

Forecasting prognostic trajectories with mismatch negativity in early psychosis

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Abstract

Background. Prognostic heterogeneity in early psychosis patients yields significant difficulties in determining the degree and duration of early intervention; this heterogeneity highlights the need for prognostic biomarkers. Although mismatch negativity (MMN) has been widely studied across early phases of psychotic disorders, its potential as a common prognostic biomarker in early periods, such as clinical high risk (CHR) for psychosis and first-episode psychosis (FEP), has not been fully studied.

Methods. A total of 104 FEP patients, 102 CHR individuals, and 107 healthy controls (HCs) participated in baseline MMN recording. Clinical outcomes were assessed; 17 FEP patients were treatment resistant, 73 FEP patients were nonremitters, 56 CHR individuals were nonremitters (15 transitioned to a psychotic disorder), and 22 CHR subjects were remitters. Baseline MMN amplitudes were compared across clinical outcome groups and tested for utility prognostic biomarkers using binary logistic regression.

Results. MMN amplitudes were greatest in HCs, intermediate in CHR subjects, and smallest in FEP patients. In the clinical outcome groups, MMN amplitudes were reduced from the baseline in both FEP and CHR patients with poor prognostic trajectories. Reduced baseline MMN amplitudes were a significant predictor of later treatment resistance in FEP patients [$\text{Exp}(\beta) = 2.100$, 95% confidence interval (CI) 1.104–3.993, $p = 0.024$] and nonremission in CHR individuals [$\text{Exp}(\beta) = 1.898$, 95% CI 1.065–3.374, $p = 0.030$].

Conclusions. These findings suggest that MMN could be used as a common prognostic biomarker across early psychosis periods, which will aid clinical decisions for early intervention.

Introduction

Early stages of psychotic disorder have been regarded as critical periods for early intervention to improve the clinical outcome of the disorder (Correll et al., 2018; Fusar-Poli, McGorry, & Kane, 2017; Lieberman et al., 2001). It has been well studied that a shorter duration of untreated psychosis (DUP) is related to a better prognosis of first-episode psychosis (FEP) patients (Marshall et al., 2005; Perkins, Gu, Boteva, & Lieberman, 2005). In addition, the concept of clinical high risk (CHR) for psychosis was established not only for early detection of FEP to shorten the DUP but also for delaying or preventing the onset of psychotic disorder (Miller et al., 2002; Yung et al., 2005). However, those patients in the early stages of psychotic disorder were proven to be heterogeneous in their prognostic trajectories. While approximately 40% of FEP patients show favorable outcomes, such as full remission or a partial response, the remaining patients display chronic, relapsing disease courses and are even treatment resistant (Birchwood, Todd, & Jackson, 1998; Lieberman, 1993). Similarly, three prognostic trajectories of positive, moderately impaired, and severely impaired outcomes were found among CHR individuals through group-based multitrajectory modeling (Allswede et al., 2020). Meta-analytic studies reported that 22% of CHR subjects transitioned to a psychotic disorder within 3 years and 65% of CHR individuals were nonremitters within 1.94 years (Fusar-Poli et al., 2013, 2020; Simon et al., 2013), suggesting that improving the general clinical outcome is as important as preventing the onset of psychotic disorder (Carrion et al., 2013; Lin et al., 2015; Schlosser et al., 2012).

Prognostic heterogeneity produces significant difficulties in clinical decision making, such as decisions concerning the early use of clozapine in FEP patients who are resistant to usual antipsychotic treatment. Intervention for CHR individuals also involves challenges, such as deciding who should receive rigorous or less intensive interventions, including the justification of the use of antipsychotic medication. By using biological predictors that will aid in forecasting prognostic trajectories of early psychosis patients, patients' suffering during trial and error

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regarding treatment will be resolved, and a significant amount of time and resources will be saved. Previous studies reported that cortical gyrification (Palaniyappan et al., 2013), bilateral hippocampal increase (Lappin et al., 2014), corticostriatal functional connectivity (Oh, Kim, Kim, Lee, & Kwon, 2020; Sarpal et al., 2016), glutathione and glutamate levels (Dempster et al., 2020), and electrophysiological markers (Lho, Kim, Lee, Kwak, & Kwon, 2019; Mi et al., 2021; Renaldi et al., 2019) were associated with the treatment response of FEP patients. In CHR subjects, structural brain imaging (Cannon et al., 2015; de Wit et al., 2017; Ho et al., 2017; Koutsouleris et al., 2015; Koutsouleris, Uptegrove, & Wood, 2019; Reniers et al., 2017), neurochemical markers (Allen et al., 2015; Bossong et al., 2019; Egerton et al., 2014), and event-related potential (ERP) markers (Bodatsch et al., 2011; Hamilton et al., 2019; Kim, Lee, Lee, Kim, & Kwon, 2015; Kim, Lee, Yoon, Lee, & Kwon, 2018; Perez et al., 2014) were suggested as biological predictors of symptomatic and functional outcomes. However, clinically efficient biomarkers that forecast prognostic trajectories across the course of psychotic disorders, from CHR to FEP, have not yet been studied.

Mismatch negativity (MMN) is an ERP component that is elicited when repetitive standard stimuli are interrupted by infrequent deviant stimuli and is thus thought to be reflective of the automatic auditory change detection process (Näätänen & Escera, 2000). Because MMN generation is associated with neurotransmission at the N-methyl-D-aspartate (NMDA) receptor, MMN has been widely studied across the course of psychotic disorders to elucidate the pathophysiological mechanism of schizophrenia (Javitt & Freedman, 2015; Javitt, Steinschneider, Schroeder, & Arezzo, 1996; Uno & Coyle, 2019). Reduced duration deviant MMN (dMMN) amplitude has been consistently reported in schizophrenia and early psychosis patients, including FEP patients and CHR individuals, although the degree of dMMN impairment is less significant than in chronic schizophrenia patients (Erickson, Ruffle, & Gold, 2016; Haigh, Coffman, & Salisbury, 2017; Hamilton, Boos, & Mathalon, 2020; Kim, Cho, Yoon, Lee, & Kwon, 2017; Nagai et al., 2013; Tateno et al., 2021). Although little is known about dMMN as a prognostic predictor of FEP patients (Higgins, Lewandowski, Liukasemsarn, & Hall, 2021; Lho et al., 2020), previous studies, including our own, showed that dMMN was predictive of a transition to psychotic disorder, remission, and symptomatic and functional improvement in CHR individuals (Bodatsch et al., 2011; Fujioka et al., 2020; Kim et al., 2018; Perez et al., 2014). Therefore, dMMN has the potential to be a clinically efficient biomarker that forecasts prognostic trajectories across the course of psychotic disorder, which would aid in clinical decision making regarding interventions for patients with FEP and subjects at CHR for psychosis.

