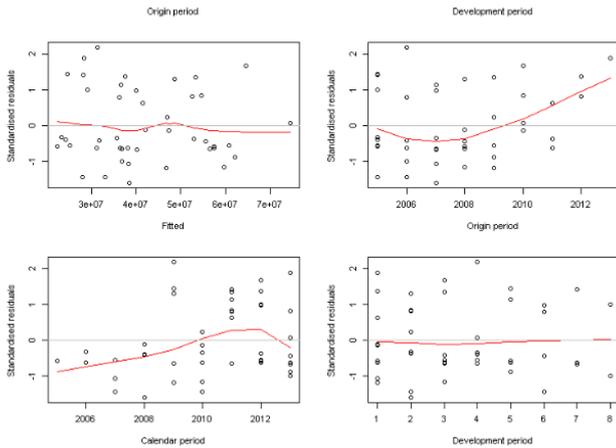
where  $\mathcal{B}_i(s) = \{P_{i,1}, \dots, P_{i,s}; I_{i,1}, \dots, I_{i,s}\}$  stand for the fact of the development of both processes up to the end of development year  $s$ .

Cumulative Paid		0	1	2	3	4	5	6	7	8	9
2005	13,247,635	19,871,794	22,514,448	23,425,701	23,425,701	28,034,921	28,034,921	28,534,921	28,534,921	29,627,617	29,627,617
2006	18,545,283	28,096,622	28,505,022	30,384,866	36,210,297	36,210,297	36,210,297	36,210,297	36,210,297	36,210,297	36,210,297
2007	22,805,548	32,677,287	33,056,967	34,544,398	34,544,398	34,901,048	34,901,048	39,901,048	39,901,048	39,901,048	39,901,048
2008	25,061,272	41,450,112	53,532,128	54,632,128	54,632,128	54,632,128	55,482,000	55,482,000	55,482,000	55,482,000	55,482,000
2009	27,600,292	39,885,134	47,736,642	58,826,959	59,226,959	59,226,959	59,226,959	59,226,959	59,226,959	59,226,959	59,226,959
2010	28,171,203	46,485,088	57,877,529	72,033,666	74,682,850	74,682,850	74,682,850	74,682,850	74,682,850	74,682,850	74,682,850
2011	24,747,420	45,051,323	51,535,064	54,831,028	54,831,028	54,831,028	54,831,028	54,831,028	54,831,028	54,831,028	54,831,028
2012	22,311,896	44,679,545	55,642,105	55,642,105	55,642,105	55,642,105	55,642,105	55,642,105	55,642,105	55,642,105	55,642,105
2013	16,811,300	36,981,366	36,981,366	36,981,366	36,981,366	36,981,366	36,981,366	36,981,366	36,981,366	36,981,366	36,981,366
2014	21,903,227	21,903,227	21,903,227	21,903,227	21,903,227	21,903,227	21,903,227	21,903,227	21,903,227	21,903,227	21,903,227

Cumulative Incurred		0	1	2	3	4	5	6	7	8	9
2005	43,855,985	48,861,761	49,781,761	49,781,761	49,781,761	49,781,761	49,781,761	49,781,761	49,781,761	49,781,761	49,781,761
2006	35,549,677	39,261,019	47,261,019	47,261,019	47,261,019	47,261,019	47,261,019	47,261,019	47,261,019	47,261,019	47,261,019
2007	34,563,960	61,123,045	61,123,045	62,748,791	62,748,791	62,748,791	62,748,791	62,748,791	62,748,791	62,748,791	62,748,791
2008	39,563,188	61,731,322	67,677,605	84,949,636	91,255,164	91,255,164	91,255,164	91,255,164	91,255,164	91,255,164	91,255,164
2009	39,487,409	36,880,816	66,055,173	67,412,109	67,412,109	67,412,109	67,412,109	67,412,109	67,412,109	67,412,109	67,412,109
2010	43,035,761	69,523,122	83,969,602	83,319,602	86,216,570	86,216,570	86,216,570	86,216,570	86,216,570	86,216,570	86,216,570
2011	43,195,291	67,457,014	76,275,810	76,325,810	76,325,810	76,325,810	76,325,810	76,325,810	76,325,810	76,325,810	76,325,810
2012	41,495,136	54,703,915	58,893,154	58,893,154	58,893,154	58,893,154	58,893,154	58,893,154	58,893,154	58,893,154	58,893,154
2013	40,571,725	40,571,725	40,571,725	40,571,725	40,571,725	40,571,725	40,571,725	40,571,725	40,571,725	40,571,725	40,571,725
2014	53,996,544	53,996,544	53,996,544	53,996,544	53,996,544	53,996,544	53,996,544	53,996,544	53,996,544	53,996,544	53,996,544





- PQ – there exist a constant  $\theta^P$  such that for all  $s, t \in T$  with  $t=s+1$  and  $i=1,2,\dots,n$

$$E \left( \text{Res} \left( \frac{P_{i,t}}{P_{i,s}} \mid \mathcal{P}_i(s) \right) \mid \mathcal{B}_i(s) \right) = \theta^P \text{Res}(Q_{i,s}^{-1} \mid \mathcal{P}_i(s))$$

- IQ - there exist a constant  $\theta^I$  such that for all  $s, t \in T$  with  $t=s+1$  and  $i=1,2,\dots,n$

$$E \left( \text{Res} \left( \frac{I_{i,t}}{I_{i,s}} \mid \mathbb{I}_i(s) \right) \mid \mathcal{B}_i(s) \right) = \theta^I \text{Res}(Q_{i,s} \mid \mathbb{I}_i(s))$$

The parameters  $\theta^P$  and  $\theta^I$  represent the slopes of the regression lines in the residuals plots and are not independent on development year  $s$ .

