

1 **Does appropriate empiric antibiotic therapy modify ICU-acquired Enterobacteriaceae bacteraemia**
2 **mortality and discharge?**

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33 **Running title:** ICU-acquired bacteraemia and antibiotics

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36 **Background:** Conflicting results have been found regarding outcomes of intensive care unit (ICU)-
37 acquired Enterobacteriaceae bacteraemia and the potentially modifying effect of appropriate
38 empiric antibiotic therapy.

39

40 **Aim:** We therefore evaluate these associations while adjusting for potential time-varying
41 confounding using methods from the causal inference literature.

42

43 **Methods:** Patients who stayed >2 days in 2 general ICUs in England between 2002 and 2006 were
44 included in this cohort study. Marginal structural models with inverse probability weighting were
45 used to estimate the mortality and discharge associated with Enterobacteriaceae bacteraemia and
46 the impact of appropriate empiric antibiotic therapy on these outcomes.

47

48 **Findings:** Among 3,411 ICU admissions, 195 (5.7%) ICU-acquired Enterobacteriaceae bacteraemia
49 occurred. Enterobacteriaceae bacteraemia was associated with an increased daily risk of ICU death
50 (cause-specific hazard ratio [HR], 1.48; 95% confidence interval [CI], 1.10-1.99) and a reduced daily
51 risk of ICU discharge (HR, 0.66; 95% CI, 0.54-0.80). Appropriate empiric antibiotic therapy did not
52 significantly modify ICU mortality (HR 1.08; 95% CI, 0.59-1.97) or discharge (HR 0.91; 95% CI, 0.63-
53 1.32).

54

55 **Conclusion:** ICU-acquired Enterobacteriaceae bacteraemia was associated with an increased daily
56 risk of ICU mortality. Furthermore, the daily discharge rate was also lower after acquiring infection,
57 even when adjusting for time-varying confounding using appropriate methodology. We found no
58 evidence for a beneficial modifying effect of appropriate empiric antibiotic therapy on ICU mortality
59 and discharge.

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61

62 **Introduction**

63 Bacteraemia is estimated to affect approximately 1.2 million people in Europe each year, of which
64 up to 35% have a nosocomial-onset.¹ Particularly in intensive care unit (ICU) settings, patients have
65 an elevated risk of acquiring bacteraemia due to the severity of their illness and frequent use of
66 invasive procedures, such as central line catheterisation.²

67

68 Enterobacteriaceae are common causative pathogens of bacteraemia.³ None of the studies that
69 evaluated ICU-acquired Enterobacteriaceae bacteraemia outcomes^{2,4,5} have addressed potential
70 confounding by time-varying factors using appropriate methodology. The severity of illness of
71 patients may be both a cause and effect of acquiring Enterobacteriaceae. Standard regression
72 methods have been shown to be inadequate to account for such complex patterns of time-varying
73 confounding by severity of illness; alternative solutions have been proposed instead, such as inverse
74 probability weighting.⁶⁻¹⁰ Because of the lack of studies that make use of such methods, it is not clear
75 to what extent patients die due to or only with ICU-acquired Enterobacteriaceae bacteraemia.

76

77 While several studies indicate that, especially among critically ill patients, appropriate empiric
78 treatment for bacteraemia is associated with reduced mortality,¹¹⁻¹⁹ many other studies did not find
79 a protective effect.²⁰⁻³⁰ Several analyses combined community- and hospital-acquired bacteraemia,
80 adjusting for potential confounders measured at admission and/or at the day of bacteraemia onset,
81 but did not use all available daily information about patients between admission and acquiring the
82 bacteraemia.

83

84 Here, we evaluate the impact of Enterobacteriaceae bacteraemia on ICU discharge and mortality,
85 adjusting for potential time-varying confounding using inverse probability weighting. In addition, we

86 estimate the influence of appropriate empiric antibiotic treatment on these outcomes using the
87 same methodology.

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92 **Methods**93 *Patient data*

94 Clinical records of all patients admitted to one of two general ICUs at Guy's and St Thomas' Hospitals
95 (London, UK) between 2002 and 2006 were obtained. Patients with an ICU length of stay of less than
96 3 days were excluded. From the remaining cohort, we excluded patients with a blood culture
97 positive for Enterobacteriaceae during the first 2 days in the ICU, to exclude community-acquired
98 cases. Age, gender, type of admission (surgical or medical), and ICU ward were recorded at ICU
99 admission. The following variables were recorded at baseline and subsequently on a daily basis:
100 Acute Physiology and Chronic Health Evaluation (APACHE) II score, receipt of systemic
101 antimicrobials, mechanical ventilation, central lines, and renal replacement therapy. In addition, we
102 obtained admission, discharge and mortality data, and microbial culture and sensitivity test results.
103 The effect of the first ICU-acquired microbiological proven Enterobacteriaceae bacteraemia was
104 modelled. Patients were considered to have received appropriate empiric treatment if they were
105 prescribed one or more systemic doses of one or more antibiotics to which the organism cultured
106 was sensitive *in vitro* on the day the blood culture was taken.²⁰

107

108 *Marginal structural model*

109 Marginal structural models along with inverse probability weighting were used to adjust for
110 confounding by severity of illness.

