

1 **Impact of Symptomatic Menopausal Transition on the Occurrence of Depression,**
2 **Anxiety, and Sleep Disorders: A Real-World Multi-Site Study**

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40 **Short title**

41 Symptomatic Menopausal Transition and Mental Health

42

43 **Abstract**

44 **Background**

45 The menopause transition is a vulnerable period that can be associated with changes in mood
46 and cognition. The present study aimed to investigate whether a symptomatic menopausal
47 transition increases the risks of depression, anxiety, and sleep disorders.

48 **Methods**

49 This population-based, retrospective cohort study analysed data from five electronic health
50 record databases in South Korea. Women aged 45–64 years with and without symptomatic
51 menopausal transition were matched 1:1 using propensity-score matching. Subgroup analyses
52 were conducted according to age and use of hormone replacement therapy (HRT). A primary
53 analysis of 5-year follow-up data was conducted, and an intention-to-treat analysis was
54 performed to identify different risk windows over 5 or 10 years. The primary outcome was
55 first-time diagnosis of depression, anxiety, and sleep disorder. We used Cox proportional
56 hazard models and a meta-analysis to calculate the summary hazard ratio (HR) estimates
57 across the databases.

58 **Results**

59 Propensity-score matching resulted in a sample of 17,098 women. Summary HRs for
60 depression (2.10; 95% confidence interval [CI] 1.63–2.71), anxiety (1.64; 95% CI 1.01–
61 2.66), and sleep disorders (1.47; 95% CI 1.16–1.88) were higher in the symptomatic
62 menopausal transition group. In the subgroup analysis, the use of HRT was associated with an

63 increased risk of depression (2.21; 95% CI 1.07–4.55) and sleep disorders (2.51; 95% CI
64 1.25–5.04) when compared with non-use of HRT.

65 **Conclusions**

66 Our findings suggest that women with symptomatic menopausal transition exhibit an
67 increased risk of developing depression, anxiety, and sleep disorders. Therefore, women
68 experiencing a symptomatic menopausal transition should be monitored closely so that
69 interventions can be applied early.

70 **Keywords:** Anxiety, Depression, Sleep disorder, Perimenopause, Risk factors

71

72

73 **1. Introduction**

74 The menopause transition is a vulnerable time in which women may experience
75 changes in cognition and mood [1,2]. In self-report surveys conducted in the United
76 Kingdom, half of all menopausal women reported feeling depressed, 37% reported anxiety,
77 65% reported cognitive impairment, and 64% reported sleep disturbances [3]. The
78 menopause transition is marked by dramatic changes in levels of sex hormones such as
79 oestrogen. These hormonal changes are associated with vasomotor, somatic, cognitive, and
80 mood changes [4]. Specifically, oestrogen is known to interact with serotonin, a
81 neurotransmitter that modulates mood [5,6]. In addition to serotonin, oestrogen interacts with
82 noradrenaline, a neurotransmitter associated with energy levels, sleep, and arousal [7,8].

83 A previous study reported that women who experienced a more symptomatic
84 menopausal transition were at greater risk of depressive symptoms [9]. Moreover, research
85 has demonstrated strong positive associations between symptomatic menopausal transition,
86 which refers to the presence of severe menopausal symptoms during the menopause
87 transition, and mood and anxiety disorders [10]. Although one third of women who
88 experience perimenopause are considered to have symptomatic menopausal transition [11],
89 few studies have focused on the relationship between symptomatic menopausal transition and
90 mental wellbeing, and their relationship remains unclear [10,12].

91 Hormone replacement therapy (HRT) with oestrogen is administered to treat severe
92 menopausal symptoms. HRT is mainly used to relieve vasomotor symptoms, but it may also
93 improve mood symptoms [13,14]. In the ancillary Cognitive and Affective Study (KEEPS-
94 Cog) of the Kronos Early Estrogen Prevention Study (KEEPS), women receiving HRT

95 experienced improvements in symptoms of depression and anxiety, but not in cognitive
96 function [15]. However, KEEPS-Cog was limited to women in late menopausal transition and
97 the early postmenopausal periods, and the effect of HRT in women with symptomatic
98 menopausal transition was not examined.

99 Evaluating the long-term effects of symptoms during the menopause transition
100 during the menopause transition may aid in identifying potential factors influencing the
101 development of psychiatric disorders. The current study aimed to characterise the relationship
102 between symptomatic menopausal transition and the risks of depression, anxiety, and sleep
103 disorders. Further, we aimed to evaluate the effects of HRT on the risk of adverse outcomes
104 in women with symptomatic menopausal transition.

