

# Comparison of differences between initial and recurrent acute pancreatitis in the intensive care unit

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## Keywords

Mortality, Intensive care unit, Acute pancreatitis, MIMIC-IV, Recurrent pancreatitis

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## Abstract

### Introduction

Previous studies have found that RAP may be at reduced risk for a clinically severe course and have reduced mortality. However, there is still a lack of data related to RAP admitted to ICU.

### Material and methods

Baseline characteristics of patients diagnosed with IAP and RAP from the MIMIC-IV database were extracted. In-hospital mortality and length of hospital/ICU stay were identified as outcomes. Binomial logistic regression analysis was performed to clarify the independent risk factors for in-hospital mortality in both groups, and we determined the best scoring system for prognosis prediction by plotting the ROC curves and DCA curves.

### Results

The in-hospital mortality rate was 13.96% in patients with IAP and 3.57% in patients with RAP. For IAP, the CCI, the BISAP score, and the SIRS score on the first day of admission were independent risk factors for in-hospital mortality. The SAPS II score almost always showed a higher net clinical benefit than the other scoring systems (BISAP, LODS, and OASIS). The BISAP score almost always showed a higher net clinical benefit than the others for RAP.

### Conclusions

RAP is less severe and has a lower risk of in-hospital mortality than IAP. The CCI, the BISAP score, and the SIRS score on the first day of admission were all independent risk factors for in-hospital mortality in patients with IAP. The SAPS II score was a better scoring system for predicting in-hospital mortality in patients with IAP. The BISAP score showed potential for predicting in-hospital mortality in patients with RAP.

# Comparison of differences between initial and recurrent acute pancreatitis in the intensive care unit

**Running title: Differences Initial and Recurrent AP**

## 1 **Abstract**

2 **Background:** Previous studies have found that patients with recurrent acute  
3 pancreatitis (RAP) may be at reduced risk for a clinically severe course and have  
4 reduced mortality. However, there is still a lack of data related to recurrent acute  
5 pancreatitis admitted to intensive care unit (ICU).

6 **Methods:** Baseline characteristics of patients diagnosed with initial and recurrent  
7 acute pancreatitis from the Medical Information Mart for Intensive Care/MIMIC-IV  
8 database were extracted. In-hospital mortality and length of hospital/ICU stay were  
9 identified as outcomes. Binomial logistic regression analysis was performed to clarify  
10 the independent risk factors for in-hospital mortality in both groups, and we  
11 determined the best scoring system for prognosis prediction by plotting the receiver  
12 operating characteristic (ROC) curves and the decision curve analysis (DCA) curves.

13 **Results:** The in-hospital mortality rate was 13.96% in patients with initial acute  
14 pancreatitis (IAP) and 3.57% in patients with RAP, and there was no statistical  
15 difference between the two groups regarding length of hospital/ICU stay. For IAP, the  
16 Charlson comorbidity index, the Bedside Index for Severity in Acute Pancreatitis  
17 (BISAP) score, and the Systemic Inflammatory Response Syndrome (SIRS) score on

18 the first day of admission were independent risk factors for in-hospital mortality. Age,  
19 gender, Charlson comorbidity index, BISAP score, SIRS score, and obesity were not  
20 independent risk factors for in-hospital mortality in patients with RAP. For patients  
21 with IAP, the areas under the ROC curves (AUCs) of the four scoring systems [the  
22 BISAP, the Logistic Organ Dysfunction System (LODS), the Oxford Acute Severity  
23 of Illness Score (OASIS), and the Simplified Acute Physiology Score II (SAPS II)]  
24 were 0.720, 0.847, 0.808, and 0.845, respectively, but the results of the Z test showed  
25 no statistical difference between LODS and SAPS II; The DCA showed that in the  
26 threshold of 0.2-0.6, SAPS II score almost always showed a higher net clinical benefit  
27 than the other scoring systems, while the threshold exceeded 0.6, none of the four  
28 scoring systems showed a net clinical benefit. For patients with RAP, the AUCs of the  
29 four scoring systems (BISAP, LODS, OASIS, and SAPS II) were 0.944, 0.861, 0.681,  
30 and 0.829, respectively, but the AUC value of BISAP was only statistically different  
31 from that of LODS; The DCA showed that in the threshold of 0 -0.25, BISAP score  
32 almost always showed a higher net clinical benefit than the other scoring systems, but  
33 in other threshold ranges, none of the four scoring systems showed a net clinical  
34 benefit.

35 **Conclusions:** RAP is less severe and has a lower risk of in-hospital mortality than IAP.  
36 The Charlson comorbidity index, the BISAP, and the SIRS score on the first day of  
37 admission were all independent risk factors for in-hospital mortality in patients with  
38 IAP. The SAPS II score was a better scoring system for predicting in-hospital  
39 mortality in patients with IAP. In contrast, the BISAP score showed potential for

40 predicting in-hospital mortality in patients with RAP.

41

42 **Keywords:** Intensive care unit; Recurrent pancreatitis; Acute pancreatitis; Mortality;

43 MIMIC-IV

44

## 45 1. Introduction

46 Acute pancreatitis (AP) is one of the most common and critical diseases of the  
47 digestive system. It has been reported that 5-35 people per 100,000 seek medical  
48 attention for AP each year, and the incidence has been on the rise for the past two  
49 decades[1, 2]. Approximately 15-20% of patients with AP develop moderate or severe  
50 disease. At this level of severity, patients may develop multi-organ failure with a  
51 mortality rate of 20-40%, and these patients often require admission to an intensive  
52 care unit (ICU)[3]. Meanwhile, AP is exceptionally prone to recurrence when the  
53 underlying cause of its onset is not found or when the underlying cause is not  
54 eliminated, and its recurrence rate is between 10% and 30%[4, 5]. Recurrent acute  
55 pancreatitis (RAP) affects patients' quality of life and increases the burden of  
56 healthcare costs for patients[6]. In addition, RAP is also a significant risk factor for  
57 progression to chronic pancreatitis[7]. Other studies have suggested that RAP may be  
58 associated with pancreatic cancer[8].

59 A study by Lee et al. [4]retrospectively analyzed the clinical outcomes of 292  
60 patients with AP (213 patients with IAP and 79 patients with RAP) who attended the  
61 Cleveland Clinic between 2008 and 2011 and found a mortality rate of 4.7% for IAP

62 patients and 0% for patients with RAP ( $p = 0.047$ ). The investigators concluded that  
63 patients with RAP may be at reduced risk of a clinically severe course and have  
64 reduced mortality. In addition, after adjusting for potential confounders (e.g., transfer  
65 status, obesity), they found that prior episodes of AP were protective against  
66 multisystem organ failure and admission to the ICU in RAP. However, few studies  
67 have compared the differences between RAP and IAP, and there is a lack of data  
68 related to RAP admission to the ICU. This study is intended to further elucidate the  
69 differences between IAP and RAP based on a large public database (the Medical  
70 Information Mart for Intensive Care, MIMIC-IV), to provide clinical evidence on  
71 allocating healthcare resources related to AP.

