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Atrial Fibrillation and In-Hospital Mortality in Covid-19 patients

Irum D. Kotadia, BSc, MBBS, Maria Dias, MBBS, Caroline Roney, PhD, Richard A. Parker, MSc, Robert O'Dowling, MB BCh BAO, Neil Bodagh, BSc, MBChB, MRCP, José-Alonso Lemus-Solis, PhD, Daniel O'Hare, MD, MBChB, Iain Sim, BSc, MBBS, David Newby, PhD, Steven Niederer, PhD, Jonathan Birns, BSc, MBBS, PhD, Peter Sommerville, MA, MBBS, Ajay Bhalla, MD, MSc, FRCP, Mark O'Neill, PhD, MB BCh BAO, Steven E. Williams, PhD, MBChB



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Atrial Fibrillation and In-Hospital Mortality in Covid-19 patients

Short title: AF and in-hospital mortality in Covid-19 patients

Authors: Irum D. Kotadia¹ (BSc, MBBS), Maria Dias¹ (MBBS), Caroline Roney¹ (PhD), Richard A. Parker³ (MSc), Robert O'Dowling¹ (MB BCh BAO), Neil Bodagh¹ (BSc, MBChB, MRCP), José-Alonso Lemus-Solis¹ (PhD), Daniel O'Hare¹ (MD, MBChB), Iain Sim¹ (BSc, MBBS), David Newby³ (PhD), Steven Niederer¹ (PhD), Jonathan Birns² (BSc, MBBS, PhD), Peter Sommerville² (MA, MBBS), Ajay Bhalla² (MD, MSc, FRCP), Mark O'Neill¹ (PhD, MB BCh BAO), Steven E. Williams^{1,3} (PhD, MBChB)

¹ King's College London, London, United Kingdom

² Guy's and St Thomas' NHS Foundation Trust, London, United Kingdom

³ University of Edinburgh, Edinburgh, United Kingdom

Address for correspondence: Dr I D Kotadia, School of Biomedical Engineering and Imaging Sciences, King's College London, 4th Floor North Wing, St. Thomas' Hospital, 249 Westminster Bridge Road, London SE1 7EH; irum.kotadia@kcl.ac.uk

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40 **Abstract:**41 Background:

42 There are conflicting data on whether new-onset AF is independently associated with poor
43 outcomes in Covid-19 patients. This study represents the largest dataset curated by manual
44 chart review comparing clinical outcomes between patients with sinus rhythm, pre-existing
45 and new-onset AF.

46 Objective:

47 The primary aim of this study was to assess patient outcomes in Covid-19 patients with
48 sinus rhythm, pre-existing and new-onset AF. The secondary aim was to evaluate predictors
49 of new-onset AF in patients with Covid-19 infection.

50 Methods:

51 Single-centre retrospective study of patients with a confirmed diagnosis of Covid-19
52 admitted between March and September 2020. Patient demographic data, medical history
53 and clinical outcome data were manually collected. Adjusted comparisons were performed
54 following propensity score matching between those with pre-existing or new-onset AF and
55 those without AF.

56 Results:

57 The study population comprised of 1241 patients. 94 patients (7.6%) had pre-existing AF
58 and 42 patients (3.4%) developed new-onset AF. New-onset AF was associated with
59 increased in-hospital mortality before (OR: 3.58, 95% CI 1.78-7.06, $p < 0.005$) and after (OR:
60 2.80, 95% CI 1.01-7.77, $p < 0.005$) propensity score matching compared with the no AF group.
61 However, pre-existing AF was not independently associated with in-hospital mortality
62 compared to patients with no AF (post-matching OR: 1.13, 95% CI 0.57-2.21, $p = 0.732$).

63 Conclusion:

64 New-onset AF, but not pre-existing AF, is independently associated with elevated mortality
65 in patients hospitalised with Covid-19. This observation highlights the need for careful
66 monitoring of Covid-19 patients with new-onset AF. Further research is needed to explain
67 the mechanistic relationship between new-onset AF and clinical outcomes in Covid-19
68 patients.

69

70 **Keywords:**

71 Covid-19; Atrial fibrillation; Covid-19 and cardiovascular complications; Covid-19 and
72 arrhythmia; SARS-CoV-2

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75 **Introduction:**76 Over 750 million cases of Coronavirus (Covid-19) disease have been reported worldwide.¹

77 The World Health Organisation (WHO) has re-classified Covid-19 from pandemic to endemic

78 status indicating it is likely to remain an ongoing global issue.² With endemicity remains the

79 ability for viral evolution that can be rapid and give rise to more virulent strains as occurred

80 with the Delta and Omicron variants, highlighting the need for ongoing research of the

81 Covid-19 disease process.

82 Atrial fibrillation (AF) has been observed as the most common arrhythmia in the context of

83 Covid-19 disease, with the prevalence rate reportedly as high as 16.5% and linked to

84 haemodynamic compromise in patients with severe illness.³ Over 35 studies have assessed

85 clinical outcomes in patients with AF and Covid-19 however the majority have either

86 grouped all AF patients together or assessed new-onset AF alone.⁴⁻¹¹ Only four studies have

87 described the clinical characteristics and outcomes of pre-existing AF and new-onset AF in

88 patients with Covid-19.^{7,12-14} Of these, three studies have employed manual chart review in

89 samples of 160 to 673 patients, but present conflicting data as to whether new-onset AF is

90 an independent marker of mortality in patients with Covid-19.^{7,12,13} All of these studies

91 include small sample sizes and larger studies are therefore needed to validate these

92 findings.¹⁵⁻¹⁷93 Critically, only one large study has been performed.¹⁴ This study was reliant on natural

94 language processing methods for AF categorisation. Whilst machine learning techniques

95 have shown promise in rapidly assessing large quantities of data, their accuracy has been

96 questioned.¹⁵ Furthermore, a previous study comparing incidence, predictors and outcomes

97 of patients with AF in Covid-19 highlighted significantly higher rates of AF diagnosis using

98 expert physician manual chart review compared with automated data collection.¹⁰ These
99 findings demonstrate the clear need for manual data collection above automatic methods in
100 this subject area.

101 The primary aim of this study was therefore to compare patient outcomes in those with pre-
102 existing AF, new-onset AF and sinus rhythm when hospitalised with Covid-19 infection, using
103 manual chart review. The secondary aim was to evaluate predictors of new-onset AF in
104 patients with acute Covid-19 infection.

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107 Methods:

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109 *Study Design and Population*

110 A single-centre, retrospective cohort study was performed including all adult patients with a
111 completed attendance/admission to Guy's and St Thomas' Hospital (GSTT) who tested
112 positive for SARS-CoV2 by reverse transcription polymerase chain reaction (RT-PCR) on at
113 least one occasion over the period 1st March to 31st September 2020 (*Figure 1*). Ethical
114 approval was granted by Health Research Authorities and the South London Research Ethics
115 Committee (REC: 20/SC/0292). Patients were excluded if they were less than 18 years of
116 age on admission, had an unconfirmed Covid-19 diagnosis (e.g. symptoms consistent with
117 Covid-19 in the absence of a positive test result) or where Covid-19 disease was not the
118 primary reason for admission.