105

106 **2. Methods**

107 **2.1. Study design and data sources**

108 We performed a population-based, retrospective observational cohort study using
109 data from approximately 7 million patients across five electronic health record databases in
110 South Korea: Ajou University Hospital (AJH), Kangdong Sacred Heart Hospital (KDH),
111 Myoungji Hospital (MJH), Kangwon University Medical Center (KWMC), and Pusan
112 National University Hospital (PNUH) (see Supplementary Method S1). These databases were
113 standardised using the Observational Medical Outcomes Partnership Common Data Model
114 version 5 [16]. This study was performed using a bio-health big data platform supported by
115 the Korean National Project (<https://feedernet.com>), which comprises electronic health record
116 data from 37 hospitals (50 million patients) in South Korea.

117 Symptomatic menopausal transition manifests with many different somatic
118 symptoms, and women who experience symptomatic menopausal transition can be diagnosed
119 with symptomatic menopausal transition [10,17]. For the current analysis, women diagnosed
120 with symptomatic menopausal transition (ICD-10-CM code: N95) were included in the study
121 cohort, while those without symptomatic menopausal transition were included in the
122 comparison cohort. Symptomatic menopausal transition (N95) included subcodes such as
123 Postmenopausal bleeding (N95.0), Menopausal and female climacteric states (N95.1),
124 Postmenopausal atrophic vaginitis (N95.2), Other specified menopausal and perimenopausal
125 disorders (N95.8), and Unspecified menopausal and perimenopausal disorder (N95.9). A flow
126 diagram of selection for the study and comparison cohorts is shown in Figure 1. First, we
127 used these databases to identify women aged 45–64 years who were experiencing
128 menopausal transition [12]. We excluded patients with a history of gynaecological diseases
129 (ovarian, endometrial, cervical, and breast cancer) and artificial menopause (hysterectomy,
130 radiotherapy, and chemotherapy). We also excluded patients with a history of psychiatric
131 disorders (depressive disorder, anxiety disorder, and sleep disorder) before the
132 perimenopausal phase. For those without symptomatic menopausal transition, we excluded
133 patients with a history of oestrogen exposure. The date of the first hospital visit at which
134 symptomatic menopausal transition was diagnosed was identified as the index date for each
135 woman in the study cohort, whereas the index date for each woman in the comparison cohort
136 was defined as the date of the earliest hospital visit. Further details of the cohort definitions
137 are presented in Supplementary Method S2.

138 We conducted distributed network analyses, as described in previous studies [18].

139 The study package for the entire process was built on the OHDSI Methods Library in R and
140 is available online at <https://github.com/ABMI/ImpactOfPMSONMentalDisorder>. Each data
141 partner executed this package locally inside the firewall. The pre-designated statistical results
142 (without patient-level information) were then shared for interpretation and database-level
143 meta-analysis. All partners received institutional review board approval or exemption (IRB
144 number: AJIRB-MED-MDB-21-637).

145

146 **2.2. Outcomes**

147 This study investigated the association between symptomatic menopausal transition
148 diagnosis and the risk of psychiatric disorders. The primary outcome was first-time diagnosis
149 of depression, anxiety, , and/or sleep disorder. To increase the diagnostic accuracy, we
150 included all depressive disorders except bipolar depression, all anxiety disorders except
151 phobic disorder, and all sleep disorders except obstructive sleep apnoea and narcolepsy.
152 Furthermore, we applied a restricted definition of the outcomes, which included at least one
153 diagnosis and at least two medication prescriptions (antidepressants for depression,
154 anxiolytics for anxiety disorder, and sleep medications for sleep disorder) any time after the
155 first diagnosis of any of the above psychiatric disorders. Our analysis considered the time-to-
156 first event, with a follow-up duration of 5 years. Further details concerning the outcome
157 definitions are provided in Supplementary Method S3.

158

159 **2.3. Statistical analyses**

160 We used large-scale propensity score (PS) modelling [19], which included >3,000

161 baseline patient characteristics between the study and comparison cohorts, including all
162 available demographic characteristics as well as medical, medication, and procedure history
163 in each database. The study populations were then matched using one-to-one greedy
164 matching of the PS. After PS matching, a standardised difference of <0.25 for every covariate
165 was considered negligible [20]. Cox proportional hazard models were used to estimate the
166 association between exposures and outcomes. We then performed a meta-analysis to calculate
167 the summary hazard ratio (HR) estimates across the databases. Before performing the meta-
168 analysis, the I^2 statistic was used to measure the heterogeneity among the included studies. If
169 the I^2 value was $>50\%$, a random-effects meta-analysis was performed. If the I^2 value was
170 $<50\%$, a fixed effects meta-analysis was conducted [21]. A pre-specified two-sided P value of
171 <0.05 was considered statistically significant. We followed the Strengthening the Reporting
172 of Observational Studies in Epidemiology (STROBE) reporting guidelines.