## 73 **2. Methods**

### 74 ***2.1 Introduction to the database***

75 The MIMIC is a database of intensive care medicine, established in 2003 with  
76 funding from the National Institutes of Health (NIH) by emergency physicians,  
77 intensivists, and computer science experts from Beth Israel Deaconess Medical Center,  
78 Massachusetts Institute of Technology, Oxford University, and Massachusetts General  
79 Hospital[9], and has been updated to version 4 (MIMIC-IV, <https://mimic.mit.edu/>).  
80 The MIMIC-IV database currently collects information on more than 70,000 critical  
81 care hospitalizations, which is far more cases than any single-center clinical trial site  
82 worldwide. The data collection and entry process of the MIMIC-IV is done by  
83 professionally trained personnel and can be considered a high-quality multi-center

84 clinical research database.

## 85 **2.2 Study population**

86 Patients with AP were identified according to the ICD codes of the diagnosis and  
87 those admitted to the hospital or ICU for chronic pancreatitis were excluded from this  
88 study. The following information was extracted for included patients using Navicat  
89 software (version 16.1.3): age, gender, race (white, black, and other ethnicities),  
90 Charlson comorbidity index, presence of acute kidney injury/sepsis/obesity, BISAP  
91 (Bedside Index for Severity in Acute Pancreatitis) score, SIRS (Systemic  
92 Inflammatory Response Syndrome) score, LODS (Logistic Organ Dysfunction  
93 System) score[10], OASIS (Oxford Acute Severity of Illness Score) score[11], SAPS  
94 II (Simplified Acute Physiology Score II) score[12], laboratory tests (hemoglobin,  
95 red blood cells, red blood cell distribution width, platelets, white blood cells, anion  
96 gap, blood urea nitrogen, creatinine, international normalized ratio, prothrombin time,  
97 alanine aminotransferase, aspartate aminotransferase, total bilirubin, and blood  
98 glucose), vital signs (heart rate, mean arterial pressure, respiratory rate, and body  
99 temperature), fluid intake and urine output on the first day of admission. The BISAP  
100 score[13] was introduced in 2008 and is cumulative with the presence of the  
101 following: blood urea nitrogen >25 mg/dl, impaired mental status (Glasgow Coma  
102 Score <15), SIRS, age >60 years, and presence of pleural effusion. BISAP score has  
103 been shown to be useful for the early identification of AP with an increased risk of  
104 in-hospital death patients[14-16]. However, the relationship between BISAP score and  
105 prognosis of severe AP lacks large-scale data support.

106 RAP was defined as acute pancreatitis that occurred at least 2 months after the  
107 last episode[4, 17, 18]. The time difference between the patient's admissions was  
108 calculated using Python software (version 3.9), and the diagnosis of RAP was rejected  
109 if the time difference between the two hospitalizations was less than 2 months.

### 110 *2.3 Statistical analysis*

111 Statistical analyses were performed using R software (version 4.1.2) and  
112 Medcalc software (version 20.1.0). Patients with IAP and RAP were grouped, and  
113 their basic characteristics were described. Continuous variables were first clarified  
114 whether they obeyed normal distribution using the Kolmogorov-Smirnov test. If they  
115 obeyed normal distribution (presented as mean  $\pm$  standard deviation), the student t-test  
116 was performed for comparison between groups, and if they did not obey normal  
117 distribution (presented as a median and interquartile range), a non-parametric test  
118 (Mann-Whitney U test) was performed for comparison between groups; Categorical  
119 variables (presented as sample size and percentages) were compared between groups  
120 using the chi-square test. Kaplan-Meier curves were plotted to clarify whether there  
121 was a difference in survival between the two groups by the Log-rank test and  
122 Tarone-Ware test. Binomial logistic regression analysis was performed to clarify the  
123 independent risk factors for in-hospital mortality of the patients, where variables with  
124 p-values  $<0.1$  in the univariable regression analysis were included in the multivariable  
125 regression analysis. The predictive value of the four scoring systems (LODS, OASIS,  
126 and SAPS II have all been used for prognostic prediction in patients admitted to the  
127 ICUs) for in-hospital mortality of the patients was further compared by plotting the

128 receiver operating characteristic (ROC) curves of each scoring system, and the area  
129 under the curves (AUCs) were tested for differences by the method of Delong et al.  
130 The decision curve analysis (DCA) was also performed to clarify the net clinical  
131 benefit of each scoring system when applied to AP patients. p values less than 0.05  
132 were considered statistically different.

133

### 134 **3. Results**

#### 135 ***3.1 Epidemiological features of RAP***

136 We identified 6195 patient admissions with a diagnosis of AP from over 200,000  
137 admissions in the MIMIC-IV database between 2008 and 2019. After excluding repeat  
138 hospitalizations, a total of 4060 patients were diagnosed with AP, 541 of whom were  
139 readmitted for RAP, and the time interval between the second episode of AP and the  
140 initial episode was 154 (90-443) days. There were 151 in-hospital deaths (in-hospital  
141 mortality rate of 4.29%) in patients with IAP and 4 in-hospital deaths (in-hospital  
142 mortality rate of 0.74%) in patients with RAP, with a statistically significant  
143 difference ( $p < 0.001$ ) and an overall in-hospital mortality rate of 3.82%. There were  
144 1344 admissions to the ICU (over 70,000 ICU admissions in the database) with AP,  
145 and after excluding repeat admissions, there were 1030 independent individual  
146 patients with the specific diagnoses shown in Table 1. Of these 1030 ICU admissions,  
147 974 patients were diagnosed with IAP, of which 79 were diagnosed with biliary AP,  
148 63 with alcohol induced AP, 6 with drug induced AP, and 5 with idiopathic AP; the  
149 other 56 patients were diagnosed with RAP, of which 5 were diagnosed with alcohol



150 induced AP, 1 with biliary AP, and 1 with drug induced AP, and 5 with idiopathic AP,  
151 while the etiology of the remaining 49 patients was unknown.

### 152 ***3.2 Baseline characteristics of the included patients***

153 Patients with RAP were younger, had a lower Charlson comorbidity index, lower  
154 BISAP and SIRS scores, and lower hemoglobin, blood urea nitrogen, creatinine,  
155 alanine aminotransferase, aspartate aminotransferase, and total bilirubin levels than  
156 those with IAP. The remaining baseline characteristics were not statistically different  
157 between the two groups (Table 2).

### 158 ***3.3 Outcomes of the included patients***

159 Among the included patients admitted to the ICU, the in-hospital mortality rate  
160 was 13.96% (of the 974 patients, 136 died) for patients with IAP and 3.57% (of the 56  
161 patients, 2 died) for RAP. The risk of in-hospital death was lower for RAP (RR=0.892,  
162 95% CI=0.843-0.944), and the difference was statistically significant (p=0.025).  
163 Patients in the IAP group were hospitalized for 10.7 days (5.8 -20.0 days) and stayed  
164 in the ICU for 2.6 days (1.2 -6.0 days); patients in the RAP group were hospitalized  
165 for 8.8 days (5.8 -18.3 days) and stayed in the ICU for 2.3 days (1.3 -4.5 days). There  
166 was no statistical difference between the two groups regarding length of hospital stay  
167 and length of stay in the ICU (Table 3).