In the current study, we aimed to investigate whether dMMN amplitude could be a potential biomarker to predict poor prognostic outcomes in FEP and CHR individuals. We hypothesized that (1) dMMN is impaired in FEP and CHR participants compared to healthy controls (HCs); thus, dMMN may be a potential biomarker for prognosis prediction in early psychosis patients; (2) baseline dMMN is smaller in FEP patients who are treatment resistant than in patients who are not treatment resistant and is predictive of later treatment resistance; and (3) dMMN at baseline is reduced in CHR individuals who are not remitted or who transition to a psychotic disorder compared to individuals who are remitted or who have not transitioned after a minimum of 1 year from the baseline dMMN assessment, and dMMN is

predictive of future nonremission from CHR status or transition to a psychotic disorder.

Methods

Participants

A total of 104 FEP patients, 102 individuals at CHR for psychosis, and 107 HCs participated in the baseline assessment, including dMMN recording, between August 2009 and June 2020. Among them, 25 FEP patients, 48 CHR subjects, and 47 HCs participated in our previous dMMN studies (Kim et al., 2017, 2018; Lho et al., 2019). FEP patients and CHR individuals were recruited from the Seoul Youth Clinic (SYC; www.youthclinic.org), a center for early detection and intervention of psychosis (Kwon, Byun, Lee, & An, 2012) and from an inpatient and outpatient clinic of the Department of Neuropsychiatry at the Seoul National University Hospital (SNUH). The definition of FEP was an individual aged 16–40 years who satisfied the diagnosis of schizophreniform disorder, schizophrenia or schizoaffective disorder when assessed using the Structured Clinical Interview for the Diagnostic and Statistical Manual of Mental Disorders, Fourth Edition, Axis I Disorders (SCID-I) and a duration of psychotic illness less than 2 years. Psychotic symptoms were assessed using the Positive and Negative Syndrome Scale (PANSS). To confirm the CHR status of the participants, the Structured Interview for Prodromal Symptoms (SIPS) (Miller et al., 2002) was used. Prodromal symptoms were assessed using the validated Korean version of the Scale of Prodromal Symptoms (SOPS) (Jung et al., 2010; Miller et al., 2003). In both the FEP and CHR groups, general functional status was defined using the modified Global Assessment of Functioning (mGAF) (Hall, 1995). HCs were recruited via internet advertisement and were screened using the SCID-I Nonpatient Edition (SCID-NP). Potential HC participants were excluded if they had any first- to third-degree biological relatives with a psychotic disorder. Common exclusion criteria included substance abuse or dependence (except nicotine), neurological disease or significant head trauma, medical illness that could be accompanied by psychiatric symptoms, sensory impairments, and intellectual disability [intelligence quotient (IQ) < 70].

Among the 104 FEP patients, 90 patients with FEP received usual treatment, including antipsychotic medication, for at least 18 months until June 2020. Treatment resistance was defined when a patient showed at least moderately severe psychotic symptoms despite taking a sufficient dose (≥ 20 mg olanzapine equivalent dose per day) of more than two antipsychotics for at least 12 months or taking clozapine according to the minimum requirement criteria of the Treatment Response and Resistance in Psychosis (TRRIP) working group consensus guidelines (Conley & Buchanan, 1997; Gardner, Murphy, O'Donnell, Centorrino, & Baldessarini, 2010; Howes et al., 2017). Certified psychiatrists who were blinded to the dMMN amplitudes thoroughly reviewed medical records to assess the symptom severity, medication status, and treatment adherence information provided by patients themselves and their caregivers at each visit to clinic. As a result, FEP patients were divided into treatment-resistant (FEP-TR, $n = 17$) and nonresistant (FEP-nonTR, $n = 73$) groups. The means and standard deviations of follow-up duration were 39.4 ± 32.7 months in the FEP-TR group and 46.1 ± 34.2 months in the FEP-nonTR group. Among the 102 CHR subjects, 78 CHR individuals participated in annual follow-up clinical assessment at

least once until June 2020. A remitter was defined as a CHR individual who scored <3 on the SOPS positive symptoms subscale and $65 \geq$ on the mGAF measured at the last clinical assessment to reflect both symptomatic and functional recovery (Bossong et al., 2019; Fujioka et al., 2020; Hamilton et al., 2019; Kim et al., 2018). According to the remission criteria, certified psychiatrists who were blinded to dMMN amplitude determined 22 CHR remitters and 56 nonremitters, including 15 subjects who ended the follow-up assessment with a transition to a psychotic disorder (12 schizophrenia and three schizoaffective disorder) according to SIPS criteria. The means and standard deviations of follow-up duration were 46.0 ± 36.5 months for CHR remitters and 30.1 ± 27.9 months for CHR nonremitters. Sixty-three CHR individuals did not transition to psychotic disorder (online Fig. S1 in the Supplementary Material).

Written informed consent was obtained from all participants after they were given a thorough explanation of the study procedure (IRB no. H-1110-009-380). For minors, informed consent was obtained from both the participants themselves and their parents. This study was conducted in accordance with the Declaration of Helsinki and was approved by the Institutional Review Board of SNUH (IRB no. H-2008-195-1154).