### B. Munich Chain Ladder Model

In the MCL model we use PIU [1] instead of PU and IU. We denote the P/I process as

$$Q_i = \frac{P_i}{I_i} = \left( \frac{P_{i,t}}{I_{i,t}} \right)_{t \in T}$$

If  $X$  is a random variable,  $C$  a condition and the conditional standard deviation of  $X$  given  $C$  is  $\sigma(X|C)$ , we call the conditional residual of  $X$  given  $C$

$$\text{Res}(X|C) = \frac{X - E(X|C)}{\sigma(X|C)}$$

The standardization of the conditional residual is

$$E(\text{Res}(X|C)|C)=0 \text{ and } \text{Var}(\text{Res}(X|C)|C)=1$$

The assumptions for the MCL model:

- The conditional expectations for the paid development factors and their residuals are

$$\text{Res} \left( \frac{P_{i,t}}{P_{i,s}} \mid \mathcal{P}_i(s) \right)$$

- The conditional expectations for the incurred development factors and their residuals are

$$\text{Res} \left( \frac{I_{i,t}}{I_{i,s}} \mid \mathbb{I}_i(s) \right)$$

Hence we have

$$E \left( \text{Res} \left( \frac{P_{i,t}}{P_{i,s}} \mid \mathcal{P}_i(s) \right) \mid \mathcal{B}_i(s) \right)$$

and

$$E \left( \text{Res} \left( \frac{I_{i,t}}{I_{i,s}} \mid \mathbb{I}_i(s) \right) \mid \mathcal{B}_i(s) \right)$$

- Linear dependence of the expectations on the residuals of (P/I) or (I/P) ratios into an mathematical equation

$$\text{Res}(Q_{i,s} \mid \mathbb{I}_i(s)) \text{ or } \text{Res}(Q_{i,s}^{-1} \mid \mathcal{P}_i(s))$$

### III. ANALYSIS OF THE MCL MODEL

The factor  $\theta^I$  is the coefficient of correlation of the residuals of the development factors and the residuals of the P/I ratios. The factor  $\theta^P$  is the coefficient of correlation of the residuals of the development factors and the residuals of the I/P ratios. The values of factors  $\theta^I$  and  $\theta^P$  are between 0 and 1. The correlation parameters  $\theta^I$  and  $\theta^P$  represent the link between the incurred and the paid triangles.

$$\theta^P = \text{corr} \left( Q_{i,s}^{-1}, \frac{P_{i,t}}{P_{i,s}} \mid \mathcal{P}_i(s) \right)$$

$$\theta^I = \text{corr} \left( Q_{i,s}, \frac{I_{i,t}}{I_{i,s}} \mid \mathbb{I}_i(s) \right)$$

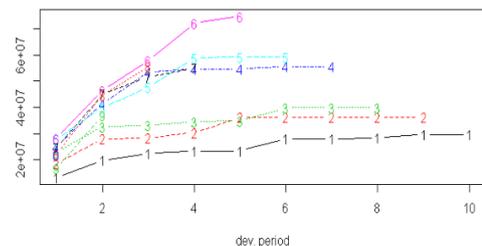
For the conditional correlation coefficients

$$\theta^P = \text{corr} \left( \text{Res} (Q_{i,s}^{-1} \mid \mathcal{P}_i(s)), \text{Res} \left( \frac{P_{i,t}}{P_{i,s}} \mid \mathcal{P}_i(s) \right) \right)$$

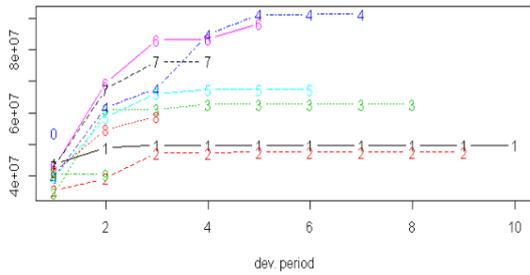
$$\theta^I = \text{corr} \left( \text{Res}(Q_{i,s} \mid \mathbb{I}_i(s)), \text{Res} \left( \frac{I_{i,t}}{I_{i,s}} \mid \mathbb{I}_i(s) \right) \right)$$