111 In particular, a pseudo-population was constructed by reweighting patients in the risk set on each
112 day (all patients who did not acquire Enterobacteriaceae bacteraemia in one of the previous days) by
113 the inverse of the product of the conditional probabilities of the observed infection status before
114 that day, given the history of time-varying confounders.⁷⁻⁹ After weighting, a pseudo-population
115 remains in which there is no further time-varying confounding by the considered confounders. To
116 additionally estimate the effect of appropriate empiric antibiotic therapy on ICU mortality and

117 discharge, we multiplied the obtained weights for infected patients, from the time of infection
118 onwards, by the reciprocal of the conditional probability that their bacteraemia was appropriately
119 treated or not, given time-varying confounders on the previous day. These weights were calculated
120 as described in Appendix 1.

121

122

123 The marginal structural model was fitted using weighted Cox proportional hazard regression with
124 robust standard errors, thereby accounting for ICU mortality and discharge being competing events.
125 We included the baseline variables used for stabilization of the weights in the final model, to take
126 into account possible residual confounding by those variables.³¹ To evaluate the effect of
127 Enterobacteriaceae bacteraemia, we included a time-varying indicator which was zero before
128 infection and one from the time of infection onwards. The model that was used to estimate the
129 effect of appropriate empiric treatment additionally included an indicator for appropriate treatment,
130 which equalled one if a patient received appropriate empiric antibiotic treatment and zero if the
131 patient either received inappropriate empiric treatment or not (yet) acquired Enterobacteriaceae
132 bacteraemia.

133

134 Although there were no missing values at baseline, there were missing values for the APACHE II
135 score in 3.7% of the subsequent days. Those missing values were imputed using the last observation
136 carried forward method.

137

138 All models were built using R version 3.2.1 (R Foundation for Statistical Computing, Vienna, Austria;
139 packages "ipw", "splines", "survival", "zoo"). The proportional hazard assumption was evaluated
140 graphically by plotting weighted Schoenfeld residuals for all proportional hazards models.

141

142 *Scenario analysis*

143 Despite extensive confounding adjustment, appropriate treatment may still be a marker of more-
144 severe infection. To assess whether this may, indeed, be the case, we evaluated whether patients
145 with more severe infections were more likely to receive appropriate empiric antibiotic treatment.
146 Severe Enterobacteriaceae bacteraemia was defined by the clinical presence of at least three of the
147 following indicators: i) respiratory rate of 22/min or greater; ii) systolic blood pressure of 100mm Hg
148 or less; iii) temperature $>38.5^{\circ}\text{C}$; iv) white blood cell count $>15,000/\text{mm}^3$.
149 Further adjustment for the severity of infection measured on the day the blood culture was taken
150 could also bias the results, as severity markers may actually be measured after initiation of – and
151 hence affected by – (in)appropriate empiric antibiotic therapy. Therefore, we fitted a logistic
152 regression model among patients with Enterobacteriaceae bacteraemia and compared the odds of
153 receiving appropriate treatment for severe versus non-severe Enterobacteriaceae bacteraemia,
154 while adjusting for covariates measured the day before acquiring the bacteraemia.

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156

157

158 **Results**

159 In total, 3,121 patients were included in the study, contributing 3,411 ICU admissions with a length
160 of stay of at least 3 days and without having a blood culture positive for Enterobacteriaceae during
161 the first two days in the ICU. Among those 3,411 ICU admissions, 195 (5.7%) ICU-acquired
162 Enterobacteriaceae bloodstream infections occurred. In 173 (88.7%) cases, only one type of
163 Enterobacteriaceae was isolated from the blood, while for 20 cases 2 (10.3%), and for 2 cases 3 (1%)
164 different types were isolated. The isolated microorganisms were *Escherichia coli* (n=63),
165 *Enterobacter* spp. (n=57), *Klebsiella* spp. (n=50), *Proteus* spp. (n=23), *Serratia* spp. (n=19) and
166 *Citrobacter* spp. (n=7). Median time from ICU admission to bacteraemia onset was 10 (25th – 75th
167 percentile, 7-17) days.