173

174 **2.4. Sensitivity analyses**

175 Multiple sensitivity analyses were conducted using different definitions of the study
176 population, at-risk time windows, and follow-up duration. We also performed a sensitivity
177 analysis after stratifying the patients according to age (45–54 and 55–64 years) to check if
178 any differences emerged [12]. Additionally, to examine the effects of HRT in patients
179 diagnosed with symptomatic menopausal transition, we compared patients with symptomatic
180 menopausal transition treated with and without HRT. HRT regimens included oestrogen alone
181 as well as oestrogen plus progesterone. Drug exposure was defined as at least 180 days of use
182 in the 3 years after the index date. Furthermore, an additional time-at-risk window (intention-

183 to-treat basis) was applied. The intention-to-treat period was defined as the period from 1 day
184 after the index date until the end of observation. Moreover, to investigate potential
185 surveillance bias, subgroups were stratified according to the follow-up duration (0–1, 1–5,
186 and ≥ 5 year) since symptomatic menopausal transition diagnosis.

187

188 **3. Results**

189 **3.1. Cohort characteristics**

190 A total of 13,575 patients with symptomatic menopausal transition and 382,178
191 without symptomatic menopausal transition were included across the five data sources. The
192 aggregated patient cohort size, follow-up duration, incidence of psychiatric disorders, and
193 minimum detectable relative risk before and after PS matching in the five databases are
194 shown in Supplementary Table S1

195 The baseline characteristics of the overall study population before and after PS
196 matching are shown in Table 1 and Table S2. The baseline characteristics before and after PS
197 matching for each database are presented in Supplementary Tables S3–7. After PS matching,
198 the absolute standardised differences for all baseline characteristics between patients with and
199 without symptomatic menopausal transition were <0.25 within each data source (7,883 pairs
200 in AJH, 6,480 pairs in KDH, 6,095 pairs in MJH, 4,665 pairs in KWMC, and 3,848 pairs in
201 PNUH) (see Supplementary Figure S1).

202 **3.2. Outcome assessment**

203 The survival curves for the occurrence of psychiatric disorders during the 5-year
204 follow up after PS matching are shown in Figure 2. Cases where the proportional hazards

205 assumption was not met in the survival analysis were excluded from the meta-analysis.
206 Specifically, KDH was excluded for anxiety disorders and KWMC was excluded for sleep
207 disorders. The meta-analytic comparative effect estimates for the outcomes of depressive,
208 anxiety, and sleep disorder are presented in Figure 3. Symptomatic menopausal transition was
209 significantly associated with an increased risk of depression. (summary HR 2.10, 95%
210 confidence interval [CI] 1.63–2.10; $P < 0.01$ in meta-analysis). Symptomatic menopausal
211 transition was significantly associated with an increased risk of anxiety. (summary HR 1.64,
212 95% CI 1.01–2.66, $P = 0.04$). Symptomatic menopausal transition was significantly associated
213 with an increased risk of sleep disorder. (summary HR 1.47, 95% CI 1.16–1.88, $P < 0.01$).

214 **3.3. Sensitivity analyses**

215 The survival curves for the occurrence of psychiatric disorders in the intention-to-
216 treat analysis after PS matching are presented in Supplementary Figure S2. In the different
217 risk windows of the intention-to-treat analysis, Symptomatic menopausal transition was
218 significantly associated with an increased risk of depression, anxiety, and sleep disorder.
219 (summary HR 2.01, 95% CI 1.61–2.51, $P < 0.01$, summary HR 1.73, 95% CI 1.13–2.66,
220 $P = 0.01$, and summary HR 1.45, 95% CI 1.18–1.78, $P < 0.01$ in the meta-analysis, respectively)
221 (Figure 4).