### 168 ***3.4 Survival analysis and independent risk factors for in-hospital mortality***

169 Kaplan-Meier curves were plotted for the survival of the two groups (Figure 1).  
170 p=0.064 for the Log-rank test and p=0.048 for the Tarone-Ware test. Since the Log

171 rank test is more sensitive to differences in distant outcome events, the difference in  
172 survival between the two groups is considered statistically significant here. The  
173 median survival time was 66.9 days (60.8-133.2 days) for patients with IAP and could  
174 not be calculated for patients with RAP (due to too few deaths), whose mean survival  
175 time was 66.214 days (standard deviation of 6.874 days).

176 The results of the binomial logistic regression analysis showed that for IAP, the  
177 Charlson comorbidity index and the BISAP/SIRS score on the first day may be  
178 independent risk factors for in-hospital mortality (Table 4). Here, we tested for  
179 covariance between age, BISAP, and SIRS using a linear regression equation with  
180 variance inflation factor (VIF) values of 1.544, 1.648, and 1.155, respectively,  
181 confirming the absence of covariance. However, age, sex, Charlson comorbidity index,  
182 BISAP / SIRS score on the first day, and the presence of obesity were not independent  
183 risk factors for in-hospital mortality in patients with RAP (Table 5). We also observed  
184 that RAP was not an independent risk factor for in-hospital mortality relative to IAP  
185 after adjusting for a range of confounders (Table 6).

### 186 ***3.5 Scoring system selection for predicting in-hospital mortality***

187 For patients with IAP, the ROC results of the four scoring systems are shown in  
188 Figure 2. The AUC values, optimal cutoff values, sensitivity, specificity, and Youden  
189 index of the four scoring systems are presented in Table 7, with the following Z-test  
190 results: BISAP vs. LODS with a Z value of 5.950,  $p < 0.0001$ ; BISAP vs. OASIS with  
191 a Z-value of 3.785,  $p = 0.0002$ ; BISAP vs. SAPS II with a Z value of 5.838,  $p < 0.0001$ ;  
192 LODS vs. OASIS with a Z-value of 2.647,  $p = 0.0081$ ; LODS vs. SAPS II with a Z

193 value of 0.183,  $p=0.8545$ ; OASIS vs. SAPS II with a Z value of 2.710,  $p=0.0067$ . In  
194 the DCA curves (Figure 3), the net clinical benefit of SAPS II was almost always  
195 higher than that of the other scoring systems in the threshold range of 0.2-0.6.  
196 However, none of the four scoring systems showed a net clinical benefit after the  
197 threshold range 0.6.

198 For patients with RAP, the ROC results of the four scoring systems are shown in  
199 Figure 4 and Table 8, with Z-test results of BISAP vs. LODS with a Z value of 2.427,  
200  $p=0.0152$ ; BISAP vs. OASIS with a Z value of 1.418,  $p=0.1562$ ; BISAP vs. SAPS II  
201 with a Z-value of 0.843,  $p=0.3991$ ; LODS vs. OASIS with a Z value of 0.976,  
202  $p=0.3288$ ; LODS vs. SAPS II with a Z-value of 0.234,  $p=0.8149$ . OASIS vs. SAPS II,  
203 Z-value 2.497,  $p=0.0125$ . In the DCA curves (Figure 5), the net clinical benefit of  
204 BISAP was almost always higher than that of the other scoring systems in the  
205 threshold range of 0 -0.25. However, none of the four scoring systems showed a net  
206 clinical benefit in the other threshold ranges.

#### 208 **4. Discussion**

209 This study first investigated the prognostic differences in patients with AP in the  
210 ICU, and our results were similar to those of Lee et al.[4] that patients with RAP had  
211 lower severity (lower BISAP and SIRS scores on the first day of admission) and a  
212 lower risk of in-hospital death than those with IAP. In addition, consistent with  
213 previous studies, patients with RAP were younger and had a lower Charlson  
214 comorbidity index. The Charlson comorbidity index[19] can be used to assess the

215 impact of co-morbidities other than the underlying disease that is currently the  
216 primary treatment for the future survival of patients. It seems that we could attribute  
217 the lower mortality in patients with RAP to lower age and Charlson comorbidity index.  
218 However, the results of binomial logistic regression analysis suggest that age and  
219 Charlson comorbidity index are not independent risk factors for in-hospital mortality  
220 in patients with RAP, and only Charlson comorbidity index is independently  
221 associated with in-hospital mortality in patients with IAP. The answer to the question  
222 of why patients with RAP are more likely to be younger and have a lower comorbidity  
223 index is not yet available from previous studies. It needs to be further explored at a  
224 later stage. In addition to blood urea nitrogen, we also found that patients with RAP  
225 had lower creatinine levels, alanine aminotransferase levels, aspartate  
226 aminotransferase levels, and total bilirubin levels, which to some extent reflect the  
227 liver and kidney function of the patients, suggesting that better liver and kidney  
228 function in patients with RAP may also contribute to the low mortality rate. However,  
229 from the causal inference perspective, we cannot yet explain why patients with RAP  
230 have better hepatic and renal function.

231 Understanding the differences between IAP and RAP at the pathogenesis level  
232 can help provide better treatment options for patients. The reason for the lower  
233 severity of disease in patients with RAP may stem from the loss of alveolar cells and  
234 pancreatic fibrosis due to each episode of pancreatitis. As a direct result of reduced  
235 alveolar cells, there may be less pancreatic auto-digestion, necrosis, and a subsequent  
236 less inflammatory cascade response[20]. In contrast, pancreatic fibrosis has been

237 shown to directly reduce the severity of patients with acute-on-chronic  
238 pancreatitis[21]. Other researchers suggest that the protective immune mechanism of  
239 the body is not activated during the IAP, and this protective immune mechanism may  
240 protect the body in RAP[4]. However, starting from the three possible mechanisms  
241 mentioned above, only enhancing protective immune mechanisms is a potential  
242 therapy. With the flourishing development of molecular biology technologies,  
243 including genomics, proteomics, and transcriptomics in recent years, there is reason to  
244 believe that the essential differences between IAP and RAP (e.g., details on  
245 differentially expressed genes, protein expression levels, and key transcription factors  
246 in the development of the disease course in both types of AP) will be further  
247 elucidated, thus providing robust evidence for precision medicine in AP.

248 For prognostic prediction of patients with AP admitted to the ICU, Huang et al.  
249 developed a nomogram that showed good predictive performance[22]. We  
250 investigated the predictive value of four preexisting scoring systems in the prognosis  
251 of patients with AP, in which LODS, OASIS, and SAPS II were all used as prognostic  
252 predictive scoring systems in the ICU and also showed good predictive value[23]. For  
253 patients with IAP, SAPS II appears to be the superior predictive scoring system, and  
254 although it has the highest AUC (0.847) and the highest Yonden index (0.5825), it is  
255 equivalent in value to LODS in the Z test. However, the DCA curve suggests that the  
256 net clinical benefit for patients may be higher when using the SAPS II score as a  
257 predictive scoring system. DCA curves have been used extensively to evaluate the  
258 clinical utility of a model, i.e., whether the model is worthy of being practiced

259 clinically[24-27]. The value of each DCA curve can be described using the net benefit  
260 ratio, the magnitude of which is similar to the AUC of the ROC curve, i.e., the larger  
261 the area under the DCA curve, the larger the net benefit ratio. As seen from Figure 3,  
262 if we choose the threshold probability range of 0.2-0.6 corresponding to the horizontal  
263 coordinate, SAPS II leads almost with any other three scoring systems. In the range  
264 greater than 0.6, all scoring systems have no significant net benefit. However, for RAP,  
265 the results were quite different, and BISAP appeared to show some advantage in  
266 predicting the prognosis of RAP. The AUC value (0.944) and the Yonden index  
267 (0.8889) were the highest when using the BISAP score for prognosis prediction of  
268 RAP. However, compared to the other three scoring systems, there was only a  
269 statistical difference with the AUC of LODS. Afterward, the DCA curve results  
270 showed that the net benefit of BISAP was most significant between the threshold  
271 probabilities 0- 0.25. In conclusion, the prognostic prediction should not be  
272 generalized for patients with AP admitted to the ICU. In the case of patients with IAP,  
273 selecting a critical care scoring system for prognostic prediction may be a better  
274 choice, while in patients with RAP, the BISAP score may have some advantages.