#### A. Estimation of claims reserve using MCL

The appearance of the paid claims before the application of MCL



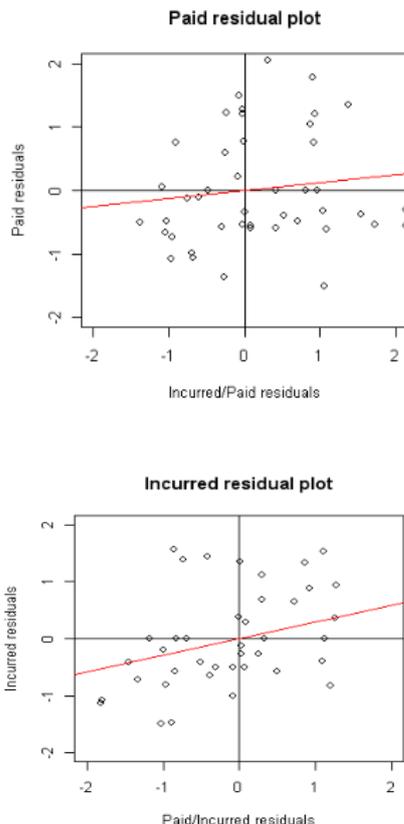
The appearance of the incurred claims before the application of MCL



Using MCL method we can project the total claims reserve and also the paid and incurred triangles.

Totals	Claims		
	Paid	Incurred	P/I Ratio
Latest	464488517	636606298	0.7296323
Ultimate	534960659	687394853	0.7782436

The incurred residual plot shows a correlation of 58% and the paid residuals shows a correlation of 26%. The regression lines for the two plots are flat.



**B. Results of projections**

The results of the projection are the paid and the incurred quadrangle.

The projections for paid claims

```
> MCL Paid
0 1 2 3 4 5 6 7 8 9
2005 13247635 19871794 22514448 23425701 23425701 28034921 28034921 28534921 29627617 29627617
2006 18545283 28096622 28505022 30384866 36210297 36210297 36210297 36210297 36210297 36210297
2007 22805548 32677287 30569667 34544398 34901048 39901048 39901048 39901048 39901048 39901048
2008 25061272 41450112 53532128 54632128 54632128 55482000 55482000 55725566 56804566 56839121
2009 27800292 39885124 47736642 58826959 59226959 59226959 59226959 59226959 59226959 59226959
2010 28171203 46485088 57877529 72033666 74682850 77326334 77326334 78090458 78940934 78807308
2011 24747420 45051323 51535064 54831028 56622516 59392062 59392062 59586714 60405696 60355788
2012 22311896 44679545 55642105 61198085 62704245 65255587 65255587 65354501 65972112 65831451
2013 16811300 36981386 42904531 47226714 48409706 50401215 50401215 50482508 50971549 50866563
2014 21903227 37537900 44646836 50230164 52077653 54840558 54840558 54840558 54840558 54840558
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The projections for incurred claims

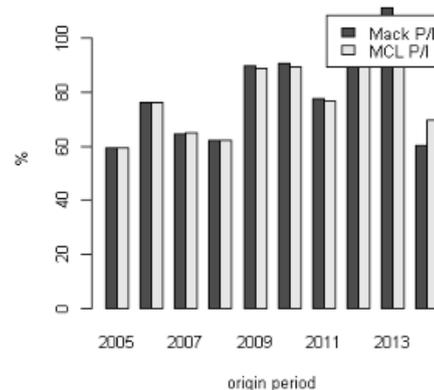
```
> MCL Incurred
0 1 2 3 4 5 6 7 8 9
2005 43855985 48981761 49781761 49781761 49781761 49781761 49781761 49781761 49781761 49781761
2006 35549677 39261019 47261019 47261019 47638070 47638070 47638070 47638070 47638070 47638070
2007 34563960 61123045 61123045 62748791 62748791 62748791 62748791 62748791 62748791 62748791
2008 39563188 61731322 67677605 84949636 91255164 91255164 91421764 91421764 91421764 91421764
2009 39467409 58680818 66055173 67412109 67412109 67412109 67485979 67485979 67485979 67485979
2010 43035761 69523122 83069602 83319602 88216570 88216570 88314186 88314186 88314186 88314186
2011 43195291 67457014 76275810 76325810 78679472 78679472 78739749 78739749 78739749 78739749
2012 41495136 54703915 58893154 64522884 67536952 67536952 67624301 67624301 67624301 67624301
2013 40571725 40571725 46405079 50658890 52968438 52968438 53035191 53035191 53035191 53035191
2014 53596544 70682877 76622566 78563956 80552705 80552705 80605061 80605061 80605061 80605061
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The Munich Chain Ladder results



The comparison of level of concurrence between paid and incurred projections by comparing the ultimate P/I ratios calculated using the Standard Chain Ladder and the Munich Chain Ladder.

Munich Chain Ladder vs. Standard Chain Ladder



IV. CONCLUSIONS

The standards chain ladder method don't consider the correlation between paid claims and incurred claims. The Munich chain ladder seeks to resolve the differences that arise between the standard paid claims and the incurred chain ladder indications. MCL provides separate estimations for paid and incurred, but they are closer to one another. In the cases where the correlations are not significant the MCL method provides the same results as the SCL method.

The implementation of MCL method is more complex than the other reserving methods. It may not respond very well to the small data and sometimes the parameters may need smoothing or extrapolation.

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