222 The meta-analytic comparative effect estimates for the different target age definitions
223 during the 5-year follow-up and intention-to-treat analyses are presented in Supplementary
224 Figure S3–4. In the subgroup of patients aged 45–54 years, in both risk windows,
225 symptomatic menopausal transition was significantly associated with an increased risk of
226 depression, anxiety, and sleep disorder. (follow-up 5 years: summary HR 1.77, 95% CI 1.33–

227 2.36, $P < 0.01$ in the meta-analysis, summary HR 1.72, 95% CI 1.17–2.55, $P < 0.01$ in the meta-
228 analysis, and summary HR 1.91, 95% CI 1.37–2.66, $P < 0.01$ in the meta-analysis; intention to
229 treat: summary HR 1.62, 95% CI 1.26–2.08, $P < 0.01$ in the meta-analysis, summary HR 1.52,
230 95% CI 1.09–2.11, $P = 0.01$ in the meta-analysis, and summary HR 1.55, 95% CI 1.20–2.02,
231 $P < 0.01$ in the meta-analysis, respectively) (see Supplementary Figure S3). In the subgroup of
232 patients aged 55–64 years, in both risk windows, symptomatic menopausal transition was
233 significantly associated with an increased risk of depression. (5-year follow-up: summary HR
234 1.73, 95% CI 1.19–2.52, $P < 0.01$ in the meta-analysis; intention to treat: summary HR 1.66,
235 95% CI 1.19–2.33, $P < 0.01$ in the meta-analysis, respectively) (see Supplementary Figure S4).
236 No significance differences related to anxiety disorders and sleep disorders were observed in
237 the subgroup of patients aged 55–64 years.

238 The meta-analytic comparative effect estimates for HRT in the 5-year follow-up and
239 intention-to-treat analyses are presented in Supplementary Figure S5. At the 5-year follow-
240 up, HRT was significantly associated with an increased risk of depression and sleep disorder.
241 (summary HR 2.21, 95% CI 1.07–4.55, $P = 0.03$ in the meta-analysis; summary HR 2.51, 95%
242 CI 1.25–5.04, $P < 0.01$ in the meta-analysis, respectively). In the intention-to-treat analysis,
243 HRT was significantly associated with an increased risk of sleep disorder (summary HR 1.81,
244 95% CI 1.16–2.82, $P < 0.01$).

245 Results stratified by follow-up duration are presented in Supplementary Table S8.
246 Incidence rate ratios of depression, anxiety disorder, and sleep disorder significantly
247 increased in all the follow-up duration groups (0-1, 1-5 and ≥ 5 year).

248

249 **4. Discussion**

250 In this retrospective cohort study, we estimated the comparative effects of
251 symptomatic menopausal transition on the occurrence of depressive disorder, anxiety
252 disorder, and sleep disorder. Women diagnosed with symptomatic menopausal transition
253 demonstrated associations regarding an increased risk of depressive, anxiety, and sleep
254 disorders when compared with women who had not been diagnosed with symptomatic
255 menopausal transition. In the subgroup of patients aged 45–54 years, symptomatic
256 menopausal transition was significantly associated with an increased risk of depressive
257 disorder, anxiety disorder, and sleep disorder, whereas only the risk of depressive disorder
258 was higher association in the subgroup of patients aged 55–64 years. In the subgroup analysis
259 for estimating the effect of symptomatic menopausal transition patients with HRT, the use of
260 HRT was associated with an increased risk of sleep disorders when compared with non-use of
261 HRT. These results were consistent for the different risk windows.

262 Our findings indicating that women diagnosed with symptomatic menopausal
263 transition are associated with an increased risk of depressive disorder are consistent with
264 those of previous studies, including a nationwide cohort study in Taiwan [22]. The presence
265 of clinically significant menopausal symptoms may exacerbate depressive symptoms in
266 perimenopausal women [23]. The pattern for the risk of depression is consistent with the
267 results of our sub-population analysis. Although it has been demonstrated that most women
268 do not develop depression at menopause [24], our results show that perimenopausal
269 symptoms may be a factor in the development of depressive disorders during menopausal