275 **Approximately 14-20% of patients with AP are reported to require intensive care due**  
276 **to multi-organ dysfunction and/or failure, and multidisciplinary teamwork in intensive**  
277 **care can reduce mortality from 30% to 10% in severe AP[28]. It is valuable to clarify**  
278 **the clinical features of AP in intensive care, and considering that patients with**  
279 **first-episode AP may be more severely ill, we believe that the importance of intensive**  
280 **care in the management of patients with first-episode AP should be emphasized to**

281 prevent the deterioration of the patient's condition in advance. In fact, there is no  
282 sufficiently reliable prognostic score to predict the occurrence of severe AP. The  
283 Guidelines for the Management of Patients with Severe Acute Pancreatitis, 2021  
284 states that the BISAP score is likely the most appropriate predictor of the development  
285 of severe AP[29]. We demonstrated the potential of the BISAP score in the prognosis  
286 prediction of RAP, further enriching the clinical application value of BISAP. However,  
287 only some previous studies related to intensive care in RAP have been reported, and  
288 our study also fills this gap to some extent.

289 Even though both this study and the study by Lee et al.[4] suggest that patients  
290 with RAP may have a milder disease than the initial attack, but their relatively high  
291 mortality rate is still unacceptable to us. Determining the etiology of an acute  
292 pancreatitis attack is a key factor in preventing recurrence. Among the 56 patients  
293 with RAP included in this study, as we have previously stated, 5 cases were definite  
294 alcoholic AP (about 9%), while 1 case each of drug-induced AP and biliary AP, and  
295 the etiology of the remaining patients was unclear. It has been shown that after the  
296 first episode of alcoholic AP, 46% of patients experience at least one recurrence  
297 during 10-20 years of follow-up, along with an increased risk of developing chronic  
298 pancreatitis[30, 31]. In addition, personal alcohol consumption is not associated with  
299 RAP, nor is the type of alcoholic beverage associated with RAP[31]. However, there  
300 is definite evidence that smoking and obesity are risk factors for alcohol-induced  
301 RAP[32, 33]. Therefore, in patients with alcoholic AP, weight control and smoking  
302 cessation may be effective measures to prevent a recurrence. For biliary AP, removing

303 the gallbladder is necessary to prevent recurrence[34]. As for drug-induced AP,  
304 discontinuation of potentially pathogenic drugs and follow-up may be helpful for  
305 patients. Some drugs have also been used for the prevention of RAP, including  
306 octreotide, pancreatic enzymes, and ursodeoxycholic acid[34], but there is a lack of  
307 high-quality, evidence-based medical evidence. However, most opinions believe that  
308 the etiology of idiopathic AP is biliary microstones or sphincter of Oddi dysfunction  
309 that cannot be detected by conventional methods[34], and laparoscopic  
310 cholecystectomy and necessary genetic testing may help to reduce recurrence[35]. In  
311 addition to the causes mentioned above, anatomical variants of the pancreas and  
312 genetic mutations are also possible causes of the development of AP[36]. Another  
313 study has shown that AP is prone to recurrence even during treatment, and factors  
314 such as uncontrolled systemic inflammatory response may be responsible for  
315 recurrence in such patients[6]. It must be emphasized that AP recurrence is likely to  
316 result from a combination of factors[6] and any cause of AP that is not adequately  
317 corrected may lead to recurrent attacks. In a word, to reduce the occurrence of RAP,  
318 primary, secondary, and tertiary preventive measures should be systematically  
319 implemented to mitigate the effects of AP and its sequelae as soon as possible.  
320 Personal education of patients, effective in-hospital management, and screening of  
321 high-risk patients all contribute to the prevention of RAP[37].

322 All in all, the strength of this study is that the study population was derived from  
323 a large clinical database, presenting the clinical characteristics of RAP in intensive  
324 care and the independent risk factors affecting their mortality in the largest possible



325 sample size, as well as comparing the scoring systems related to the prediction of their  
326 mortality and comparing them more comprehensively with the characteristics of  
327 patients with IAP during the same period. This fills the gap that the current study  
328 population for RAP originates only from general gastroenterology and is instructive  
329 for the management of AP patients in the ICU. Moreover, we report for the first time  
330 that there was no significant difference between patients with IAP and patients with  
331 RAP in terms of length of hospitalization and length of stay in the ICU as secondary  
332 outcomes. Meanwhile, we confirmed that for the prognostic prediction of RAP  
333 patients, the BISAP score possesses a greater advantage, and can achieve a greater net  
334 clinical benefit for patients while ensuring predictive efficacy. Therefore, the BISAP  
335 scoring system may be the preferred option for prognostic prediction of RAP patients  
336 in future clinical practice. However, we must acknowledge certain limitations of this  
337 study. Firstly, we did not explore the relationship between the number of episodes and  
338 the prognosis of AP, due to the extensive time span of this database and the lack of  
339 uniformity in follow-up, which makes it difficult to normalize the number of episodes;  
340 secondly, this study is based on the US population and it remains unknown whether  
341 all the conclusions obtained are applicable to populations in other countries or regions;  
342 further, due to the large number of missing values in the database for amylase, lipids  
343 (some studies have shown that elevated LDL cholesterol levels is an independent risk  
344 factor for RAP[5]) and other laboratory tests, and we were unable to obtain imaging  
345 data (including whether the pancreas was necrotic, formed pseudocysts or abscesses,  
346 etc.) of the patients, the impact of these indicators on the outcomes was not explored,

347 which may affect the stability of the results; meanwhile, we were unable to grade the  
348 patients in terms of severity based on methods such as the Atlanta Classification.  
349 Unfortunately, as shown in Table 1, the etiology of most patients was also unknown to  
350 us. Lastly, considering the small number of patient cases in the RAP group, the  
351 stability of the results remains to be tested. Therefore, a rigorously designed  
352 prospective randomized controlled clinical trial with a large sample is still essential to  
353 thoroughly elucidate the differences between IAP and RAP.

354

## 355 **5. Conclusion**

356 RAP was less severe and had a lower risk of in-hospital mortality than IAP. For  
357 IAP, the Charlson comorbidity index and the BISAP / SIRS score on the first day of  
358 admission were independent risk factors for in-hospital death; no independent risk  
359 factors for in-hospital death in patients with RAP were identified in this study. The  
360 SAPS II score is a better scoring system for predicting in-hospital mortality in patients  
361 with IAP. In contrast, the BISAP score showed some potential in predicting  
362 in-hospital mortality in patients with RAP.