119 The following data were manually extracted from electronic healthcare records by expert
120 physician chart review: patient demographics (age range (18-27, 28-37, 38-47, 48-57, 58-67,
121 68-77, 78-87, 88-97 and >97 years), gender, ethnicity), clinical data (medical and social
122 history, clinical status on admission, clinical progress, investigations, treatment delivery) and
123 clinical outcomes (length of hospital/intensive care unit stay, maximum level of care
124 required, oxygen requirement, need for non-invasive/invasive ventilation, discharge
125 destination, hospital mortality). Patients were grouped according to AF status: new-onset
126 AF, pre-existing AF and no AF. New-onset AF was defined as any diagnosis of atrial
127 fibrillation in a patient not previously diagnosed with atrial fibrillation. Pre-existing AF
128 included all patients with a previous diagnosis of AF, of any subtype, including those who
129 may have been in sinus rhythm at the time of admission. Patients in the no AF group had
130 neither new or pre-existing AF.

131 The primary outcome was all-cause inpatient mortality. Secondary outcomes were
132 intensive care admission, requirement for mechanical ventilation, stroke and systemic
133 thromboembolism.

134 *Definitions*

135 A positive Covid-19 diagnosis was made on nasopharyngeal or oropharyngeal swabs sent for
136 Covid-19 ribonucleic acid testing.

137 *Patient and Public Involvement*

138 This study was performed under the Control of Patient Information (COPI) Notice declared
139 by the Secretary of State for Health and Social Care to support the national response to
140 Covid-19. Informed patient consent was therefore not obtained. The study conforms to the
141 principles outlined in the Declaration of Helsinki. Verbal and written feedback was received
142 from members of the public and incorporated into the study design.

143 *Statistical analysis*

144 Statistical analyses were performed using RStudio (version 1.3.1093; RStudio). Descriptive
145 statistics were used to characterise the study population. Normally distributed continuous
146 variables were expressed as a mean \pm SD and two-sample t-tests were performed to compare
147 groups. Tests for normality and homogeneity in variances were performed using the
148 Shapiro-Wilks test and F-test respectively. Non-parametric data were expressed as
149 median \pm interquartile range and Mann-Whitney U-test performed for group comparison.
150 Unadjusted comparisons were made using Chi Square test (or Fisher's Exact test where
151 sample size was less than 5) for categorical data and included all patients from the original
152 dataset. Adjusted comparisons were performed following propensity score matching
153 between pre-existing/new AF and no AF groups. Propensity score matching was performed
154 using the 'MatchIt' package¹⁶ in RStudio¹⁷ to implement 1:1 'nearest neighbour' matching

155 using propensity scores generated from a logistic regression model. Remaining patients in
156 the no AF group that were not matched were excluded from further analysis. The following
157 covariates were included in the matched design: age group, sex, race and pre-admission
158 CHA₂DS₂VASc score. Pre-admission CHA₂DS₂VASc score has been used as a metric for
159 comorbidity status. Covariate balance was assessed before and after matching. Matched
160 analysis was performed using conditional logistic regression. All covariates were adjusted
161 for in the matched analysis. Inpatient survival probability was measured using Kaplan-Meier
162 analysis. A log rank test was conducted to determine if there were differences in the
163 survival distributions for the different types of intervention. Pairwise comparison was
164 performed to test statistical significance between groups. Post-hoc analysis was performed
165 with Bonferonni correction. All tests were 2-sided and $p < 0.05$ was considered statistically
166 significant.

167

168

Results:

169 From 1st March 2020 to 31st September 2020 there were 1294 patients diagnosed with
170 Covid-19 at our institution. Of these, 1241 patients were admitted with a primary diagnosis
171 of Covid-19 and included in this study (*Table 1*). The median age range was 58-67 years of
172 age and 730 patients (59%) were male. Intensive care unit admission was required in 339
173 patients (26%) whilst 272 patients (22%) required mechanical ventilation.

Covid-19 and New-onset AF

176 AF was the most common arrhythmia in patients with Covid-19 (*Table 2*). During their
177 hospital stay, 42 patients (3.3%) were diagnosed with new-onset AF, of which 30 (71%)
178 required intensive care admission.

179 New-onset AF was associated with an increased risk of mechanical ventilation (odds ratio
180 (OR): 4.59, 95% CI 2.34-9.06, $p < 0.005$) and intensive care admission (OR: 7.19, 95% CI 3.52-
181 15.61, $p < 0.005$) prior to propensity score matching. Statistical significance remained after
182 propensity score matching (mechanical ventilation OR: 14.00, 95% CI 1.84-106.5, $p = 0.01$;
183 intensive care admission OR: 18, 95% CI 2.40-134.83, $p < 0.005$). In-hospital mortality was
184 more likely in patients with new AF (OR: 3.58; 95% CI 1.78-7.06, $p < 0.005$) compared with
185 patients with no known AF and remained elevated after adjustment for age, gender, race
186 and pre-admission CHA₂DS₂VASc Score (OR: 2.80, 95% CI 1.01-7.77, $p = 0.048$) (*Figure 2*).

187 New-onset AF was associated with older age ($p < 0.005$), higher CHA₂DS₂VASc score
188 ($p < 0.005$), elevated white cell count ($p = 0.046$), neutrophil count ($p = 0.010$), C-reactive
189 protein ($p < 0.005$), ferritin ($p = 0.020$), lower albumin ($p < 0.005$) and eGFR ($p = 0.013$) at the
190 time of hospital admission. No association was found with gender ($p = 0.683$) or race
191 ($p = 0.080$).

192 There was a statistically significant difference in survival distributions between patients
193 stratified by AF classification (Figure 3). In-patient survival probability was highest in the no
194 AF group and lowest in the new-onset AF group. Following pair-wise comparison, statistical
195 significance was found between pre-existing AF and no AF groups ($p < 0.005$) and new AF and
196 no AF groups ($p < 0.005$). There was no statistical significance between survival distributions
197 in patients with pre-existing AF and new AF ($p = 0.723$).

198 *Covid-19 and Pre-existing Atrial Fibrillation*

199 A total of 94 patients (7.6%) hospitalised with Covid-19 had pre-existing AF. The median
200 CHA₂DS₂VASc score in patients with pre-existing AF was 3 (IQR 2-4) compared with 1 (IQR 0-
201 2) in the new-onset AF and no AF groups ($p < 0.05$) (Figure 4). Pre-existing AF was also
202 associated with additional co-morbidities including hypertension, diabetes and coronary
203 artery disease ($p = 0.01$) (Table 1). Of the patients with pre-existing AF, 71% were receiving
204 anticoagulation therapy prior to hospital admission.

205 In univariate analysis including all patients from the original dataset, the odds of in-hospital
206 mortality were twice as likely in patients with pre-existing AF compared to patients with no
207 AF (OR: 2.18; 95% CI 1.29-3.59, $p = 0.002$). After propensity score matching there was no
208 statistically significant difference in the primary outcome between patients with pre-existing
209 AF and patients with no AF (OR: 1.13, 95% CI 0.57-2.21, $p = 0.732$) (Figure 2).