270 transition. Furthermore, since menopausal transition usually lasts for approximately 3–9 years
271 [25], the increased risk of depressive disorder in the sensitivity analysis on an intent-to-treat
272 basis suggests that women who experienced a more symptomatic menopausal transition were
273 at higher risk of developing depression within the 10-year observation period, regardless of
274 whether they currently have menopausal symptoms. This also suggests that in the long-term,
275 lack of protective hormonal effects increases the risk of depression. These findings are
276 consistent with the result of the previous study in which an increased risk of significant
277 depressive symptoms was observed in postmenopausal women [26]. Additionally,
278 considering that sleep quality and anxiety symptoms are positively correlated with
279 perimenopausal symptoms [27,28], our results regarding the increased risk of anxiety
280 disorders and sleep disorders are in line with previous literature. However, inconsistent
281 results concerning anxiety disorders and sleep disorders were observed in the sub-population
282 analysis. Associations between menopausal symptoms and anxiety/sleep disorders have been
283 less consistent in other studies [28,29]. In particular, anxiety disorders showed heterogeneity
284 of results even in the total population. Unlike depression and sleep disorders, which have a
285 small number of codes, anxiety disorders have multiple codes with different characteristics,
286 such as panic disorder, mixed depressive anxiety disorder, generalized anxiety disorder, and
287 anxiety disorders caused by drugs or general medical conditions. Due to the variety of
288 anxiety disorder codes, the composition of anxiety disorders may differ between hospitals,
289 which may be related to the heterogeneity of anxiety disorders. It has been reported that there
290 were differences according to institutions for psychiatric patients in South Korea.[30]
291 Overall, the relationship between perimenopausal symptoms and anxiety or sleep disorders

292 may not be as robust as that between perimenopausal symptoms and depression.

293 In our study, both subgroups by age showed association of an increased risk of
294 depression; however, for anxiety and sleep disorders, only the subgroup of patients aged 45–
295 54 years demonstrated an increased risk. These findings are consistent with the results of
296 epidemiological studies demonstrating that anxiety disorders are more prevalent at younger
297 ages than in the older population [31]. Regarding sleep disorders, their prevalence generally
298 increases with increasing age [32]. However, the prevalence of sleep disorders has been
299 shown to decrease from perimenopause to postmenopause [33]. These results indicate that
300 there is a ‘window of opportunity’ when hormonal imbalance and other perimenopausal
301 changes increase the risk of anxiety and sleep disorders, while for depressive disorders it
302 appears that the chronic changes conferred by menopause may act as a sustained risk
303 throughout postmenopausal years.

304 For HRT, the 5-year follow-up results revealed a higher risk of depression in the HRT
305 group, while a higher risk of sleep disorders was found in both observation periods. Similar
306 to our findings, Wium-Andersen et al showed that use of HRT during menopause was
307 associated with risk of depression diagnosis [34]. Consistent with our findings of a higher
308 risk of depression in the first 5 years of HRT, the risk was higher in the first 5 years than in
309 subsequent years. The biological mechanisms linking HRT and depression have suggested
310 that oestradiol has a negative effect on depression and anxiety in the later stages of
311 menopause [35]. Contrary to our findings, Kulkarni J et al showed the antidepressant efficacy
312 of tibolone for depressive disorders in women through the menopause transition.[36] Also, in
313 previous double-blind RCT, depression rating scale scores were significantly lower in the

314 estrogen treatment group compared with controls.[37] However, both the Kulkarni and RCT
315 studies had a short observation period of less than 3 months, so the results may be different
316 from a long-term impact evaluation such as our findings. In addition, given that studies have
317 shown that the addition of progesterone can reduce the psychological effects of estrogen
318 treatment,[38] it is possible that our study design, which included both combination and
319 single agent treatments, had the opposite effect of estrogen. Since anxiety and depression
320 played a mediating role in the relationship between menopausal symptoms and quality of
321 sleep [27], HRT may have affected sleep through mood symptoms. Another study showed
322 that HRT users in general reported more daytime sleepiness and were more likely to use sleep
323 medications, suggesting an overall poorer quality of sleep [39]. Previous studies have
324 demonstrated that symptom severity during menopausal transition are the main contributors
325 to a poor sleep quality [40]. Association between HRT use and sleep disorder may be because
326 patients receiving HRT had more menopausal symptoms than those without HRT. Our
327 findings on HRT need to be confirmed by studies considering drug composition and symptom
328 severity. Although there is a possibility of bias, our findings do not support previously
329 suggested effects of HRT on depression, anxiety, and sleep disorders [24].

330 The results of stratification by duration of follow-up indicated that the incidence of
331 depressive disorder, anxiety disorder, and sleep disorder was increased in the first year after
332 the diagnosis of symptomatic menopausal transition. These findings have the potential for
333 surveillance bias. However, the incidence of depressive disorder, anxiety disorder, and sleep
334 disorder remained significantly elevated after the first year of follow-up, suggesting that the
335 observed effects were not solely due to surveillance bias.