MMN acquisition

Continuous electroencephalographic (EEG) recording was conducted using a Neuroscan 128 Channel SynAmps system equipped with a 128-channel Quick-Cap based on the modified 10–20 international system (Compumedics, Charlotte, NC, USA) while participants were performing a passive auditory oddball task. The EEG data were digitized at a 1000 Hz sampling rate, and an online bandpass filter between 0.05 and 100 Hz was used. The reference electrodes were placed on both mastoids. The vertical and horizontal electrooculograms were recorded using electrodes below and on the outer canthus of the left eye to monitor eye movement artifacts. The resistance of all electrode sites was less than $5 \text{ k}\Omega$. During the passive auditory oddball task performance, participants were instructed to ignore the auditory sound and concentrate on a ‘Where’s Waldo?’ picture book. A pseudorandom series of 1000 Hz (80 dB, 10 ms rise/fall) auditory stimuli were binaurally presented using a STIM2 sound generator (Compumedics). With an intertrial interval of 600 ms, the duration of deviant stimuli was 100 ms (18.2%, 218/1200), and the duration of standard stimuli was 50 ms (81.8%, 982/1200).

Data preprocessing

Curry version 7 software (Compumedics) was used to preprocess the ERP data. After replacing bad channels using the linear interpolation of the adjacent channels (up to 7%), eye movement artifact reduction was performed according to the validated ocular artifact reduction algorithm (Semlitsch, Anderer, Schuster, & Presslich, 1986). EEG recordings were rereferenced to common average reference data, and a 0.1–30 Hz bandpass filter was applied. Continuous EEG data were epoched to a 100 ms prestimulus interval and a 300 ms poststimulus interval, and the averaged prestimulus interval voltage was used in baseline correction. Automatic artifact rejection was performed by removing the epochs containing EEG amplitudes that exceeded $\pm 75 \mu\text{V}$. The means and standard deviations of the numbers of remaining epochs for deviant stimuli were not significantly different across all groups (Table 1). dMMN was calculated by subtracting the

ERPs elicited by the standard stimuli from those elicited by deviant stimuli. The most negative deflection between 130 and 250 ms poststimulus onset at the FCz electrode site, where dMMN had the maximal amplitude (Garrido, Kilner, Stephan, & Friston, 2009), was detected as the peak dMMN amplitudes and latencies.

Statistical analysis

The demographic, clinical, and dMMN characteristics were compared using analysis of variance (ANOVA) or independent *t* test across the groups for continuous variables. A Bonferroni test was used for *post hoc* analysis. Welch’s *t* test was performed if the variances were not equal, and Mann–Whitney *U* tests were used if the normality assumption was not satisfied. Chi-square tests were used for categorical variables. Group comparisons of MMN amplitudes and latencies across the FEP patients, CHR subjects, and HCs were performed using univariate analysis of covariance (ANCOVA) with age as a covariate. A *post hoc* simple contrast test was used to reveal specific group differences. Binary logistic regression analyses with the backward selection method were used to investigate whether baseline dMMN amplitudes were predictive of treatment resistance in FEP patients and predictive of nonremission or transition to psychotic disorder in CHR individuals. Common independent variables were the dMMN amplitude at FCz electrode site, sex, handedness, age, IQ, and education years in both FEP and CHR groups. Variables with significant group differences at baseline were selected as additional independent variables, which included the duration of illness (DOI) for FEP treatment resistance prediction and the SOPS positive subscale score at baseline for CHR transition prediction. Statistical analyses were performed using SPSS v.25.0 (IBM, Armonk, NY), and statistical significance was set at $p < 0.05$.

Results

Participant characteristics

Table 1 summarizes the demographic and clinical characteristics of the participants at baseline. Detailed information including follow-up characteristics of the clinical outcome groups is presented in online Supplementary Table S1 (FEP-TR *v.* FEP-nonTR) and online Supplementary Table S2 (CHR remitters *v.* CHR nonremitters and transitioned CHR *v.* nontransitioned CHR) in the Supplementary Material. There were more females than males in the FEP group than in the CHR and HC groups ($\chi^2 = 29.984, p < 0.001$). Individuals at CHR for psychosis were significantly younger and less educated than FEP patients (age, $p < 0.001$; education years, $p < 0.001$) and HCs (age, $p < 0.001$; education years, $p < 0.001$). IQ was highest in HCs (HC *v.* FEP, $p < 0.001$; HC *v.* CHR, $p < 0.001$) and lowest in FEP patients (FEP *v.* CHR, $p = 0.014$). In the clinical outcome group comparison, FEP-TR patients had a longer DOI than FEP-nonTR patients ($Z = -2.377, p = 0.017$), and transitioned CHR subjects had higher scores on the SOPS positive symptoms subscale ($Z = -2.018, p = 0.044$) than nontransitioned CHR individuals at baseline. Other baseline demographic and clinical characteristics, as well as follow-up duration, were not significantly different across the clinical outcome groups. Online Tables S3 and S4 in the Supplementary Material show no significant difference in baseline participant characteristics between the FEP patients who were assessed as treatment resistant and those who were not, as well

Table 1. Demographic, clinical, and duration deviant mismatch negativity (dMMN) characteristics of the participants at baseline