210 Pre-existing AF was associated with a reduced risk of mechanical ventilation (OR: 0.11, 95%
211 CI 0.02-0.35, $p < 0.005$) and intensive care admission (OR: 0.36, 95% CI 0.17-1.69, $p < 0.005$)
212 prior to propensity score matching. However, there was no statistical significance after
213 propensity score matching (mechanical ventilation OR: 0.25, 95% CI 0.05-1.18, $p = 0.08$;
214 intensive care admission OR: 0.88, 95% CI 0.32-2.41, $p = 0.80$).

215 **Discussion:**

216 This is the largest study to date using manual chart review to study the relationship
217 between sinus rhythm, new-onset AF, pre-existing AF and clinical outcomes in patients with
218 Covid-19. In contrast to previous studies, the size of this study allowed a matched analysis
219 to be performed between cohorts to reduce the effect of confounding variables. We
220 demonstrate that, in patients hospitalised with Covid-19, new-onset AF is the most common
221 cardiac arrhythmia complication and is associated with an increased risk of all-cause in-
222 hospital mortality, need for mechanical ventilation and critical care admission. In contrast,
223 whilst pre-existing AF is associated with greater prevalence of co-morbidities in hospitalised
224 Covid-19 patients, it is not independently associated with all-cause in-hospital mortality
225 after adjusting for age, gender, race and pre-admission CHA₂DS₂VASc score.

226 *Data Curation*

227 Manual curation of data allows for verification of data, improved data accuracy and a
228 reduction in missing data, challenges that are common when using large registry datasets
229 and automatic methods of data collection.¹⁸ Difficulties in manual curation of large datasets
230 mainly exist due to labour time in the context of limited resources. Larger studies assessing
231 clinical outcomes of patients with Covid-19 and AF have therefore often been performed
232 using automatic extraction from electronic healthcare records or registry datasets.^{5,10,13,14}
233 These techniques have been shown to miss important clinical features. Indeed, in an
234 automated study of 3970 patients with Covid-19, manual review of clinical records in a
235 subset of 1110 patients was found to capture a higher incidence of AF/atrial flutter and
236 prevalence of comorbidities compared with automatic extraction from electronic healthcare
237 records. This highlights significant ongoing limitations of automatic data collection.¹⁰ In the
238 largest study to date of employing automatic data curation methods, AF was diagnosed in

239 1687 of 9564 Covid-19 patients using natural language processing techniques (NLP) and
240 found to be an independent predictor of in-hospital mortality.¹⁴ However, no manual
241 validation was performed in this study. Whilst allowing rapid assimilation of large quantities
242 of data, machine learning techniques such as NLP are reliant on correct inference of
243 electronic health record notes which remains a key challenge in such processing
244 techniques.¹⁹ In contrast to automatic methods of data collection, data in this study were
245 manually curated for improved accuracy and data verification ensuring great confidence in
246 the data obtained.¹⁸

247 *Covid and Pre-existing Atrial Fibrillation*

248 In line with large scale population-based studies, patients with Covid-19 and pre-existing AF
249 were more likely to be older, have increased frailty and pre-existing respiratory or renal
250 disease compared with patients with new-onset AF and no AF.²⁰ They were significantly
251 more likely to have additional vascular risk factors including hypertension, diabetes, heart
252 failure, peripheral vascular disease, and coronary artery disease. These data therefore
253 suggest that pre-existing AF is a surrogate marker for morbidity status rather than an
254 independent marker of mortality in Covid-19. This observation accounts for the present
255 study findings of a statistically significant increase in the risk of in-hospital mortality of
256 patients with pre-existing AF in unadjusted analysis, yet a non-significant finding after
257 propensity score matching.

258 Furthermore, lower baseline functional state and increased morbidity in this cohort may
259 have resulted in reduced admissions to intensive care and invasive ventilation compared
260 with patients with new-onset AF due to clinical recommendations and pre-agreed
261 restrictions on appropriate ceiling of care and resuscitation status. This may provide an

262 explanation for pre-existing AF being 'protective' against intubation and ventilation in Covid-
263 19 infection in unadjusted analysis.

264 *Covid and New-onset AF*

265 In contrast to patients with pre-existing AF, patients with new-onset AF were younger, with
266 fewer co-morbidities and a lower CHA₂DS₂VASc score. Furthermore, hypertension and
267 diabetes in particular were more common in the new-onset AF group compared with the
268 sinus rhythm group. It is well established that hypertension and diabetes have specific
269 effects on atrial structure and electrophysiological function, and these effects are frequently
270 documented in experimental models in the absence of sustained AF. As such, it is feasible
271 that the new-onset AF group may highlight a group of patients that are susceptible to AF,
272 which becomes clinically apparent during severe Covid-19 infection.

273 In keeping with the findings of this study, previous studies have noted an increase in
274 markers of disease severity and need for intensive care admission in new-onset AF patients
275 compared with pre-existing AF and sinus rhythm patients.^{13,14} Smaller studies have
276 provided conflicting data on whether new-onset AF is an independent markers of disease
277 severity and all-cause mortality in patients with Covid-19. Both Russo et al. and Sanz et al.
278 demonstrated no difference in acute respiratory syndrome or all-cause mortality in patients
279 with new-onset AF compared to those with no AF.^{7,12} However, Sano et al. demonstrated
280 significantly worse outcomes in patients with new-onset AF compared with patients in sinus
281 rhythm or those with pre-existing AF. In this study, which is currently the largest manually
282 curated dataset, new-onset AF was found to be independently associated with increased
283 need for mechanical ventilation, critical care admission and inpatient mortality. The time of
284 AF onset is unknown as this data was not collected during this study and therefore it is
285 unclear whether the development of new-onset AF is an early or late marker of severe

286 Covid-19 disease. Further research is needed to investigate whether new-onset AF predicts
287 future clinical deterioration.

288

289 In the present study, AF was the most common cardiac arrhythmia present. This finding has
290 also been observed in several other studies where the prevalence of new-onset AF ranged
291 from 3.5-7.5%.^{12,21-23} Whilst previous studies have reported worse outcomes in patients
292 with AF and Covid-19, this study is the first to disentangle the relationship between
293 outcomes in patients with pre-existing AF and new-onset AF with the analysis certainty
294 brought by manual chart review. This study demonstrates that new-onset AF but not pre-
295 existing AF is independently associated with in-hospital mortality. This is of particular
296 importance since only new-onset AF can be a direct consequence of Covid-19 infection.
297 Previous studies have suggested that Covid-19 may have cardio-toxic effects via direct and
298 indirect mechanisms and new-onset AF may therefore be a specific marker of cardiac injury
299 resulting in poorer outcomes.²⁴ Recent data indicates that cardiovascular complications of
300 Covid-19 continue to occur following Covid-19 infection.²⁵ Although the specific
301 pathophysiology of this remains under investigation and is likely multi-faceted, possible
302 mechanisms include the effects of Covid-19 infection on ACE2-related signalling pathways,
303 cytokine storm, changes in fluid balance, hypokalaemia, hypoxaemia and activation of the
304 sympathetic nervous system.^{24,26,27} However, several of these mechanisms are not specific
305 to Covid-19 infection but can be attributed to the physiological response to critical illness. It
306 is recognised that non-Covid acute respiratory viral infection requiring critical care
307 admission is associated with an increased incidence of new-onset AF.²⁸ The presence of
308 new-onset AF may therefore be a marker of disease severity rather than a specific
309 consequence of Covid-19 infection, although this requires further investigation.