336 In our study, we used a retrospective observational cohort study based on EHR data.
337 Although the randomised controlled trial (RCT) is the gold standard, the advantages of the
338 cohort study, such as larger samples and longer follow-up, may provide an alternative to the
339 RCT. Since confounding is a limitation of the cohort study, we applied extensive propensity
340 score adjustment including 1:1 propensity score matching to reduce the effects of
341 confounding.

342 **4.1. Limitations**

343 This study had several limitations. First, we could not include psychosocial factors such as
344 stressful life events, attitudes toward menopause, and personality. However, to reduce the
345 effect of a lack of detailed information, we used large-scale PS methods, which were able to
346 balance the unmeasured characteristics [41]. Second, symptomatic menopausal transition
347 may include psychiatric symptoms such as sleep disturbance. Psychiatric or sleep-related
348 menopausal symptoms can also be early signs of psychiatric diseases. However, previous
349 studies have mentioned that most patients are diagnosed with symptomatic menopausal
350 transition based on somatic symptoms, including hot flushes, cold or night sweats, sexual
351 discomfort, vaginal dryness, headaches, and joint pains [22]. Previous papers on the
352 association between menopausal transition and psychiatric disorders have included sleep
353 disorders as an outcome.[42] Third, HRT use was not considered in the primary analysis
354 comparing women with and without symptomatic menopausal transition. However, only
355 7.7% of women diagnosed with symptomatic menopausal transition received more than 6
356 months of HRT. Due to the low number of patients treated, patients regardless HRT were
357 used in the primary analysis. Instead, as a sensitivity analysis, we compared differences by

358 HRT status among patients diagnosed with symptomatic menopausal transition. Also, we
359 assumed that only women diagnosed with symptomatic menopausal transition were exposed
360 to HRT and compared the effects of HRT only among women diagnosed with symptomatic
361 menopausal transition. As we assumed, 98.7% of the women who were not diagnosed with
362 symptomatic menopausal transition in our study had never been exposed to HRT during their
363 lifetime. Fourth, in the meta-analysis, the results of Ajou university hospital contributes all
364 effect sizes for the outcome of anxiety disorders. Especially when the number of included
365 studies is small (≤ 5 studies), the results of a meta-analysis should be interpreted with
366 caution.[43] Regarding this, the results should be interpreted with caution, and further
367 analysis using advanced statistical methods may be necessary in the future. Fifth, this study
368 used data from Koreans only; thus, the results cannot be generalized. Sixth, because this was
369 a retrospective cohort study, our findings are only associations and causality cannot be
370 assumed. Seventh, since this was a code-based analysis, data on specific symptoms were not
371 available from the cohorts. For this reason, we were unable to identify if specific symptom
372 types were associated with a greater risk of psychiatric disorders. Further symptom-specific
373 analyses are needed in the future for clinical implications of the relationship between
374 menopausal symptoms and psychiatric disorders. Eighth, it is possible that asymptomatic
375 menopausal women have symptoms but simply choose not to engage in health care.
376 Specifically, there may be instances where patients did not visit their obstetrics and
377 gynecology despite a physician's request for a consultation. Our results should be interpreted
378 considering the differences in help-seeking between the asymptomatic and symptomatic
379 groups.

380

381 **4.2. Conclusion**

382 In conclusion, our findings suggest an increased risk of depression, anxiety, and sleep
383 disorders in women diagnosed with symptomatic menopausal transition. Our study results did
384 not support the therapeutic effects of HRT on depression, anxiety, and sleep disorders.

385 Therefore, more attention should be paid to women with a symptomatic menopausal
386 transition. Additionally, options other than HRT may need to be considered for the treatment
387 of mood symptoms during perimenopause. Considering the number of unmeasured
388 confounders, further investigations are necessary to clarify the association between
389 symptomatic menopausal transition and psychiatric disorders.

390

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405 **Supplementary material:** For supplementary material accompanying this paper, visit
406 [cambridge.org/EPA](https://www.cambridge.org/EPA).

407 **CRedit authorship contribution statement**

408 Dong Yun Lee: Conceptualisation, Methodology, Investigation, Writing — original draft,
409 Formal analysis.

410 Carmen Andreescu: Writing — review and editing, Methodology

411 Howard Aizenstein: Writing — review and editing

412 Helmet Karim: Writing — review and editing, Methodology

413 Akiko Mizuno: Writing — review and editing

414 Antonija Kolobaric: Writing — review and editing

415 Seokyoung Yoon: Methodology, Supervision

416 Yerim Kim: Methodology, Writing — review and editing

417 Jaegyun Lim: Resources

418 Ein Jeong Hwang: Resources

419 Yung-Taek Ouh: Resources

420 Hyung Hoi Kim: Resources

421 Sang Joon Son: Writing — review and editing, Methodology, Funding acquisition,
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423 Rae Woong Park: Writing — review and editing, Methodology, Funding acquisition,

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425 All authors have approved the final article.