Characteristics	Group, no (%)			Statistical analysis1		FEP clinical outcome group, no (%)		Statistical analysis2		CHR clinical outcome group, no (%)		Statistical analysis3	
	FEP (n = 104)	CHR (n = 102)	HC (n = 107)	F or T or χ^2	p	FEP-TR (n = 17)	FEP-nonTR (n = 73)	χ^2 or Z	p	CHR remitters (n = 22)	CHR nonremitters (n = 56)	χ^2 or T	p
Sex (male/female)	41/63	75/27	74/33	29.984	<0.001**	8/9	29/44	0.306	0.580	16/6	40/16	0.013	0.909
Handedness (right/left)	97/7	97/5	101/6	0.324	0.850	15/2	69/4	0.875	0.349	22/0	52/4	1.656	0.198
Age (years)	23.4 ± 4.8	20.3 ± 3.7	22.8 ± 4.3	15.988	<0.001**	23.2 ± 4.5	23.6 ± 5.2	-0.201	0.840	19.9 ± 3.1	20.5 ± 3.8	-0.643	0.522
IQ	100.2 ± 14.6	105.6 ± 13.2	114.6 ± 12.8	30.292	<0.001**	96.8 ± 18.3	101.6 ± 13.5	-1.516	0.129	105.8 ± 14.6	104.3 ± 12.0	0.474	0.637
Education (years)	14.0 ± 2.6	12.5 ± 1.8	13.9 ± 2.2	16.726	<0.001**	14.2 ± 3.9	13.9 ± 2.3	-0.404	0.686	12.5 ± 1.4	12.6 ± 1.8	-0.244	0.808
DOI (months)	8.2 ± 6.3	-	-	-	-	10.6 ± 5.9	6.9 ± 5.1	-2.377	0.017*	-	-	-	-
DUP (months)	4.6 ± 4.7	-	-	-	-	5.7 ± 5.4	4.0 ± 4.2	-0.745	0.457	-	-	-	-
DUPP (months)	-	17.8 ± 17.8	-	-	-	-	-	-	-	19.5 ± 22.9	17.4 ± 16.4	0.455	0.651
PANSS													
Positive symptoms	15.2 ± 5.5	-	-	-	-	16.9 ± 5.0	14.5 ± 5.4	-1.751	0.080	-	-	-	-
Negative symptoms	16.1 ± 6.1	-	-	-	-	16.5 ± 6.3	16.1 ± 5.9	-0.341	0.733	-	-	-	-
General symptoms	31.8 ± 9.1	-	-	-	-	29.9 ± 9.2	31.7 ± 8.5	-0.671	0.502	-	-	-	-
SOPS													
Positive symptoms	-	9.8 ± 3.6	-	-	-	-	-	-	-	9.3 ± 3.6	9.8 ± 3.8	-0.476	0.636
Negative symptoms	-	13.8 ± 6.7	-	-	-	-	-	-	-	13.3 ± 7.1	14.3 ± 6.5	-0.612	0.542
Disorganization	-	4.3 ± 2.9	-	-	-	-	-	-	-	4.3 ± 2.6	4.6 ± 3.1	-0.390	0.698
General symptoms	-	6.9 ± 3.9	-	-	-	-	-	-	-	7.0 ± 3.8	7.3 ± 4.1	-0.281	0.779
mGAF	50.8 ± 13.1	53.2 ± 9.7	-	-1.541	0.125	46.8 ± 16.0	51.7 ± 12.7	-1.181	0.237	50.3 ± 9.5	52.0 ± 9.0	-0.769	0.444
Prescribed medication ⁴													
Antipsychotics	95 (91.3)	14 (13.7)	-	124.525	<0.001**	17 (100.0)	65 (89.0)	2.045	0.153	3 (13.6)	7 (12.5)	0.018	0.893
Antidepressants	12 (9.6)	25 (24.5)	-	5.880	0.015*	3 (17.6)	8 (11.0)	0.575	0.448	4 (18.2)	17 (30.4)	1.190	0.275
Mood stabilizers	10 (9.6)	3 (2.9)	-	3.880	0.049*	2 (11.8)	7 (9.6)	1.540	0.215	1 (4.5)	1 (1.8)	0.482	0.488
Anxiolytics	61 (58.7)	26 (25.5)	-	23.214	<0.001**	11 (64.7)	41 (56.2)	0.412	0.521	5 (22.7)	17 (30.4)	0.454	0.500
dMMN peak amplitudes (μ V)													
FCz electrode site	-1.5 ± 1.1	-2.0 ± 1.0	-2.5 ± 1.3	19.915	<0.001**	-1.0 ± 1.0	-1.7 ± 1.2	-2.093	0.036*	-2.3 ± 1.2	-1.8 ± 0.8	-2.136	0.036*

dMMN peak latencies (ms)	185.0 ± 33.6	192.1 ± 30.0	190.7 ± 29.5	1.009	0.366	178.0 ± 36.7	178.4 ± 28.7	-0.144	0.885	185.6 ± 18.8	191.5 ± 34.0	-0.771	0.443
FCz electrode site													
Number of remaining epochs for deviant stimuli	191.3 ± 27.4	192.6 ± 25.5	189.3 ± 27.4	0.395	0.674	189.4 ± 29.1	191.6 ± 27.1	-0.160	0.873	198.1 ± 18.1	190.6 ± 28.2	1.148	0.255

FEP, first-episode psychosis; CHR, clinical high risk; HC, healthy control; FEP-TR, FEP patients who were treatment resistant; FEP-nonTR, FEP patients who were not treatment resistant; IQ, intelligence quotient; DOI, duration of illness; DUP, duration of untreated psychosis; DUPP, duration of prodromal psychosis; PANSS, Positive and Negative Syndrome Scale; SOPS, Scale of Prodromal Symptoms; mGAF, modified Global Assessment of Functioning. Data are indicated as the mean ± standard deviation.

**Statistical significance at $p < 0.05$.

1) Analysis of variance, independent t test or Welch's t test if the variances were not equal; χ^2 analysis or Fisher's exact test for categorical data.

2) Mann-Whitney U test, χ^2 analysis or Fisher's exact test for categorical data.

3) Independent t test or Welch's t test if the variances were not equal; χ^2 analysis or Fisher's exact test for categorical data.

4) Number (percentage) of participants who were prescribed each medication at the time of dMMN measurement.

as between CHR subjects who participated in the follow-up assessment and those who did not.