310 Nevertheless, patients diagnosed with new-onset AF in the context of Covid-19 should be
311 monitored closely for acute deterioration and need for advanced care.

312

313 *Limitations*

314

315 Although this was a single-centre study, the population served by our institution is diverse
316 as reflected by the demographic and ethnicity variability in the study population. This study
317 included patients hospitalised and therefore excludes asymptomatic patients or those with
318 mild Covid-19 symptoms. Furthermore, patients were not followed up beyond their
319 hospital stay and clinical outcomes therefore represent the acute phase of Covid -19
320 disease.³⁰ Covid-PCR testing was used to determine Covid status and whilst there may be
321 false positive or negative results, it remains the gold standard diagnostic investigation for
322 Covid-19 infection. Finally, new-onset AF patients were defined as such if there was no
323 known history of AF within the community. Without continuous heart rhythm within the
324 community, it is feasible that some of these patients may have had asymptomatic pre-
325 existing AF. Of the 45 patients categorised in the new-onset AF group, 10 patients had
326 historical ECGs that confirmed sinus rhythm prior to admission. Whilst we acknowledge this
327 does not exclude a history of paroxysmal AF, it is noted that this is a frequent limitation
328 present in all large population-based AF studies including the Framingham Study and more
329 recently the FinACAF Study.^{29,30} The results of this study are therefore interpretable
330 through the same lens as this large body of prior literature.

331

332 Conclusion:

333

334 In patients hospitalised with Covid-19, new-onset atrial fibrillation is independently
335 associated with elevated risk of need for mechanical ventilation, critical care admission and
336 in-hospital mortality. In contrast, whilst pre-existing AF is associated with greater
337 prevalence of co-morbidities in hospitalised Covid-19 patients, it is not independently
338 associated with all-cause in-hospital mortality after adjusting for age, gender, race and pre-
339 admission CHA₂DS₂VASc score. Patients with new-onset AF in the context of Covid-19
340 should be closely monitored for acute deterioration and need for escalation of care. This
341 study highlights the need for targeted research to explain the mechanistic relationship
342 between new-onset atrial fibrillation and Covid-19 disease.

343

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	Pre-existing atrial fibrillation (n=93)	New atrial fibrillation (n=42)	No atrial fibrillation (n=1106)	P-value
Age range, median (yrs)	78-87	68-77	58-67	<0.005
Sex, No. (%)				0.25
Male	49 (53)	22 (52)	659 (60)	
Race, No. (%)				0.24
White	43 (46)	22 (52)	434 (39)	
Black	6 (6)	3 (7)	87 (8)	
Asian	5 (5)	1 (2)	32 (3)	
Other minority ethnic	30 (32)	7 (17)	352 (32)	
Unknown	10 (11)	9 (21)	200 (18)	
Body Mass Index (BMI), median category	25-29.9	25-29.9	25-29.9	0.99
Co-morbidities, No. (%)				
Hypertension	22 (24)	9 (21)	147 (13)	0.01
Diabetes	37 (41)	16 (38)	299 (27)	0.01
Heart failure	22 (24)	0 (0)	35 (3)	<0.005
Peripheral vascular disease	20 (22)	1 (2)	58 (5)	<0.005
Coronary artery disease	14 (15)	4 (10)	60 (5)	<0.005
Chronic respiratory disease	31 (33)	7 (17)	211 (19)	<0.005
Chronic renal disease	33 (35)	7 (17)	157 (14)	<0.005
Previous stroke/TIA	12 (13)	0 (0)	35 (3)	<0.005
CHA₂DS₂VASc Score, No. (%)				
0	3 (3)	7 (17)	304 (28)	<0.005
1	6 (6)	9 (21)	354 (32)	
>1	85 (91)	26 (62)	447 (40)	
Pre-morbid state, No. (%)				<0.005
Independent	44 (48)	39 (93)	936 (85)	
POC	38 (41)	1 (2)	88 (8)	
Residential home	0 (0)	0 (0)	7 (1)	
Nursing home	12 (13)	2 (5)	67 (6)	
Unknown	0 (0)	0 (0)	7 (1)	
Anticoagulation status pre-admission, No. (%)				<0.005
None	11 (13)	32 (76)	897 (81)	
Anti-platelets	15 (16)	9 (21)	136 (12)	
Prophylactic LMWH	1 (1)	1 (2)	8 (1)	
Warfarin/DOAC/Treatment dose LMWH	67 (72)	0 (0)	54 (5)	
Unknown	0 (0)	0 (0)	10 (1)	

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Table 1: Demographics and clinical baseline characteristics of patients with Covid-19 infection, stratified by diagnosis of atrial fibrillation. BMI = Body mass index, TIA = transient ischaemic attack, POC = package of care, LMWH = low molecular weight heparin, DOAC = direct oral anticoagulant. P-values represent those calculated by Kruskal-Wallis test.

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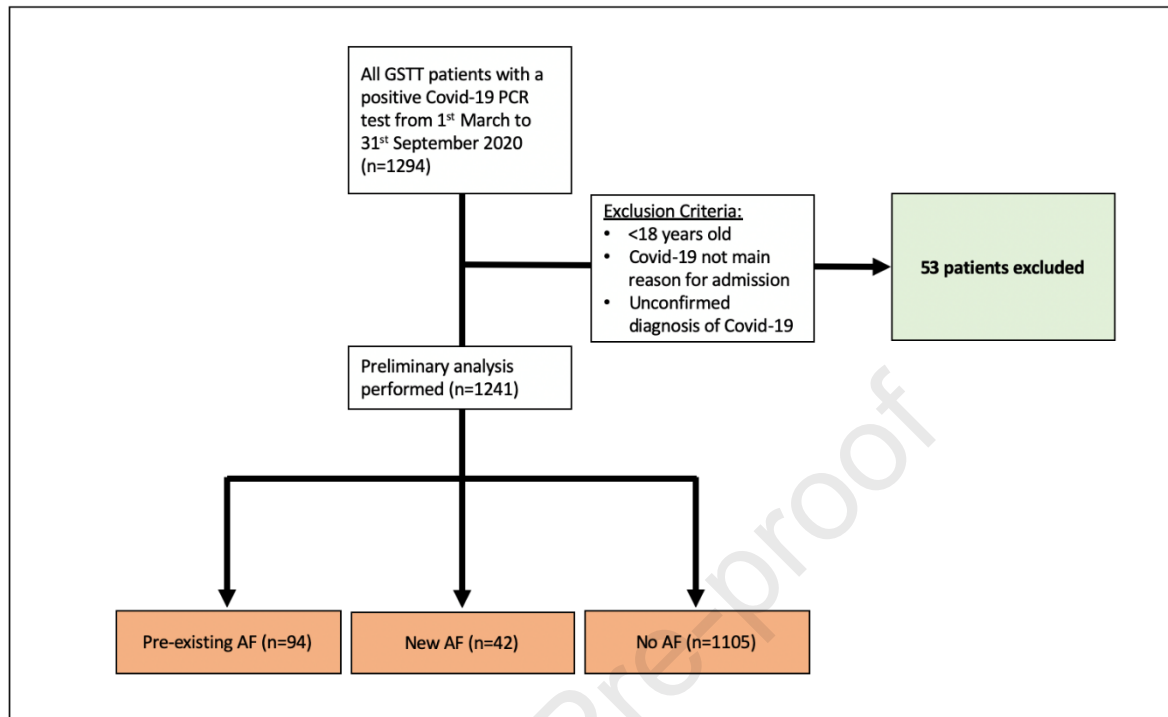
Arrhythmia Sub-type	No. of patients (%)
Atrial Fibrillation	42 (3.4)
Bradyarrhythmia	14 (1.1)
Supraventricular Tachycardia	8 (0.6)
Ventricular Tachycardia	6 (0.5)
Atrial Flutter	3 (0.2)