426

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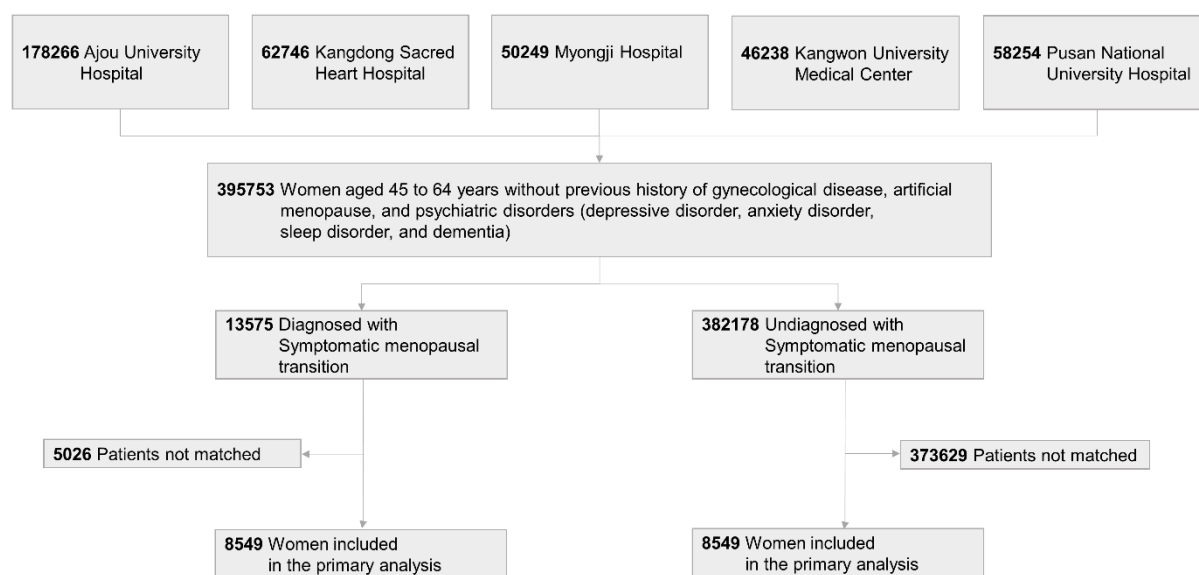
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560 **Figure Legends**

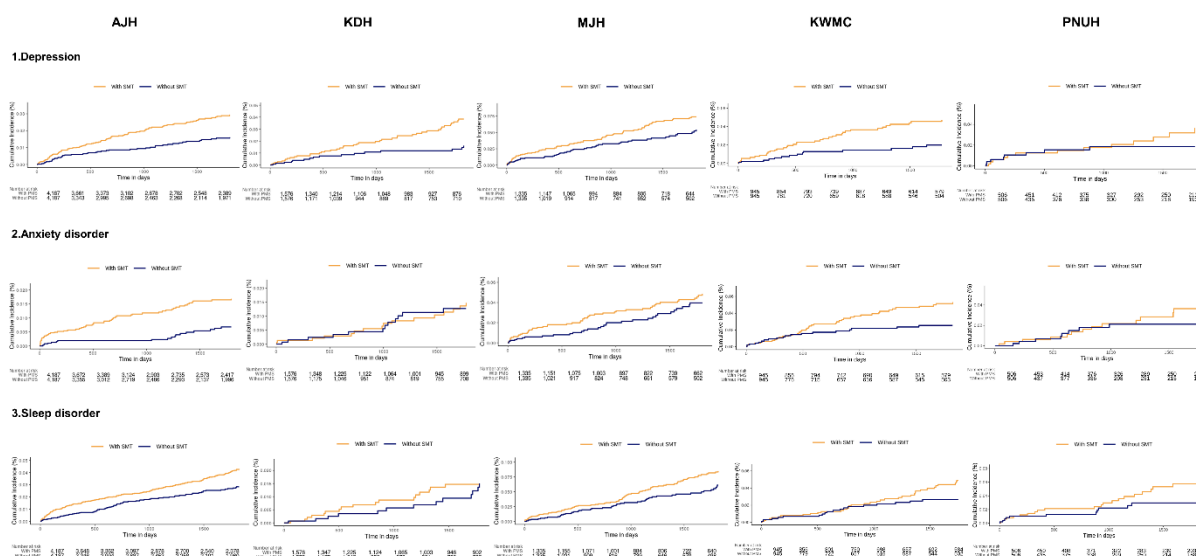
561 **Figure 1.** Study flowchart of women aged 45 to 64 years with or without symptomatic
562 menopausal transition