MMN characteristics

Table 1 presents group comparison results of baseline dMMN peak amplitudes and latencies at the FCz electrode site. ANCOVA with age as a covariate revealed a significant group difference in dMMN amplitude at the FCz electrode site ($F = 19.915$, $p < 0.001$) across the FEP, CHR, and HC groups. A *post hoc* simple contrast test showed that dMMN amplitudes were greatest in HCs, intermediate in CHR subjects, and smallest in FEP patients (FEP *v.* HC, $p < 0.001$; CHR *v.* HC, $p = 0.002$; FEP *v.* CHR, $p = 0.004$; Fig. 1). There was no significant group effect of dMMN peak latency. According to the clinical outcome groups, the FEP-TR group showed smaller dMMN amplitudes than the FEP-nonTR group ($Z = -2.093$, $p = 0.036$, Cohen's $d = 0.634$; Fig. 2), and dMMN amplitudes of CHR remitters were greater than those of CHR nonremitters ($t = -2.136$, $p = 0.036$, Cohen's $d = 0.544$; Fig. 3). In addition, ANCOVA with age as a covariate showed that dMMN amplitudes were significantly different across FEP patients, CHR nonremitters, CHR remitters, and HCs ($F = 14.435$, $p < 0.001$). A *post hoc* simple contrast test revealed that dMMN amplitudes were similarly impaired in FEP patients and CHR nonremitters compared to CHR remitters and HCs (FEP *v.* CHR nonremitters, $p = 0.164$; FEP *v.* CHR remitters, $p = 0.004$; CHR remitters *v.* HC, $p = 0.441$; online Fig. S2 in the Supplementary Material). Group comparison results across the FEP-TR group, FEP-nonTR group, CHR nonremitters, CHR remitters, and HCs are provided in the online Supplementary Material (Fig. S3). No significant group difference in dMMN amplitude was found between CHR subjects who transitioned to a psychotic disorder and those who did not (online Table S5 in the Supplementary Material). Online Tables S6 and S7 in the Supplementary Material show that there was no significant difference in dMMN characteristics between FEP patients who were assessed as treatment resistant and those who were not or between CHR subjects who participated in the follow-up assessment and those who did not.

Predicting prognostic trajectories using MMN

Table 2 presents the results of binary logistic regression analysis with the backward selection method. Treatment resistance in FEP was predicted by the dMMN amplitude [$\text{Exp}(\beta) = 2.100$, 95% confidence interval (95% CI) 1.104–3.993, $p = 0.024$] and DOI [$\text{Exp}(\beta) = 1.138$, 95% CI 1.031–1.256, $p = 0.010$]. Nonremission in CHR patients was predicted by the dMMN amplitude [$\text{Exp}(\beta) = 1.895$, 95% CI 1.065–3.374, $p = 0.030$]. The binary logistic regression model for predicting the transition to a psychotic disorder in CHR subjects did not include the dMMN amplitude but only included the SOPS positive subscale score at baseline [$\text{Exp}(\beta) = 1.178$, 95% CI 1.005–1.380, $p = 0.043$].

Discussion

Diagnosis based on the symptomatic phenotype produces significant prognostic heterogeneity that interferes with the goal of early intervention in early psychosis; thus, investigation of biomarkers that are predictive of prognostic trajectories of early psychosis patients is warranted (Allswede et al., 2020; Birchwood et al., 1998; Clementz et al., 2016). In this longitudinal study, we