462 *Table 2: Sub-classification of arrhythmia complications in patients admitted with Covid-19*
463 *infection*

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468 **Figures:**

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470 Figure 1: Study profile. GSTT = Guy's and St Thomas' Hospital, AF = Atrial fibrillation.

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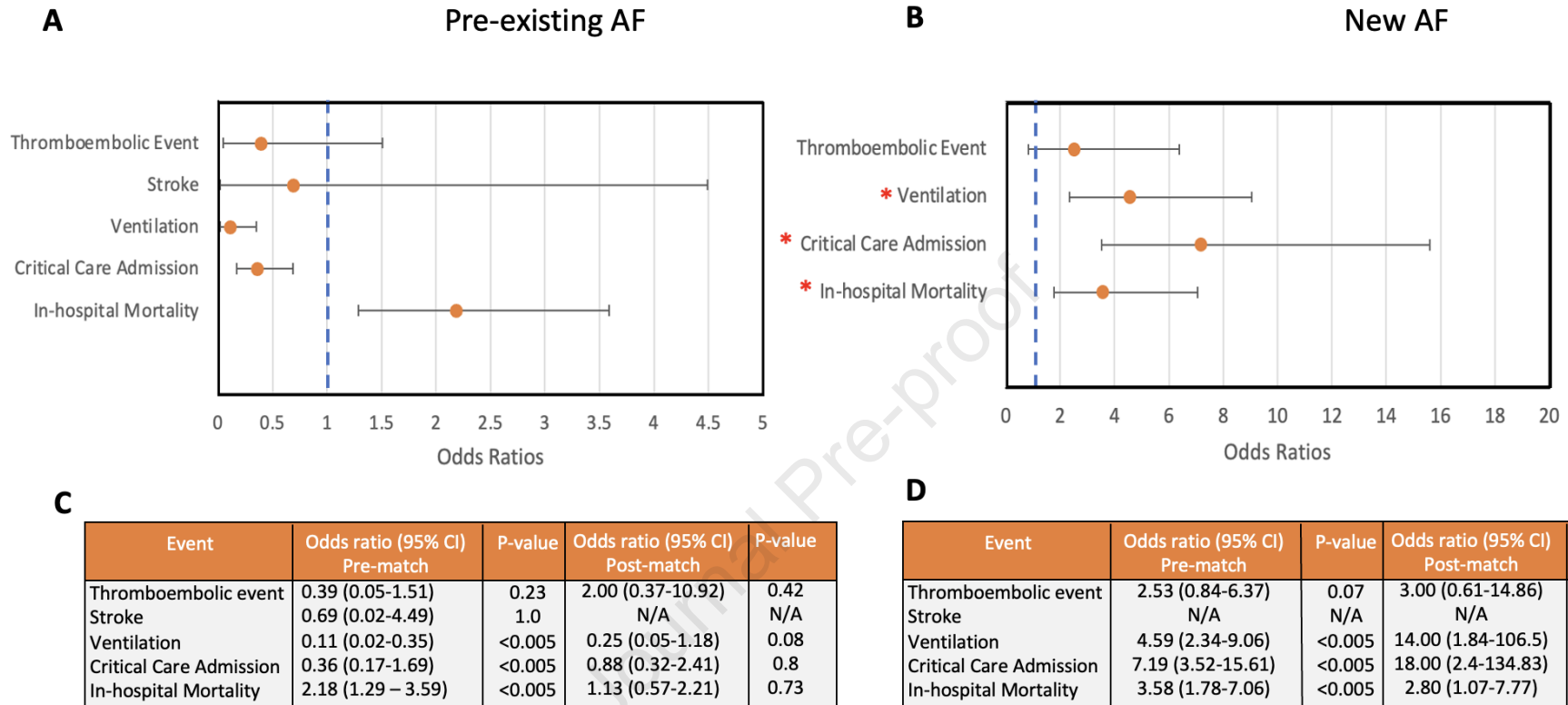
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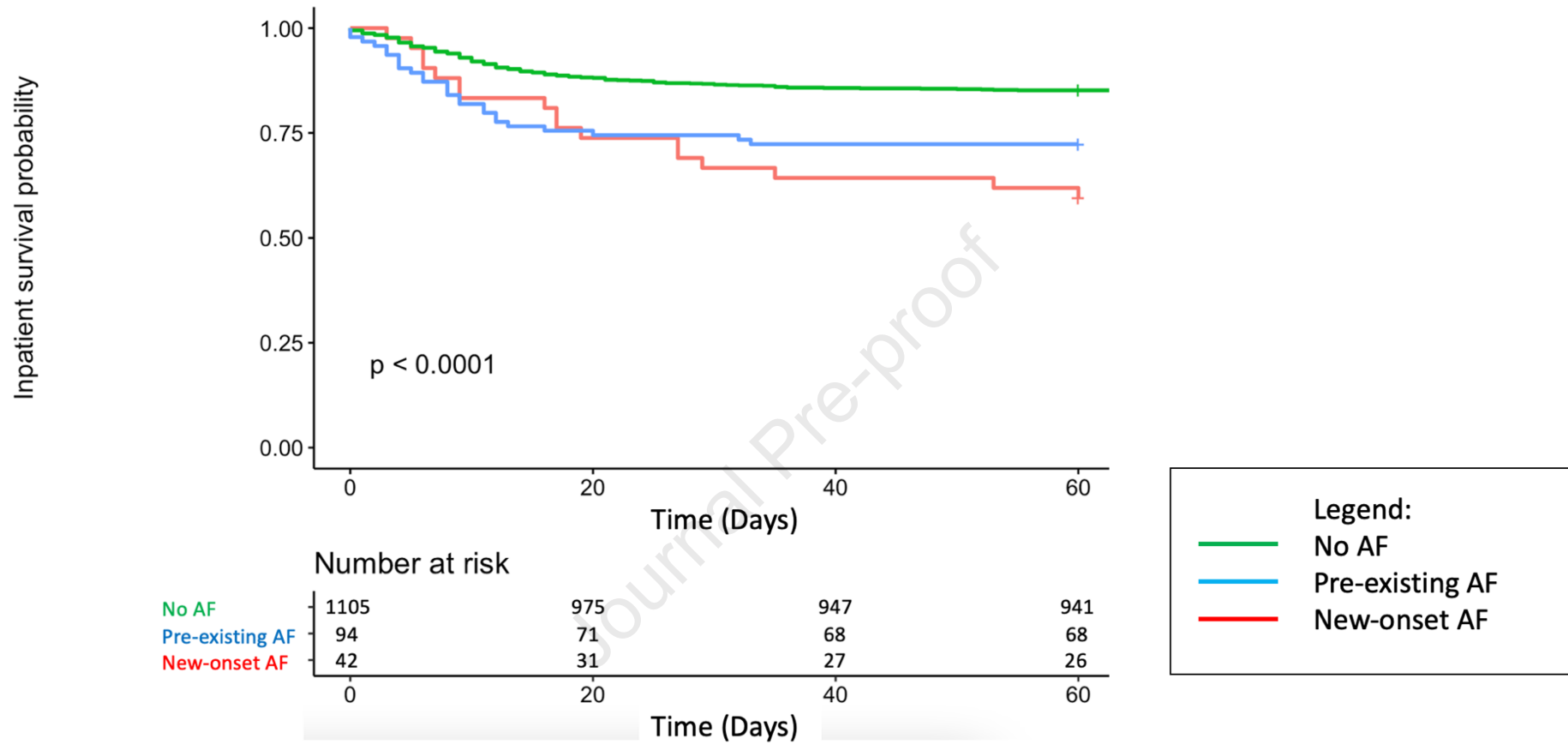
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483 *Figure 2: Forest plots and tabulation representing pre-match and post-match odds ratios for thromboembolic event, ischaemic stroke,*
 484 *ventilation, critical care admission and in-hospital mortality in patients with pre-existing atrial fibrillation (A and C) and new atrial fibrillation (B*
 485 *and D) compared to patients with no atrial fibrillation. CI = confidence interval.*