168
169 Patient characteristics on admission are shown in Table I. The crude ICU mortality risk of patients
170 that acquired Enterobacteriaceae bacteraemia was 40.0% compared to 19.5% for patients who did
171 not. Median unadjusted length of stay in the ICU was 22 days (25th-75th percentile, 14-40) for
172 patients acquiring bacteraemia and 7 days (25th – 75th percentile, 4-13) for patients who remained
173 bacteraemia-free.

174
175 Using a marginal structural model, ICU-acquired Enterobacteriaceae bacteraemia was associated
176 with an increased daily risk of death in the ICU (cause-specific hazard ratio [HR], 1.48; 95%
177 confidence interval [CI], 1.10-1.99) (Table II). The daily risk of ICU discharge was reduced (cause-
178 specific HR, 0.66; 95% CI, 0.54-0.80), thereby increasing the length of stay and therefore the overall
179 number of ICU deaths.

180 When extreme weights are generated, inference using marginal structural models is less reliable.^{6,7}

181 The inverse probability weights used in our marginal structural models had a median and mean of
182 0.99 and 0.99, an interquartile range and standard deviation of 0.03 and 0.19, a minimum of 0.13

183 and maximum of 3.24. These values indicate that our analyses are not negatively affected by
184 extreme weights.

185

186 *Appropriate empiric antibiotic treatment*

187 Of all bacteraemia cases caused by Enterobacteriaceae (n=195), 74 (38%) received appropriate
188 empiric antibiotic treatment at the day the blood sample was taken. Of those appropriate empiric
189 antibiotic treatment courses, 92% were with at least one of six antibiotics (gentamicin, ceftazidime,
190 ciprofloxacin, piperacillin/tazobactam, meropenem and amikacin) recommended in local guidelines
191 (Appendix 2).³² Of all patients who did not receive appropriate empiric treatment on the day of
192 infection (n=121), 73 (60%) did receive appropriate treatment at some point during their stay. A
193 switch to appropriate antibiotic treatment occurred for 79% of these patients within 2 days,
194 indicating that if a change was made, it was usually done based on clinical symptoms and before the
195 full microbiological test results, particularly susceptibility test results, were available. In our analysis
196 we only took into account whether treatment was appropriate on the day the sample was taken.

197

198 Appropriate treatment was not significantly associated with the daily risk of ICU mortality (cause-
199 specific HR 1.08; 95% CI, 0.59-1.97) or ICU discharge (cause-specific HR 0.91; 95% CI, 0.63-1.32). The
200 weights used to reweight the patient population had a median and mean of 0.99 and 1.00, an
201 interquartile range and standard deviation of 0.03 and 0.24 (min. 0.14, max. 5.21).

202

203 Secondary analysis showed that severe infections were not associated with an increased odds of
204 receiving appropriate empiric antibiotics (adjusted odds ratio, 1.09; 95% CI, 0.59-2.01).

205

206

207 **Discussion**

208 In this study, ICU-acquired Enterobacteriaceae bacteraemia had a substantial impact on ICU
209 mortality. Moreover, the daily discharge rate was also substantially lower among patients that
210 acquired such an infection, even after adjusting for time-varying confounding using a marginal
211 structural model. Additional length of stay and ICU mortality associated with ICU-acquired
212 Enterobacteriaceae bacteraemia was irrespective of initial empiric treatment, i.e. whether this was
213 appropriate or inappropriate.

214

215 When interpreting the results, it should be noted that our analysis assessed the influence of
216 acquiring Enterobacteriaceae bacteraemia versus not acquiring it on clinical outcomes. Information
217 about bacteraemia caused by other pathogens was ignored. A direct comparison of effect estimates
218 with other studies evaluating the effect of ICU-acquired Enterobacteriaceae bacteraemia is difficult
219 due to different clinical settings, focus on specific bacteria belonging to the Enterobacteriaceae
220 family, and different methodology.