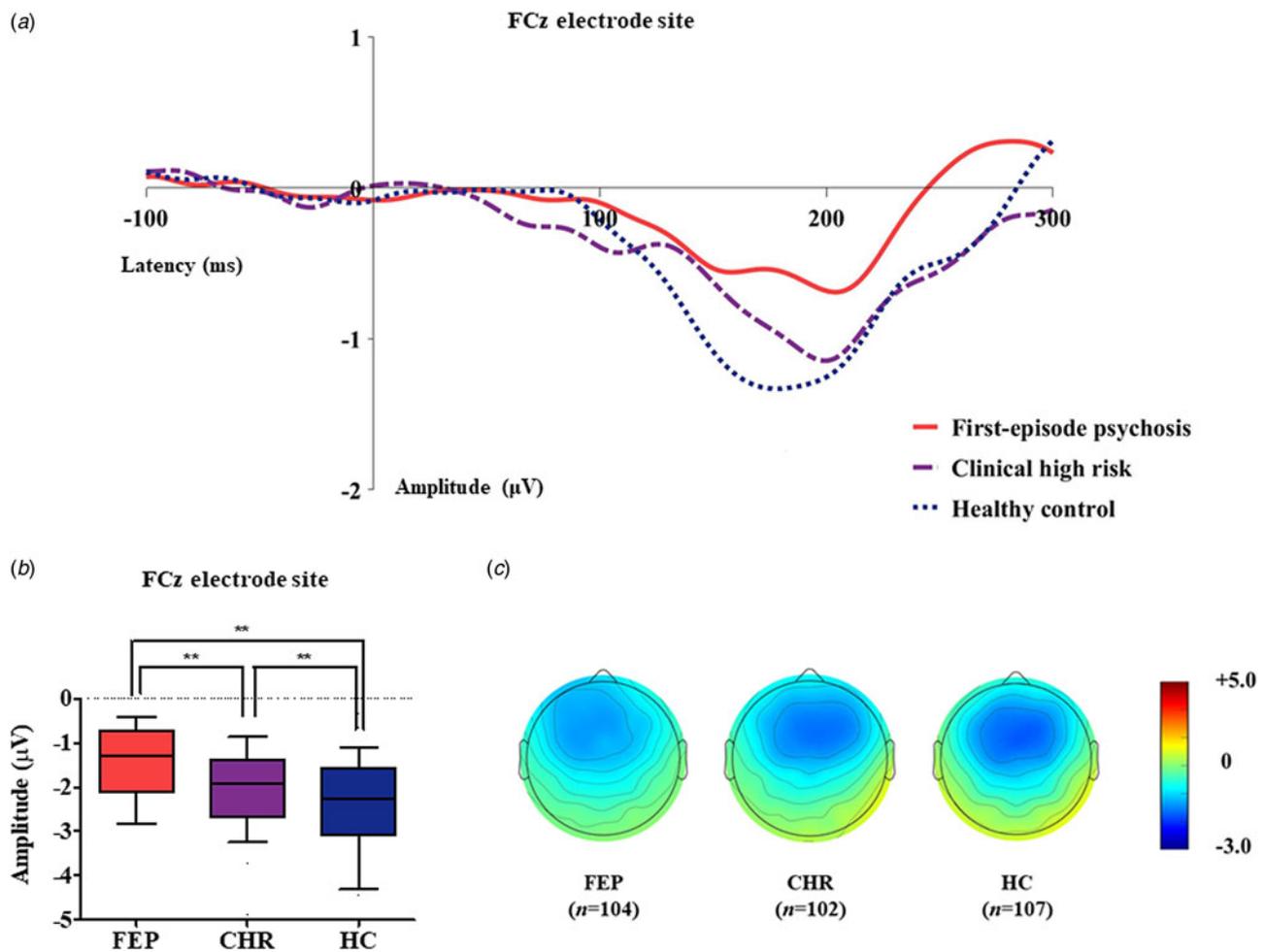


Fig. 1. (a) Grand-averaged duration deviant mismatch negativity (dMMN) waveforms across the patients with first-episode psychosis (FEP), subjects at clinical high risk (CHR) for psychosis, and healthy controls (HCs) at the FCz electrode site. (b) dMMN amplitude across the groups at the FCz electrode site. Horizontal lines in groups indicate means, and vertical lines indicate 95% confidence intervals. *Indicates statistical significance at $p < 0.05$. **Indicates statistical significance at $p < 0.005$. (c) Two-dimensional topographic maps of dMMN in FEP patients, CHR individuals, and HCs. The colored bar with numbers indicates the dMMN amplitude (μV).

aimed to confirm the usefulness of dMMN as a common prognostic biomarker across the early psychosis periods, from CHR to FEP. In line with many previous studies (Erickson et al., 2016; Higgins et al., 2021; Tateno et al., 2021), dMMN amplitudes at the FCz electrode site were impaired in both FEP and CHR patients; thus, these amplitudes were used for further analysis for prognosis prediction. From the baseline assessment, dMMN amplitude was smaller in FEP-TR patients than in FEP-nonTR patients and was predictive of later treatment resistance. In addition, the dMMN amplitude was reduced in CHR nonremitters compared to CHR remitters at baseline and was associated with nonremission from a CHR status. These findings not only support the need for biomarkers predictive of prognostic trajectories but also highlight the usefulness of dMMN as a common prognostic biomarker across the early psychosis periods.

In the current study, impaired dMMN amplitude was observed from the baseline in FEP patients with poor prognosis (i.e. FEP-TR) and was a significant predictor of later treatment resistance. Considering that MMN generation is closely related to NMDA receptor-mediated glutamatergic activity (Javitt et al., 1996; Uno & Coyle, 2019), the current study result is in line with previous studies that reported an abnormal NMDA-glutamate

system and its association with poor treatment response in FEP patients (Dempster et al., 2020; Mouchlianitis et al., 2016). The present study suggests that FEP patients with reduced dMMN amplitude may benefit from the early use of clozapine or adjuvant use of drugs targeting the NMDA-glutamate system (Rapado-Castro et al., 2017; Swerdlow et al., 2016; Zheng et al., 2018). In addition, recent studies have shown that treatment resistance to antipsychotics is evident upon illness onset in most FEP-TR patients (Demjaha et al., 2017; Lally et al., 2016), suggesting that FEP treatment resistance can be forecasted by biomarkers showing abnormalities from the early psychosis period, such as MMN.

We found that CHR nonremitters presented a reduced dMMN amplitude, which was comparable to that of FEP patients and was smaller than that of HCs, whereas CHR remitters showed a similar magnitude of dMMN amplitude as that of HCs, which was larger than that of FEP patients. This finding supports the biological heterogeneity of CHR individuals, which may be a cause of the smaller effect size of MMN impairment found in the entire CHR group compared to FEP and schizophrenia patients (Erickson et al., 2016; Kim et al., 2017). Furthermore, we replicated our previous report with extended cohort data and showed that a relatively preserved dMMN