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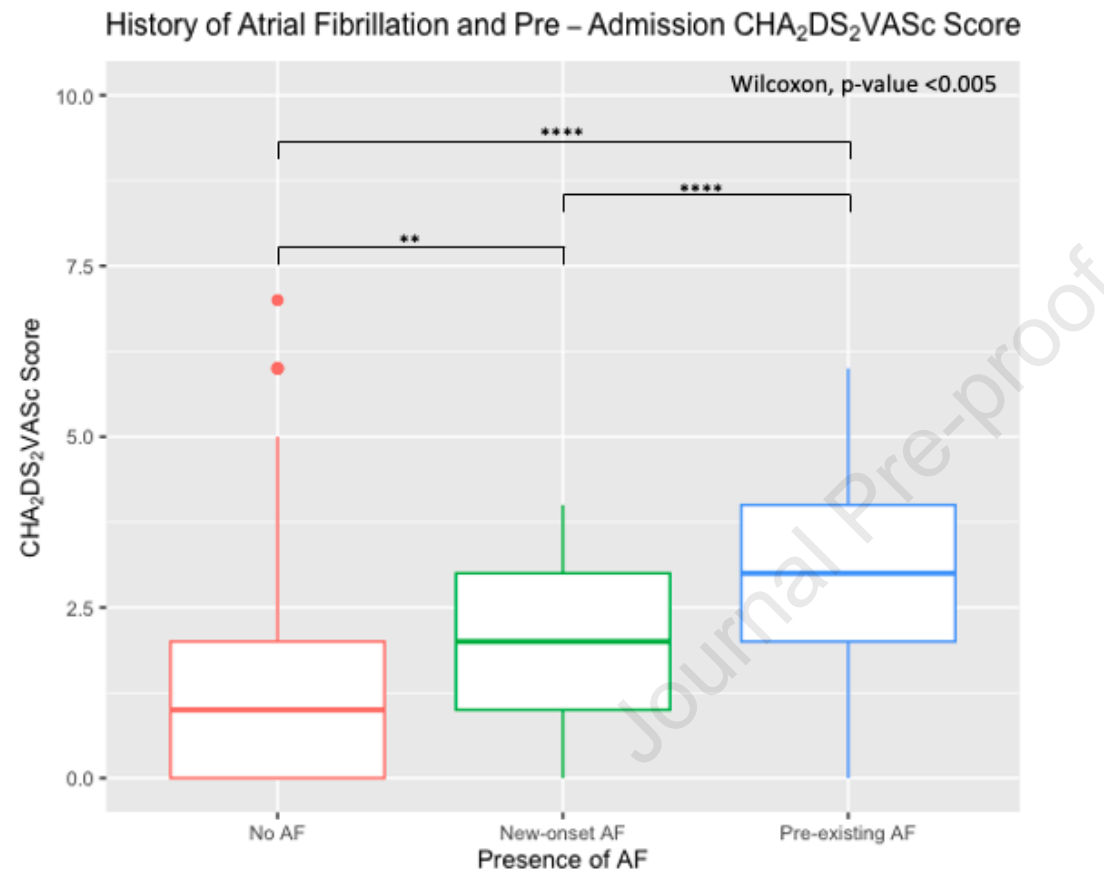


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489 *Figure 3: Kaplan-Meier Curve for all-cause mortality in patients with new-onset atrial fibrillation, pre-existing atrial fibrillation and no atrial*
 490 *fibrillation demonstrating reduced inpatient survival in the new-onset atrial fibrillation group compared with the no atrial fibrillation group. AF*
 491 *= atrial fibrillation.*