363

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366 study.

## 367 **Disclosure statement**

368 The authors have no competing interests to declare.

369 **CRedit authorship contribution statement**

370 All authors have read and agreed to the published version of the manuscript.

371 **Ethics statement**

372 The establishment of this database was approved (No. 27653720) by the  
373 Massachusetts Institute of Technology (Cambridge, MA) and Beth Israel Deaconess  
374 Medical Center (Boston, MA), and consent was obtained for the original data  
375 collection. This study complies with the Declaration of Helsinki. The author passed  
376 the "Protecting Human Research Participants" exam (certification number: 52711740)  
377 on the NIH website and signed a data use agreement. All patient-identifiable  
378 information in the database, such as name, address, contact details, etc., was  
379 de-identified, and therefore, the ethical approval statement and the need for informed  
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383 **Data availability**

384 Data in the article can be obtained from MIMIC-IV database (version 0.4)  
385 (<https://mimic.physionet.org/>). The code for the data extraction is available on GitHub  
386 (<https://github.com/MIT-LCP/mimic-iv>).

387

388 **References:**

- 389 1. Ingraham NE, King S, Proper J et al. Morbidity and Mortality Trends of  
390 Pancreatitis: An Observational Study. *Surg Infect (Larchmt)* 2021; 22: 1021-1030.
- 391 2. Lowenfels AB, Maisonneuve P, Sullivan T. The changing character of acute  
392 pancreatitis: epidemiology, etiology, and prognosis. *Curr Gastroenterol Rep* 2009; 11:

- 393 97-103.
- 394 3. Boxhoorn L, Voermans RP, Bouwense SA et al. Acute pancreatitis. *Lancet* 2020;  
395 396: 726-734.
- 396 4. Lee PJ, Bhatt A, Holmes J et al. Decreased Severity in Recurrent Versus Initial  
397 Episodes of Acute Pancreatitis. *Pancreas* 2015; 44: 896-900.
- 398 5. Sun Y, Jin J, Zhu A et al. Risk Factors for Recurrent Pancreatitis After First  
399 Episode of Acute Pancreatitis. *Int J Gen Med* 2022; 15: 1319-1328.
- 400 6. Zhang W, Shan HC, Gu Y. Recurrent acute pancreatitis and its relative factors.  
401 *World J Gastroenterol* 2005; 11: 3002-3004.
- 402 7. Tao H, Xu J, Li N et al. Early identification of high-risk patients with recurrent  
403 acute pancreatitis progression to chronic pancreatitis. *Arch Med Sci* 2022; 18:  
404 535-539.
- 405 8. Sadr-Azodi O, Oskarsson V, Discacciati A et al. Pancreatic Cancer Following  
406 Acute Pancreatitis: A Population-based Matched Cohort Study. *Am J Gastroenterol*  
407 2018; 113: 1711-1719.
- 408 9. Johnson AE, Pollard TJ, Shen L et al. MIMIC-III, a freely accessible critical care  
409 database. *Sci Data* 2016; 3: 160035.
- 410 10. Le Gall JR, Klar J, Lemeshow S et al. The Logistic Organ Dysfunction system. A  
411 new way to assess organ dysfunction in the intensive care unit. ICU Scoring Group.  
412 *Jama* 1996; 276: 802-810.
- 413 11. Johnson AE, Kramer AA, Clifford GD. A new severity of illness scale using a  
414 subset of Acute Physiology And Chronic Health Evaluation data elements shows  
415 comparable predictive accuracy. *Crit Care Med* 2013; 41: 1711-1718.
- 416 12. Le Gall JR, Lemeshow S, Saulnier F. A new Simplified Acute Physiology Score  
417 (SAPS II) based on a European/North American multicenter study. *Jama* 1993; 270:  
418 2957-2963.
- 419 13. Wu BU, Johannes RS, Sun X et al. The early prediction of mortality in acute  
420 pancreatitis: a large population-based study. *Gut* 2008; 57: 1698-1703.
- 421 14. Papachristou GI, Muddana V, Yadav D et al. Comparison of BISAP, Ranson's,  
422 APACHE-II, and CTSI scores in predicting organ failure, complications, and  
423 mortality in acute pancreatitis. *Am J Gastroenterol* 2010; 105: 435-441; quiz 442.
- 424 15. Hagjer S, Kumar N. Evaluation of the BISAP scoring system in prognostication  
425 of acute pancreatitis - A prospective observational study. *Int J Surg* 2018; 54: 76-81.
- 426 16. Gao W, Yang HX, Ma CE. The Value of BISAP Score for Predicting Mortality  
427 and Severity in Acute Pancreatitis: A Systematic Review and Meta-Analysis. *PLoS*  
428 *One* 2015; 10: e0130412.
- 429 17. Lee PJW, Stevens T. Reply to: Yang et al, Clinical Features of Recurrent Acute  
430 Pancreatitis: Experience From a Single Center. *Pancreas* 2017; 46: e37-e38.
- 431 18. Mallick B, Shrama DJ, Siddappa P et al. Differences between the outcome of  
432 recurrent acute pancreatitis and acute pancreatitis. *JGH Open* 2018; 2: 134-138.
- 433 19. Charlson ME, Pompei P, Ales KL, MacKenzie CR. A new method of classifying  
434 prognostic comorbidity in longitudinal studies: development and validation. *J Chronic*  
435 *Dis* 1987; 40: 373-383.
- 436 20. Longnecker DS. Role of the necrosis-fibrosis sequence in the pathogenesis of

437 alcoholic chronic pancreatitis. *Gastroenterology* 1996; 111: 258-259.

438 21. Acharya C, Cline RA, Jaligama D et al. Fibrosis reduces severity of  
439 acute-on-chronic pancreatitis in humans. *Gastroenterology* 2013; 145: 466-475.

440 22. Huang S, Ma J, Dai H, Luo L. A new in-hospital mortality prediction nomogram  
441 for intensive care unit patients with acute pancreatitis. *Arch Med Sci* 2024; 20: 61-70.

442 23. Wang L, Zhang Z, Hu T. Effectiveness of LODS, OASIS, and SAPS II to predict  
443 in-hospital mortality for intensive care patients with ST elevation myocardial  
444 infarction. *Sci Rep* 2021; 11: 23887.

445 24. Chang X, Pan J, Zhao R et al. DDOST Correlated with Malignancies and  
446 Immune Microenvironment in Gliomas. *Front Immunol* 2022; 13: 917014.

447 25. Chen S, Gao C, Du Q et al. A prognostic model for elderly patients with  
448 squamous non-small cell lung cancer: a population-based study. *J Transl Med* 2020;  
449 18: 436.

450 26. Hu T, Zhang Z, Jiang Y. Albumin corrected anion gap for predicting in-hospital  
451 mortality among intensive care patients with sepsis: A retrospective propensity score  
452 matching analysis. *Clin Chim Acta* 2021; 521: 272-277.

453 27. Hou X, Wang D, Zuo J et al. Development and validation of a prognostic  
454 nomogram for HIV/AIDS patients who underwent antiretroviral therapy: Data from a  
455 China population-based cohort. *EBioMedicine* 2019; 48: 414-424.