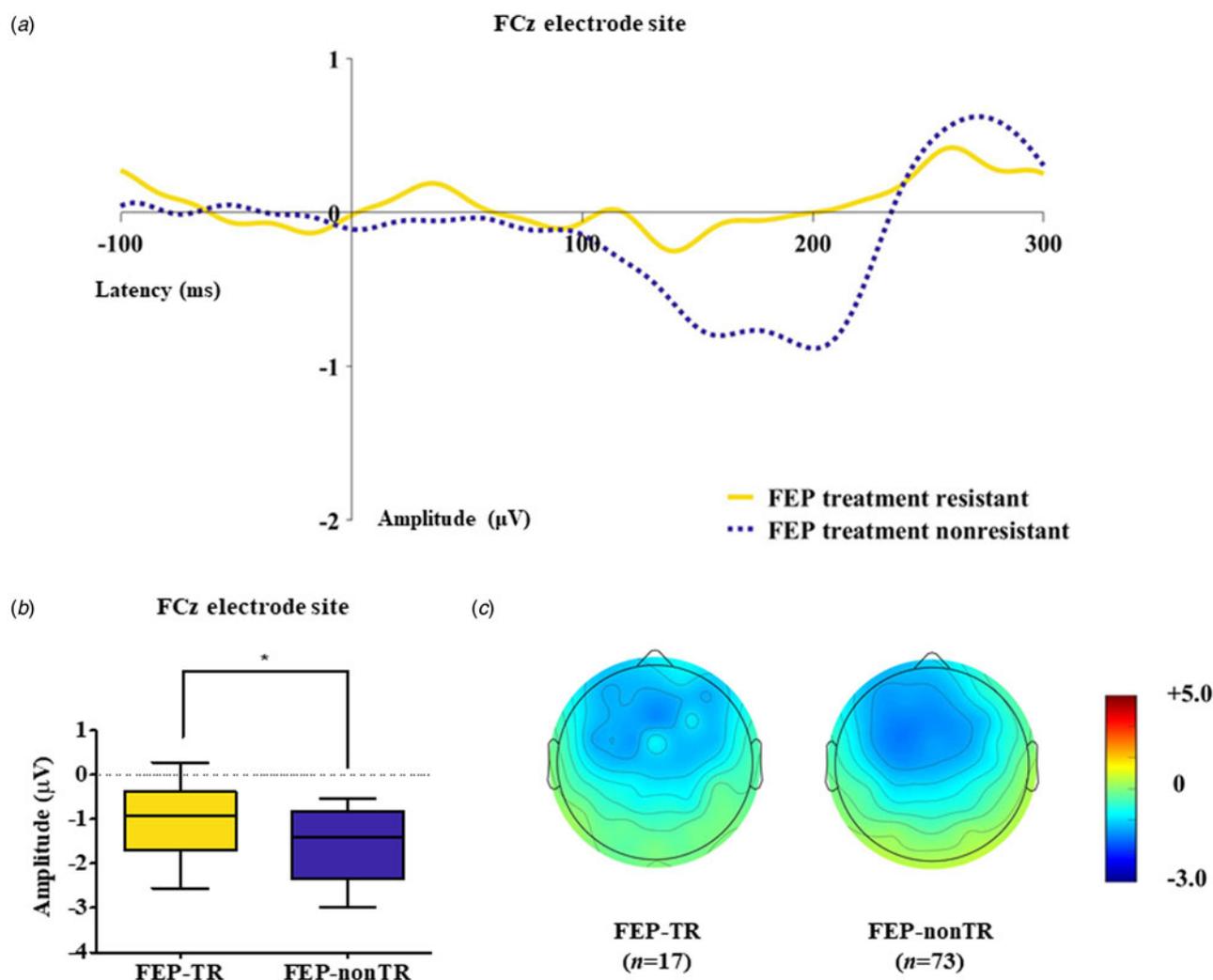


Fig. 2. (a) Grand-averaged duration deviant mismatch negativity (dMMN) waveforms across the patients with first-episode psychosis (FEP) who were treatment resistant (FEP-TR) and those who were not (FEP-nonTR) at the FCz electrode site. (b) dMMN amplitude across the clinical outcome groups at the FCz electrode site. Horizontal lines in groups indicate means, and vertical lines indicate 95% confidence intervals. *Indicates statistical significance at $p < 0.05$. (c) Two-dimensional topographic maps of dMMN in FEP-TR and FEP-nonTR patients. The colored bar with numbers indicates the amplitude of the dMMN (μV).

amplitude to a level of HCs at baseline was associated with a better clinical outcome, such as remission (Kim et al., 2018); a similar result was provided by a recent study by Fujioka et al. (2020). However, our analysis did not replicate previous study results that reported that impaired MMN was predictive of later transition to psychotic disorder (Bodatsch et al., 2011; Perez et al., 2014). The relatively small number of transitioned CHR subjects and the prescription of adequate medication, which aims to reduce the transition rate, may be the cause of the insignificant results of the current study. Therefore, future large-scale multisite longitudinal studies controlling for medication are warranted to test whether MMN could predict the prognosis of CHR individuals, including remission, nonremission, and transition to psychotic disorder, as in the recent study by Hamilton et al. (2019) of auditory P300.

Although treatment guidelines for schizophrenia recommend the use of clozapine in patients who are resistant to usual antipsychotic treatment (Addington, Addington, Abidi, Raedler, & Remington, 2017), it is difficult to know which FEP patients will be treatment resistant without spending a significant amount of time and resources and without extending patients' suffering

during trial and error. Moreover, in subjects at CHR for psychosis, although deciding the timing and intensity of intervention is more critical due to the nonspecific, heterogeneous, and changing nature of at-risk states, it is not easy to determine when to provide an intervention, which patients should receive an intervention, and the most suitable type of intervention to use due to the uncertain, diverse clinical outcomes of subjects at CHR for psychosis (Fusar-Poli et al., 2020). In addition, existing studies proposing CHR risk calculators based on clinical and neurocognitive features suggest the importance of the incorporation of biomarkers, such as ERP components reflective of early psychosis states, to enhance model performance (Cannon et al., 2016; Oribe et al., 2020; Park et al., 2021; Schmidt et al., 2017). Given that early psychosis periods exhibit a continuum of prodrome to FEP states, which share the common aspects of improved clinical outcomes by early interventions (Correll et al., 2018; Fusar-Poli et al., 2017; Lieberman et al., 2001), common prognostic biomarkers that forecast prognosis across the early psychosis periods would provide valuable information for early intervention. In this regard, this study first suggested that MMN may serve as a common prognostic biomarker that should be included in future prediction