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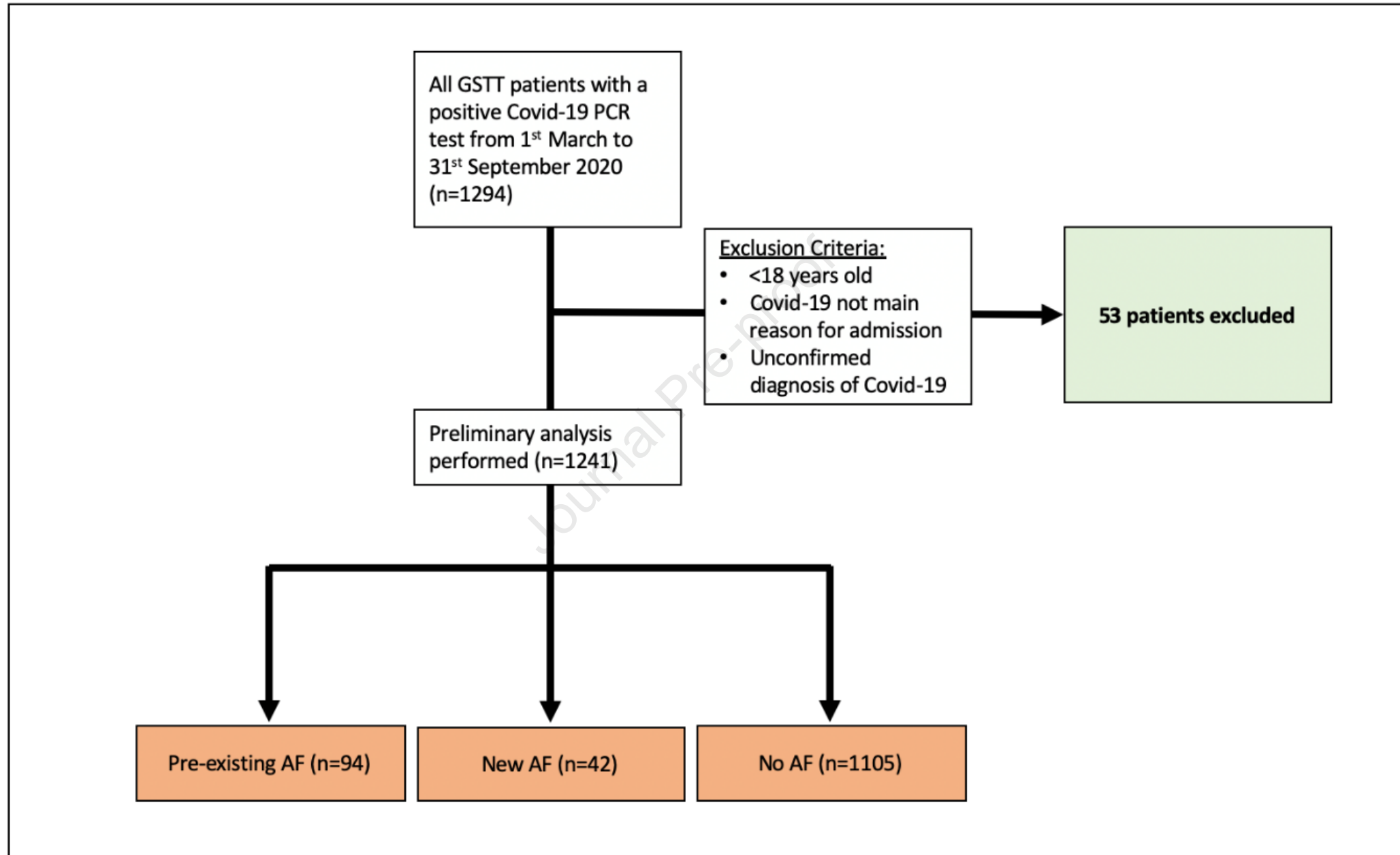
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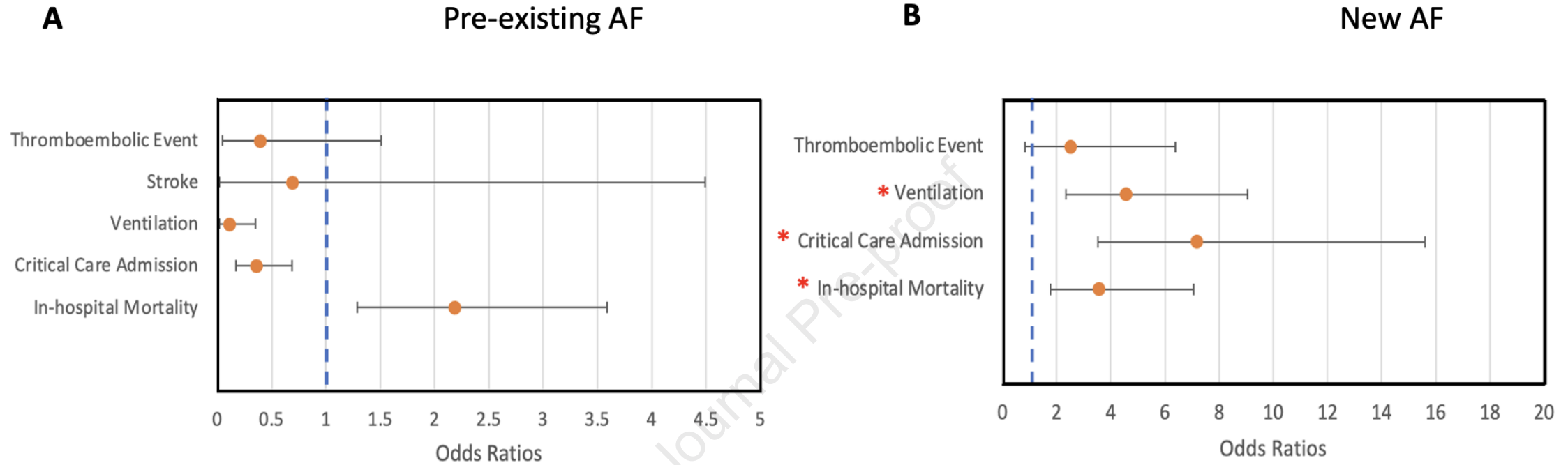


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519 *Figure 4: History of Atrial fibrillation and pre-admission CHA₂DS₂VASc score. Increased pre-admission CHA₂DS₂VASc score between no AF and*
 520 *new-onset AF, New-onset AF and pre-existing AF and No AF and pre-existing AF (p-value <0.05).*