456 28. Darvas K, Futó J, Okrös I et al. [Principles of intensive care in severe acute  
457 pancreatitis in 2008]. *Orv Hetil* 2008; 149: 2211-2220.

458 29. Jaber S, Garnier M, Asehnoune K et al. Guidelines for the management of  
459 patients with severe acute pancreatitis, 2021. *Anaesth Crit Care Pain Med* 2022; 41:  
460 101060.

461 30. Pelli H, Sand J, Laippala P, Nordback I. Long-term follow-up after the first  
462 episode of acute alcoholic pancreatitis: time course and risk factors for recurrence.  
463 *Scand J Gastroenterol* 2000; 35: 552-555.

464 31. Pelli H, Lappalainen-Lehto R, Piironen A et al. Risk factors for recurrent acute  
465 alcohol-associated pancreatitis: a prospective analysis. *Scand J Gastroenterol* 2008;  
466 43: 614-621.

467 32. Yadav D, O'Connell M, Papachristou GI. Natural history following the first attack  
468 of acute pancreatitis. *Am J Gastroenterol* 2012; 107: 1096-1103.

469 33. Rebours V, Vullierme MP, Hentic O et al. Smoking and the course of recurrent  
470 acute and chronic alcoholic pancreatitis: a dose-dependent relationship. *Pancreas*  
471 2012; 41: 1219-1224.

472 34. Seppänen H, Puolakkainen P. Classification, Severity Assessment, and Prevention  
473 of Recurrences in Acute Pancreatitis. *Scand J Surg* 2020; 109: 53-58.

474 35. Rätty S, Pulkkinen J, Nordback I et al. Can Laparoscopic Cholecystectomy  
475 Prevent Recurrent Idiopathic Acute Pancreatitis?: A Prospective Randomized  
476 Multicenter Trial. *Ann Surg* 2015; 262: 736-741.

477 36. Testoni PA. Acute recurrent pancreatitis: Etiopathogenesis, diagnosis and  
478 treatment. *World J Gastroenterol* 2014; 20: 16891-16901.

479 37. Petrov MS, Yadav D. Global epidemiology and holistic prevention of pancreatitis.  
480 *Nat Rev Gastroenterol Hepatol* 2019; 16: 175-184.

**Table 1 Diagnosis of the included patients**

<b>Diagnosis</b>	<b>9<sup>th</sup> or 10<sup>th</sup> ICD code</b>	<b>No. of patients (Before/after elimination of duplicates)</b>
Acute pancreatitis	5770, K859, K8590, K8591, K8592	1105/847
Biliary acute pancreatitis	K851, K8510, K8511, K8512	100/80
Alcohol induced acute pancreatitis	K852, K8520, K8521, K8522	93/68
Drug induced acute pancreatitis	K853, K8530, K8531	8/7
Idiopathic acute pancreatitis	K8500, K8502	10/5
Other acute pancreatitis	K858, K8580, K8581, K8582	28/23

**Table 2 Baseline characteristics of the patients**

<b>Characteristics</b>	<b>IAP (n=974)</b>	<b>RAP (n=56)</b>	<b><i>p</i></b>
<b>Age, year</b>	60.1 (47.6-73.5)	54.4 (40.6-68.2)	0.005
<b>Gender (Male)</b>	560 (57.49)	36 (64.29)	0.317
<b>Ethnicity</b>			0.055
White	617 (63.35)	35 (62.50)	
Black	100 (10.27)	11 (19.64)	
Others	257 (26.38)	10 (17.86)	
<b>CCI</b>	4 (3-7)	4 (2-6)	0.014
<b>AKI</b>	589 (60.47)	29 (51.79)	0.197
<b>Sepsis</b>	591 (60.68)	28 (50.00)	0.113
<b>Obesity</b>	119 (12.22)	6 (10.71)	0.738
<b>Day 1 BISAP</b>	2 (2-3)	2 (1-3)	0.024
<b>Day 1 SIRS</b>	3 (2-4)	3 (2-3)	0.003
<b>Laboratory tests</b>			
Hemoglobin, g/dL	10.9 (9.4-12.5)	10.3 (8.4-11.9)	0.019
RBC, 10 <sup>12</sup> /L	3.7 (3.1-4.1)	3.5 (2.9-3.8)	0.174
RDW, %	14.8 (13.8-17.1)	15.3 (14.0-16.9)	0.155
Platelets, 10 <sup>9</sup> /L	189 (131-265)	186 (126-308)	0.104
WBC, 10 <sup>9</sup> /L	12.5 (8.5-17.6)	9.5 (6.5-15.5)	0.089
Anion gap, mmol/L	15.5 (13.0-19.0)	15.3 (12.5-16.8)	0.296
BUN, mmol/L	20.3 (12.5-37.0)	17.3 (10.5-28.8)	0.042
Creatinine, mg/dL	1.1 (0.8-1.9)	0.9 (0.6-1.3)	0.024
INR	1.3 (1.2-1.6)	1.3 (1.1-1.5)	0.994
PT, s	14.3 (12.8-17.1)	13.8 (12.6-16.3)	0.846
ALT, U/L	51 (25-157)	31 (16-73)	0.003
AST, U/L	76 (36-182)	39 (19-134)	<0.001
TBil, $\mu$ mol/L	1.1 (0.6-2.8)	0.6 (0.3-1.4)	<0.001
Glucose, mg/dL	131 (105-169)	131 (107-166)	0.722
<b>Vital signs</b>			
Heart rate, bpm	94 (81-107)	100 (86-109)	0.052
MAP, mmHg	80 (72-91)	82 (73-88)	0.488

RR, cpm	20 (17-24)	20 (17-24)	0.127
Temperature, °C	37.0 (36.7-37.3)	36.9 (36.8-37.2)	0.902
<b>Day 1 input, ml/day</b>	10240 (5995-16420)	9681 (6445-14150)	0.636
<b>Day 1 UO, ml/day</b>	1484 (832-2349)	1920 (1228-2324)	0.140

485 IAP=Initial Acute Pancreatitis, RAP=Recurrent Acute Pancreatitis, CCI=Charlson Comorbidity  
486 Index, AKI=Acute Kidney Injury, BISAP=Bedside Index for Severity in Acute Pancreatitis  
487 Sequential, SIRS= Systemic Inflammatory Response Syndrome, RBC=Red Blood Cell, RDW=  
488 Red cell Distribution Width, WBC=White Blood Cell, BUN=Blood Urea Nitrogen,  
489 INR=International Normalized Ratio, PT=Prothrombin Time, ALT= Alanine aminotransferase,  
490 AST=Aspartate aminotransferase, TBil=Total Bilirubin, MAP=Mean Artery Pressure, UO=Urine  
491 Output.

492

493

**Table 3 Outcomes of the patients**

Outcomes	IAP (n=974)	RAP (n=56)	Relative Risk*	
			(95% CI)	p
Death in hospital	136 (13.96)	2 (3.57)	0.892 (0.843-0.944)	0.025
LOS hospital (day)	10.7 (5.8-20.0)	8.8 (5.8-18.3)	/	0.507
LOS ICU (day)	2.6 (1.2-6.0)	2.3 (1.3-4.5)	/	0.497

494 CI=Confidence Interval, LOS= Length of Stay, ICU= Intensive Care Unit.

495 \*Shown is the relative risk for recurrent acute pancreatitis versus initial acute pancreatitis.