221

222 We found no evidence for initial appropriate empiric antibiotic therapy being associated with ICU
223 mortality or length of stay. Our findings are in line with several recent studies that did not find an
224 association between inappropriate antibiotic therapy and mortality.²⁰⁻³⁰ A recent prospective
225 evaluation of empiric antibiotic therapy and mortality in ten English acute hospitals did not find an
226 association between inappropriate empiric antibiotic therapy and mortality at 7 or 30 days (adjusted
227 OR 0.82; 95% CI 0.35-1.94 and adjusted OR 0.92; 95% CI 0.50-1.66, respectively).²⁰ In that study, it
228 was suggested that the contrasting results with the older literature may reflect advances in
229 supportive care, changes in patient mix and differences in the main antibiotic classes used.²⁰ Another
230 factor that may contribute to the contrasting results in the literature is the substantial variation in
231 methodological quality of different studies.¹³

232

233 We evaluated whether more severe infections were more likely to receive appropriate empirical
234 treatment. However, we found no evidence for severe infections being associated with appropriate
235 empiric treatment. Unfortunately, the data were too limited to be able to assess whether
236 appropriate empiric treatment is only effective in severely ill patients or other subgroups.¹⁷

237

238 Another explanation of the absence of a protective effect may be that the majority of switches to
239 appropriate treatment occurred within 2 days after the blood sample was taken. Hence, changes or
240 escalation of therapy, if necessary from a clinical perspective, were typically done without
241 knowledge of microbiological test results and based on clinical assessment. Such switches may have
242 occurred timely enough to prevent potential detrimental effects of initial inappropriate empiric
243 treatment. This has also been observed in a randomized controlled trial evaluating the potential
244 impact of rapid diagnostic tests, where escalation of therapy often happened before the full lab
245 results were available.³³ Although not powered to assess mortality and length of stay, that trial did
246 not observe lower mortality rates or higher discharge rates among patients in the rapid diagnostic
247 test arms, despite a shorter time to first appropriate antibiotic escalation.³³

248

249 *Strengths and limitations*

250 This is the first study evaluating the effect of ICU-acquired Enterobacteriaceae bacteraemia on ICU
251 discharge and mortality, while addressing confounding by the evolution of disease prior to infection
252 using appropriate methodology. Data were available for several years, providing sufficient power to
253 focus on Enterobacteriaceae instead of all Gram-negative bacteria grouped together.

254

255 Although we took into account as much information as possible and applied advanced statistical
256 methodology to correct for confounding, several limitations must be acknowledged.

257 Despite marginal structural models allowing appropriate adjustment for time-varying confounding,
258 these techniques remain vulnerable to unmeasured or residual confounding. For example, urinary
259 focus may be associated with more resistance and hence more likely inappropriate treatment and at
260 the same time be associated with less severe outcomes than other foci.²⁰ This may have resulted in
261 an underestimation of the beneficial effect of appropriate empiric antibiotic therapy.

262 We evaluated ICU discharge and mortality in the ICU, but follow-up beyond the ICU would have
263 been necessary to fully capture the effect of ICU-acquired Enterobacteriaceae bacteraemia on
264 mortality or total hospital stay.

265

266 Appropriateness of empiric antibiotic treatment was determined based on *in vitro* susceptibility
267 tests. However, treatment classified as inappropriate potentially had some activity *in vivo*.²⁰
268 Likewise, *in vitro* susceptibility does not guarantee susceptibility *in vivo*.

269

270 Due to data limitations in records of more recent years, we had to restrict our analysis to the years
271 2002-2006. Since then, the number of Enterobacteriaceae bacteraemia cases resistant to the most
272 commonly used antibiotics has increased.³ Although this might result in selection of appropriate
273 empiric antibiotic therapy being more difficult in recent years compared with our period of study,
274 this would unlikely substantially affect the modifying effect of appropriate empiric antibiotic therapy
275 itself.

276

277 Preferably, for future analysis, a large multi-centre prospective study will be performed, collecting
278 information about all potential confounders at baseline and during the ICU-stay. Robust estimates
279 can be obtained by analysing such data using inverse probability weighting for marginal structural
280 models, G-estimation for structural nested models, or G-computation.⁶

281

282 ICU-acquired Enterobacteriaceae bacteraemia was associated with an increased daily risk of ICU
283 mortality. Furthermore, the daily discharge rate was also lower after acquiring infection, even when
284 adjusting for time-varying confounding using marginal structural models. When taking into account
285 daily information about patients between ICU admission and acquiring bacteraemia using
286 appropriate methodology, these associations were not modified by appropriate empiric antibiotic
287 treatment. Although our results do not exclude a beneficial impact of empiric antibiotic therapy on
288 ICU mortality and discharge, they suggest the health-economic benefit of rapid diagnostic testing in
289 the ICU setting may be less than initially anticipated and may rely mostly on reductions in antibiotic
290 use and resulting resistance.