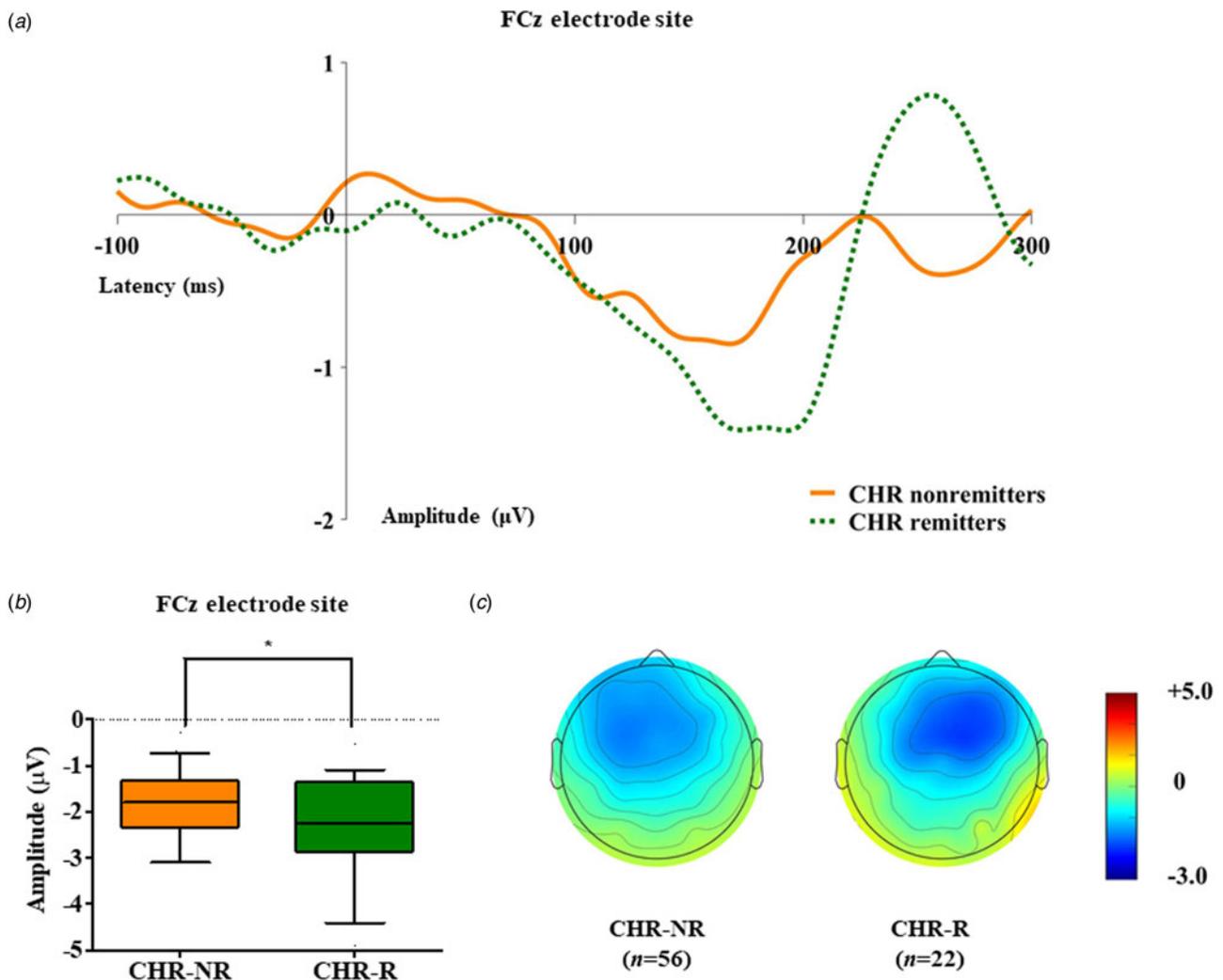


Fig. 3. (a) Grand-averaged duration deviant mismatch negativity (dMMN) waveforms across the individuals at clinical high risk (CHR) for psychosis who were remitted and those who were not at the FCz electrode site. (b) dMMN amplitude across the clinical outcome groups at the FCz electrode site. Horizontal lines in groups indicate means, and vertical lines indicate 95% confidence intervals. *Indicates statistical significance at $p < 0.05$. (c) Two-dimensional topographic maps of dMMN in CHR remitters and CHR nonremitters. The colored bar with numbers indicates the amplitude of the dMMN (μV).

Table 2. Significant predictors of treatment resistance in first-episode psychosis (FEP) patients and nonremission or transition to psychotic disorder in subjects at clinical high risk (CHR) for psychosis in binary logistic regression analysis with the backward selection method

Clinical outcome	Significant predictors	R^2	Exp (B)	p	95% CI	
					Lower	Upper
Treatment resistance in FEP	dMMN peak amplitude at FCz	0.206	2.100	0.024*	1.104	3.993
	duration of illness		1.138	0.010*	1.031	1.256
Nonremission in CHR	dMMN peak amplitude at FCz	0.142	1.898	0.030*	1.065	3.374
Transition in CHR	SOPS positive symptoms at baseline	0.088	1.178	0.043*	1.005	1.380

CI, confidence interval; dMMN, duration deviant mismatch negativity; SOPS, Scale of Prodromal Symptoms.
*Statistical significance, $p < 0.05$.

model development to forecast clinical outcomes of early psychosis patients from CHR to FEP states.

This study has several limitations. First, medication use at the time of dMMN recording and the time to clinical outcome varied among FEP patients and CHR individuals; however, medication

use at baseline and follow-up duration between clinical outcome groups were not different. Second, treatment resistance and nonremission were determined at a single last assessment that could not reflect changes outside the assessment points; thus, the findings should be interpreted with caution and potential biases

should be considered. For example, a CHR individual who was classified as a remitter at the last follow-up assessment could subsequently become a nonremitter or transition to a psychotic disorder. Third, we used dMMN exclusively, unlike previous studies that used frequency-deviant MMN or double-deviant MMN (Bodatsch et al., 2011; Perez et al., 2014), which may be one of the causes of the negative results in the exploratory analysis for predicting the transition to psychotic disorder. Fourth, our sample size and the number of FEP-TR and transitioned CHR patients were small compared to other multisite studies, which may have diluted the effect of MMN on prognosis prediction. Considering that our sample was obtained from a single center (i.e. SYC), the sample size was relatively large, and our results are free from the issue of multicenter data stability. Nevertheless, large-scale multisite longitudinal studies with various MMN paradigms should be conducted to confirm the results of the current study.

To our knowledge, the present study is the first to investigate whether dMMN could serve as a common prognostic biomarker in early psychosis patients across the CHR to FEP. We observed that a reduced dMMN amplitude was already present at the baseline in poor clinical outcome groups and was predictive of treatment resistance in FEP patients and nonremission in subjects at CHR for psychosis. The present study suggests that reduced dMMN amplitude may support the clinical decision of early clozapine use for expected FEP-TR and the provision of rigorous treatment for potential CHR nonremission cases. In conclusion, the current study results provide information regarding dMMN as a common prognostic biomarker that could be added to existing prediction models based on clinical and neurocognitive features across early psychosis periods, which will aid in clinical decision-making for early interventions.

Supplementary material. The supplementary material for this article can be found at <https://doi.org/10.1017/S0033291721003068>

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Conflict of interest. None.

Ethical standards. The authors assert that all procedures contributing to this work comply with the ethical standards of the relevant national and institutional committees on human experimentation and with the Helsinki Declaration of 1975, as revised in 2008.

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