496

497 **Table 4 Binomial Logistic regression analysis for in-hospital mortality among patients with**  
498 **initial acute pancreatitis**

	Univariable		Multivariable	
	OR (95% CI)	p	OR (95% CI)	p
<b>Age</b>	1.034(1.022-1.046)	<0.001	1.000(0.984-1.016)	0.969
<b>Gender (Male)</b>	0.835(0.580-1.202)	0.332		
<b>CCI</b>	1.264(1.190-1.343)	<0.001	1.211(1.123-1.306)	<0.001
<b>Day 1 BISAP</b>	2.424(1.958-3.003)	<0.001	1.784(1.359-2.341)	<0.001
<b>Day 1 SIRS</b>	1.667(1.329-2.090)	<0.001	1.727(1.332-2.239)	<0.001
<b>Obesity</b>	0.875(0.493-1.554)	0.648		

499 OR=Odds Ratio, CI=Confidence Interval, CCI=Charlson Comorbidity Index, BISAP=Bedside  
500 Index for Severity in Acute Pancreatitis Sequential, SIRS= Systemic Inflammatory Response  
501 Syndrome.

502

503 **Table 5 Binomial Logistic regression analysis for in-hospital mortality among patients with**  
504 **recurrent acute pancreatitis**

	Univariable		Multivariable	
	OR (95% CI)	p	OR (95% CI)	p
<b>Age</b>	1.106(0.978-1.250)	0.107	/	/
<b>Gender (Male)</b>	0.543(0.032-9.176)	0.672	/	/
<b>CCI</b>	1.191(0.702-2.021)	0.518	/	/
<b>Day 1 BISAP</b>	38213278(0.000-)	0.995	/	/
<b>Day 1 SIRS</b>	0.941(0.157-5.641)	0.947	/	/

**Obesity** 0.000(0.000-/) 0.999 / /

505 OR=Odds Ratio, CI=Confidence Interval, CCI=Charlson Comorbidity Index, BISAP=Bedside  
 506 Index for Severity in Acute Pancreatitis Sequential, SIRS= Systemic Inflammatory Response  
 507 Syndrome.  
 508

509 **Table 6 Binomial Logistic regression analysis for in-hospital mortality among intensive care**  
 510 **patients with acute pancreatitis**

	Univariable		Multivariable	
	OR (95% CI)	<i>p</i>	OR (95% CI)	<i>p</i>
<b>Age</b>	1.036(1.024-1.048)	<0.001	1.001(0.985-1.017)	0.912
<b>Gender (Male)</b>	0.820(0.572-1.175)	0.279		
<b>CCI</b>	1.268(1.194-1.347)	<0.001	1.204(1.117-1.298)	<0.001
<b>Day 1 BISAP</b>	2.484(2.010-3.071)	<0.001	1.710(1.321-2.213)	<0.001
<b>Day 1 SIRS</b>	1.690(1.349-2.116)	<0.001	1.710(1.321-2.213)	<0.001
<b>Obesity</b>	0.625(0.489-1.536)	0.625		
<b>RAP</b>	0.228(0.055-0.947)	0.042	0.380(0.088-1.637)	0.194

511 OR=Odds Ratio, CI=Confidence Interval, CCI=Charlson Comorbidity Index, BISAP=Bedside  
 512 Index for Severity in Acute Pancreatitis Sequential, SIRS= Systemic Inflammatory Response  
 513 Syndrome, RAP= Recurrent Acute Pancreatitis.  
 514  
 515

516 **Table 7 Comparison of ROC curves (initial acute pancreatitis)**

	AUC	95%CI	Optimal cut-off	Sensitivity (%)	Specificity (%)	Youden' s index
<b>BISAP</b>	0.720	0.691~0.748	>2	77.94	56.92	0.3486
<b>LODS</b>	0.847	0.823~0.869	>6	82.35	75.89	0.5825
<b>OASIS</b>	0.808	0.781~0.832	>36	77.94	71.48	0.4942
<b>SAPS II</b>	0.845	0.820~0.867	>43	75.00	79.00	0.5400

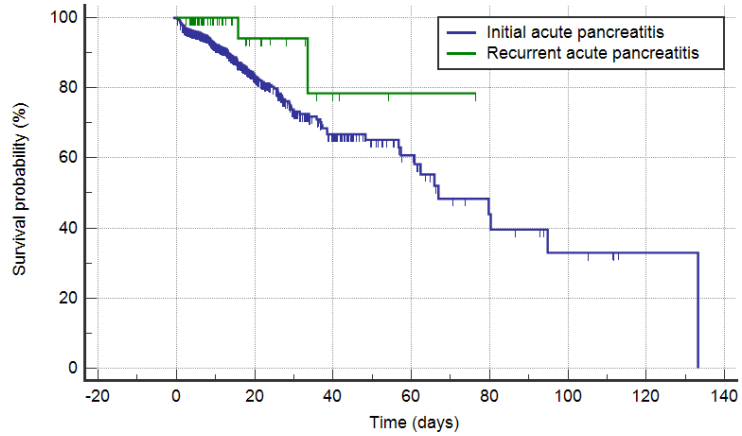
517 ROC=Receiver Operating Characteristic, AUC=Area Under Curve, BISAP=Bedside Index for  
 518 Severity in Acute Pancreatitis, LODS=Logistic Organ Dysfunction System, OASIS=Oxford Acute  
 519 Severity of Illness Score, SAPS II=Simplified Acute Physiology Score II.  
 520

521 **Table 8 Comparison of ROC curves (recurrent acute pancreatitis)**

	AUC	95%CI	Optimal cut-off	Sensitivity (%)	Specificity (%)	Youden' s index
<b>BISAP</b>	0.944	0.849~0.988	>3	100.0	88.89	0.8889
<b>LODS</b>	0.861	0.743~0.939	>7	100.0	81.48	0.8148
<b>OASIS</b>	0.681	0.542~0.799	>27	100.0	50.00	0.5000
<b>SAPS II</b>	0.829	0.704~0.916	>33	100.0	68.52	0.6852

522 ROC=Receiver Operating Characteristic, AUC=Area Under Curve, BISAP=Bedside Index for  
 523 Severity in Acute Pancreatitis, LODS=Logistic Organ Dysfunction System, OASIS=Oxford Acute  
 524 Severity of Illness Score, SAPS II=Simplified Acute Physiology Score II.  
 525





Number at risk

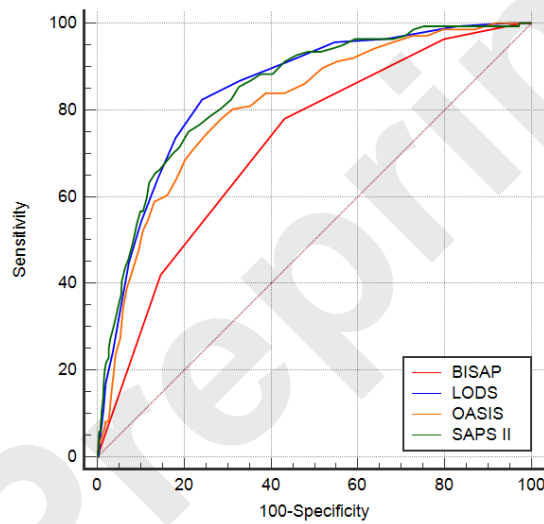
Group: Initial acute pancreatitis	974	973	239	73	26	10	5	1	0
Group: Recurrent acute pancreatitis	56	56	11	3	1	0	0	0	0