291

292

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299

300 *Conflicts of interest:* None

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397 **Table I. Baseline characteristics and crude length of stay and ICU-mortality rates for patients with**398 **and without ICU-acquired Enterobacteriaceae bacteraemia**

	Patients with bacteraemia (n=195)	Patients without bacteraemia (n=3,216)
Male sex, n (%)	131 (67.2)	1,966 (61.1)
Age, mean (SD)	63.1 (14.11)	60.7 (17.11)
APACHE II, mean (SD)	20.1 (6.4)	18.2 (6.5)
Admission type		
Medicine, n (%)	121 (62.1)	1,964 (61.1)
Surgery, n (%)	74 (37.9)	1,252 (38.9)
ICU length of stay, median (Q1, Q3)	22 (14, 40)	7 (4, 13)
ICU mortality, n (%)	78 (40.0)	627 (19.5)

399 Abbreviations: ICU, intensive care unit; SD, standard deviation.

400

401

402

403 **Table II. ICU-acquired Enterobacteriaceae bacteraemia outcomes and influence of appropriate**
 404 **empiric antibiotic therapy**

	ICU mortality CSHR (95% CI)	ICU discharge CSHR (95% CI)
Enterobacteriaceae bacteraemia ^a	1.48 (1.10-1.99)	0.66 (0.54-0.80)
Appropriate empiric antibiotic treatment ^b	1.08 (0.59-1.97)	0.91 (0.63-1.32)

405 Abbreviations: CI, confidence interval; CSHR, cause-specific hazard ratio; ICU, intensive care unit.

406 ^aThe final model estimating the stabilized weights for Enterobacteriaceae bacteraemia at each day included the Acute
 407 Physiology and Chronic Health Evaluation (APACHE) II score, the presence of central lines and antibiotic administration as
 408 time-varying covariates. These weights were stabilized by including gender as a baseline covariate.

409 ^bThe final model estimating the stabilized inverse probability weights for appropriate empiric antibiotic treatment included
 410 the APACHE II score and the presence of central lines as time-varying covariates. These inverse probabilities were stabilized
 411 by including the APACHE II score at admission as a baseline covariate. The final stabilized weights were subsequently
 412 obtained by multiplying the daily stabilized weights for Enterobacteriaceae bacteraemia with the daily stabilized inverse
 413 probabilities for appropriate empiric antibiotic therapy.

414

415 Appendix 1. Calculation of the inverse probability weights.

416 To calculate the inverse probability weights, daily probabilities of acquiring Enterobacteriaceae
417 bacteraemia given baseline and time-varying covariates were estimated by using pooled logistic
418 regression models; these probabilities were set to 1 from the time of bacteraemia onwards. To avoid
419 large weights, we included baseline covariates in the numerator weights and then later also in the
420 marginal structural model.³⁸ We considered all previously listed variables in the model.
421 We allowed for a non-linear effect of time by using restricted cubic splines. Non-linear effects of
422 other continuous covariates, i.e. age, APACHE II score and number of systemic antibiotics at each
423 day, were allowed in the model by including quadratic terms. In addition, we allowed for 2-way
424 interactions between (i) APACHE II score at admission and subsequent daily APACHE II score
425 measurements, and (ii) type of admission and daily APACHE II scores. To build parsimonious models,
426 we first added all main effects to the model and sequentially removed them if nonsignificant at the
427 5% level. Next, the suggested interaction terms and non-linear effects were sequentially added if
428 significant at the 5% level. Similar estimates for the probability that the Enterobacteriaceae
429 bacteraemia of infected patients were appropriately treated were calculated. The obtained
430 probabilities were then used to generate daily patient-specific weighing factors.

431

432 **Appendix 2. Table I. Appropriate antibiotic therapy for ICU-acquired Enterobacteriaceae**433 **bacteraemia**

Appropriate empiric antibiotic therapy at day of first positive blood sample taken (n=74) ^a	N (%)
Amikacin	14 (19)
Amikacin + co-amoxiclav	1 (1)
Amikacin + colistin	1 (1)
Ceftazidime	10 (14)
Ceftazidime + gentamicin	3 (4)
Cefuroxime	3 (4)
Ciprofloxacin	8 (11)
Co-amoxiclav	1 (1)
Colistin	2 (3)
Gentamicin	25 (34)
Piperacillin/tazobactam	6 (8)

434 ^a Only antibiotics shown for which the bacteria were susceptible on the day of the blood sample was taken. E.g. if a patient
 435 received both gentamicin and meropenem, but the bacteria were only sensitive to gentamicin, it is shown as monotherapy
 436 with gentamicin. At the time of the study local guidelines recommended a single antibiotic course for all ICU-acquired
 437 gram-negative infections. All patients with severe sepsis or septic shock were recommended to receive a single dose of
 438 gentamicin if a non-aminoglycoside antibiotic course was selected.

439