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565 **Figure 2.** Kaplan–Meier plots for the risk of depression, anxiety, and sleep disorder
 566 associated with symptomatic menopausal transition



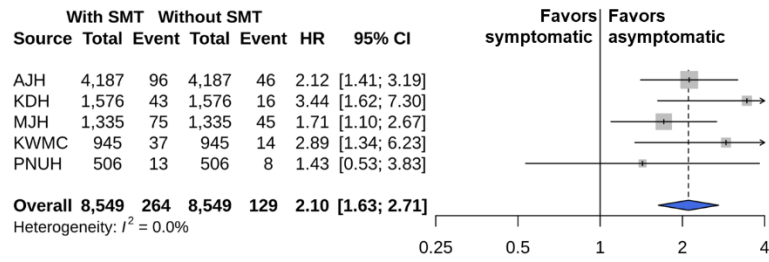
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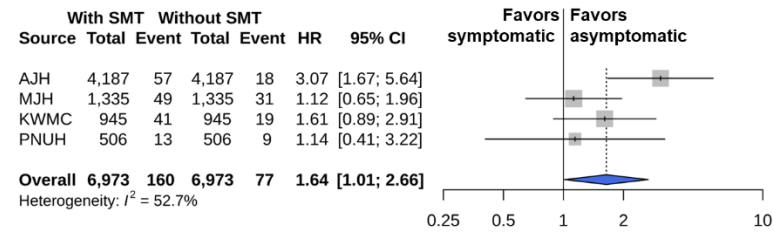
569 **Figure 3.** Risk of depression, anxiety, and sleep disorder at the 5-year follow-up

Follow up 5 years

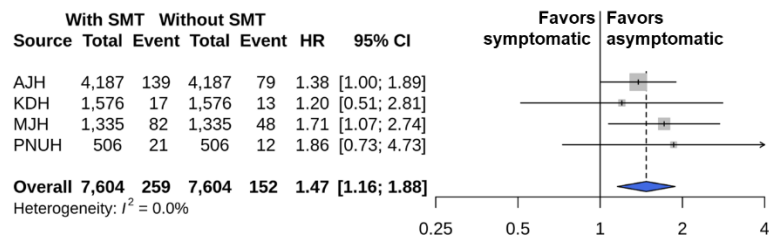
1. Depression



2. Anxiety



3. Sleep disorder



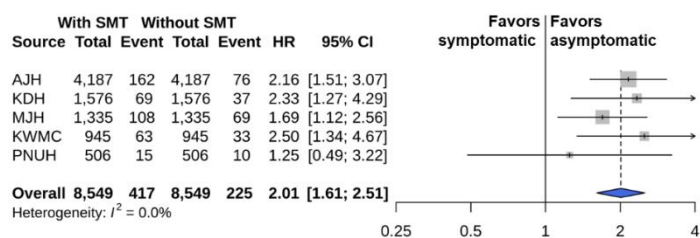
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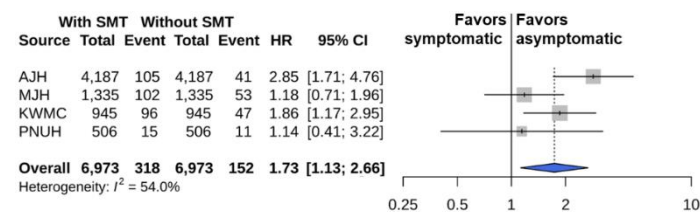
572 **Figure 4.** Risk of depression, anxiety, and sleep disorder in intention-to-treat analysis

Intention to treat

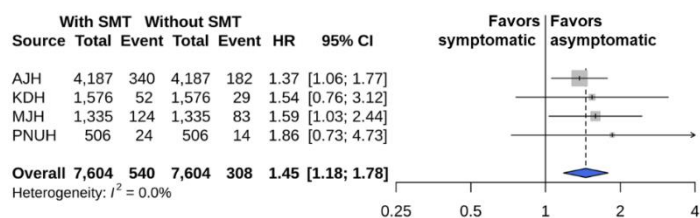
1. Depression



2. Anxiety



3. Sleep disorder



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