526

527

**Figure 1 Kaplan-Meier curves of patients with initial and recurrent acute pancreatitis in the intensive care unit**

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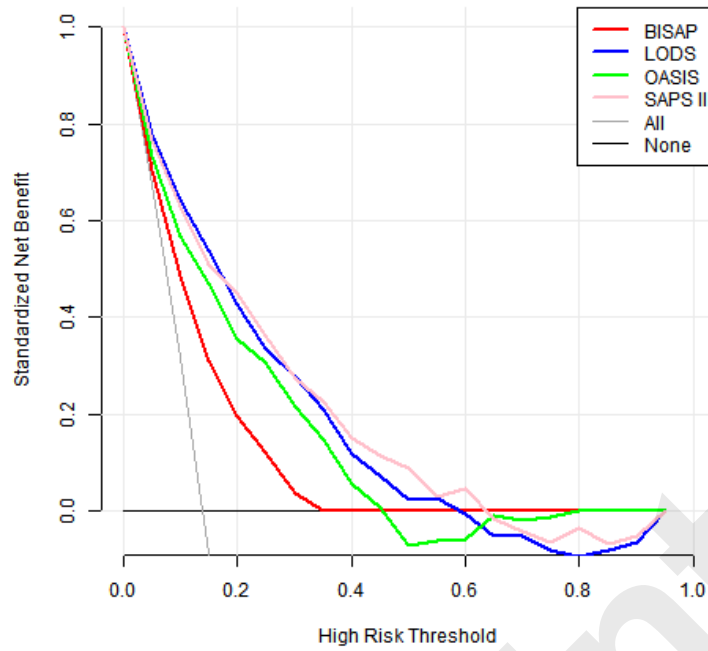


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**Figure 2 ROC curves of four scoring systems for predicting in-hospital mortality in initial acute pancreatitis**

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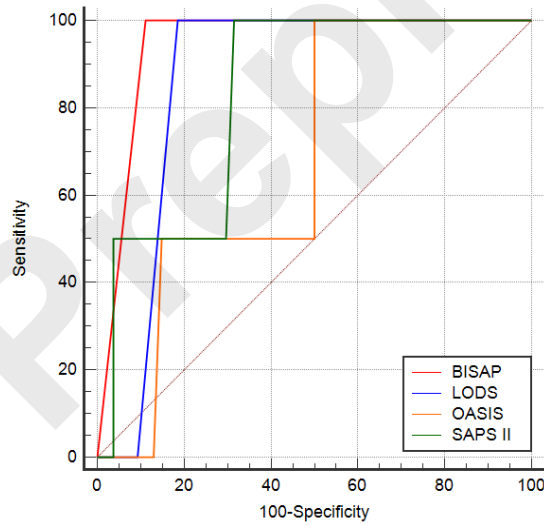


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**Figure 3 DCA curves of four scoring systems for predicting in-hospital mortality in initial acute pancreatitis**

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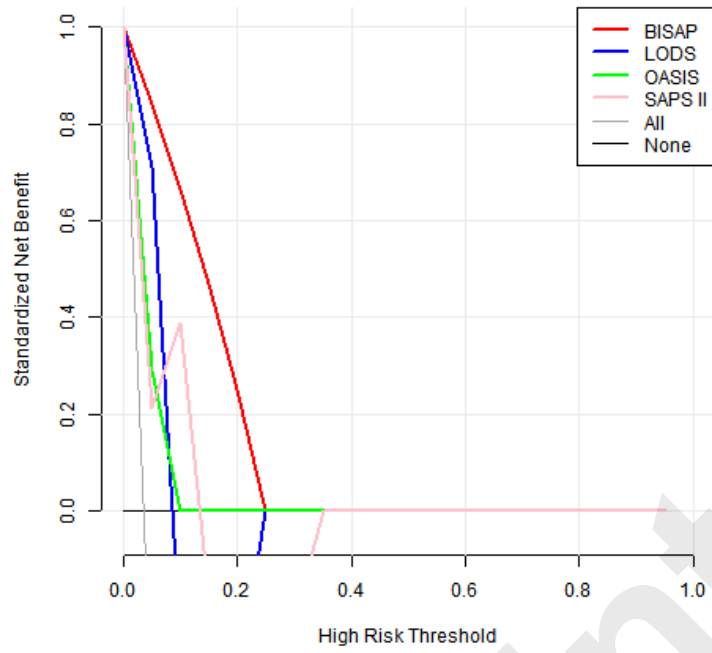


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**Figure 4 ROC curves of four scoring systems for predicting in-hospital mortality in recurrent acute pancreatitis**

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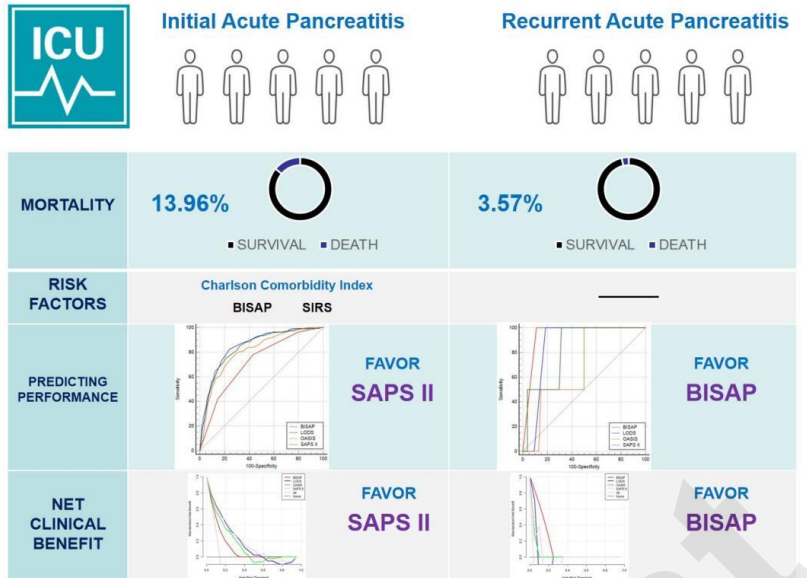


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**Figure 5 DCA curves of four scoring systems for predicting in-hospital mortality in recurrent acute pancreatitis**



#### Take-home messages

1. The in-hospital mortality rate was 13.96% in patients with IAP and 3.57% in patients with RAP.
2. For IAP, the Charlson comorbidity index, BISAP score, and SIRS score were independent risk factors for in-hospital mortality.
3. The SAPS II score was a better scoring system for predicting in-hospital mortality in patients with IAP.
4. The BISAP score showed potential for predicting in-hospital mortality in patients with RAP.

#### Legends

ICU, Intensive Care Unit  
 BISAP, Bedside Index for Severity in Acute Pancreatitis  
 SIRS, Systemic Inflammatory Response Syndrome  
 SAPS II, Simplified Acute Physiology Score II  
 LODS, Logistic Organ Dysfunction System  
 OASIS, Oxford Acute Severity of Illness Score