Journal Pre-proof



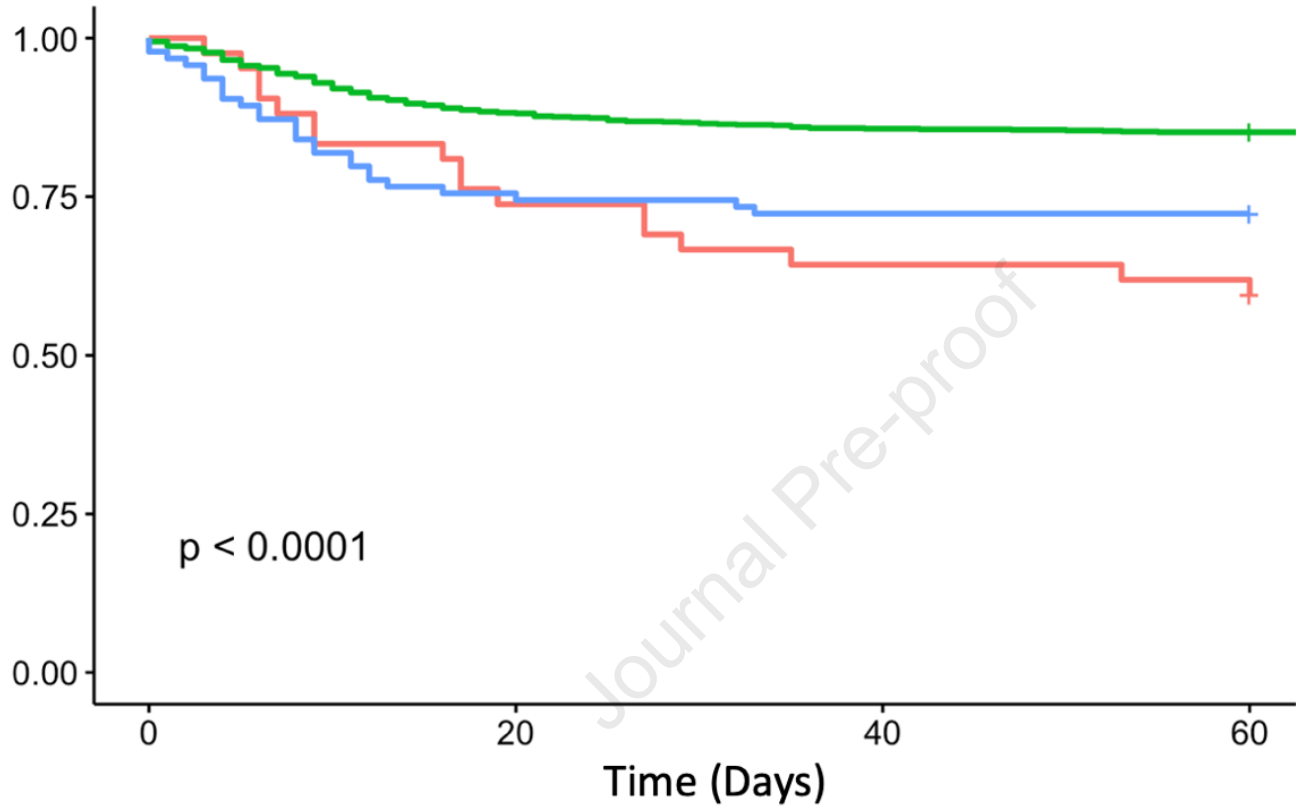
**C**

Event	Odds ratio (95% CI) Pre-match	P-value	Odds ratio (95% CI) Post-match	P-value
Thromboembolic event	0.39 (0.05-1.51)	0.23	2.00 (0.37-10.92)	0.42
Stroke	0.69 (0.02-4.49)	1.0	N/A	N/A
Ventilation	0.11 (0.02-0.35)	<0.005	0.25 (0.05-1.18)	0.08
Critical Care Admission	0.36 (0.17-1.69)	<0.005	0.88 (0.32-2.41)	0.8
In-hospital Mortality	2.18 (1.29 – 3.59)	<0.005	1.13 (0.57-2.21)	0.73

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Event	Odds ratio (95% CI) Pre-match	P-value	Odds ratio (95% CI) Post-match	P-value
Thromboembolic event	2.53 (0.84-6.37)	0.07	3.00 (0.61-14.86)	0.18
Stroke	N/A	N/A	N/A	N/A
Ventilation	4.59 (2.34-9.06)	<0.005	14.00 (1.84-106.5)	0.01
Critical Care Admission	7.19 (3.52-15.61)	<0.005	18.00 (2.4-134.83)	<0.005
In-hospital Mortality	3.58 (1.78-7.06)	<0.005	2.80 (1.07-7.77)	0.05

Inpatient survival probability



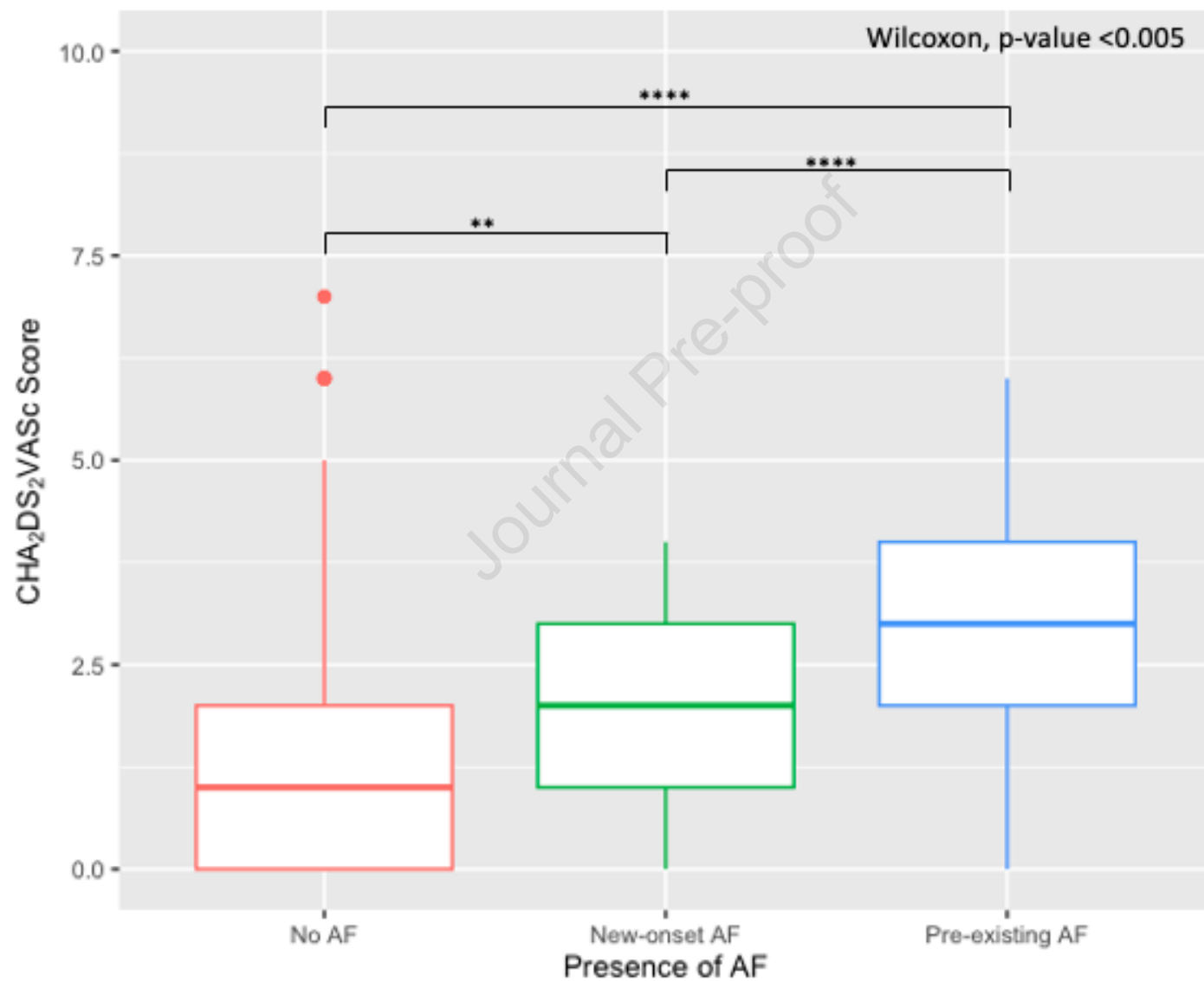
Number at risk

No AF	1105	975	947	941
Pre-existing AF	94	71	68	68
New-onset AF	42	31	27	26
	0	20	40	60

Time (Days)

Legend:

- No AF
- Pre-existing AF
- New-onset AF

History of Atrial Fibrillation and Pre - Admission CHA₂DS₂VASc Score

Key Findings:

- New-onset atrial fibrillation is the most common cardiac arrhythmia complication in patients hospitalised with Covid-19.
- Pre-existing atrial fibrillation is not associated with all-cause in-hospital mortality in patients with Covid-19 after adjusting for age, sex, race and pre-admission CHA₂DS₂VASc score.
- Patients with new-onset atrial fibrillation in the context of Covid-19 have an increased risk of all-cause in-hospital mortality, need for mechanical ventilation and critical care admission.
- Patients with new-onset AF in the context of Covid-19 should be closely monitored for acute deterioration and need for escalation of care.