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Medial prefrontal neuroplasticity during extended-release naltrexone treatment of opioid use disorder – a longitudinal structural magnetic resonance imaging study

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Opioid use disorder (OUD) has been linked to macroscopic structural alterations in the brain. The monthly injectable, extended-release formulation of μ -opioid antagonist naltrexone (XR-NTX) is highly effective in reducing opioid craving and preventing opioid relapse. Here, we investigated the neuroanatomical effects of XR-NTX by examining changes in cortical thickness during treatment for OUD. Forty-seven OUD patients underwent structural magnetic resonance imaging and subjectively rated their opioid craving ≤ 1 day before (pre-treatment) and 11 ± 3 days after (on-treatment) the first XR-NTX injection. A sample of fifty-six non-OUD individuals completed a single imaging session and served as the comparison group. A publicly available [¹¹C]carfentanil positron emission tomography dataset was used to assess the relationship between changes in cortical thickness and μ -opioid receptor (MOR) binding potential across brain regions. We found that the thickness of the medial prefrontal and anterior cingulate cortices (mPFC/aCC; regions with high MOR binding potential) was comparable between the non-OUD individuals and the OUD patients at pre-treatment. However, among the OUD patients, mPFC/aCC thickness significantly decreased from pre-treatment to on-treatment. A greater reduction in mPFC/aCC thickness was associated with a greater reduction in opioid craving. Taken together, our study suggests XR-NTX-induced cortical thickness reduction in the mPFC/aCC regions in OUD patients. The reduction in thickness does not appear to indicate a restoration to the non-OUD level but rather reflects XR-NTX's distinct therapeutic impact on an MOR-rich brain structure. Our findings highlight the neuroplastic effects of XR-NTX that may inform the development of novel OUD interventions.

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INTRODUCTION

Opioid use disorder (OUD) is a major contributor to the overall morbidity and mortality in the US. Medication-assisted treatments have emerged as a highly successful approach to treating OUD and include full opioid agonist methadone, partial agonist buprenorphine, and antagonist naltrexone [1]. Unlike the agonist agents, naltrexone works by blocking μ -opioid receptors (MORs) in the brain and does not produce opioid-like effects or physiological dependence. The monthly injectable, extended-release formulation of naltrexone (XR-NTX) is effective in reducing cravings and preventing relapse in OUD patients and has demonstrated clinical effectiveness comparable to agonist treatments [2–6].

OUD is characterized by altered brain functioning as revealed by functional magnetic resonance imaging (MRI) [7]. Individuals with OUD show heightened activity in the brain's reward circuits (e.g., striatum, prefrontal cortex) in response to drug-related stimuli (i.e., drug cues) [8], and such activation is linked to elevated opioid craving [9] and risk for relapse [10]. OUD patients also exhibit behavioral impulsivity [11–13] and decreased prefrontal engagement in inhibitory control, as compared to non-dependent individuals [14–16]. There is some evidence that prolonged

abstinence and pharmacotherapy aid in reducing opioid cue-reactivity [17–20], enhancing inhibitory control [21], and improving decision-making [22]. Specifically, XR-NTX has been shown to reduce frontostriatal reactivity to opioid cues [19, 20]. However, full restoration of normal neurocognitive functioning remains challenging (e.g., cue-reactivity [23]; impulsivity [24]; decision-making deficits [22, 25]), potentially due to lasting structural [24, 26] and functional [27, 28] alterations in the brain as a result of chronic opioid misuse.

Structurally, OUD patients show lower gray matter volumes and/or lower cortical thickness compared to non-dependent controls, particularly in the prefrontal and temporal cortices [29–31]. Cortical thickness is a well-established and clinically relevant metric of brain structural integrity [32–34] and has been linked to OUD severity and treatment outcomes [29, 35]. However, research on the effect of abstinence and treatment on brain morphology remains limited and has yielded inconsistent results [35–37]. Notably, no studies to date have examined changes in brain structure during naltrexone/XR-NTX treatment for OUD. Elucidating the neuroplastic effect of XR-NTX

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Table 1. Participant characteristics (count or mean \pm SD).

| Variable | OUD | | Non-OUD | P-value ¹ |
|--|-------------------------|-------------------|------------------------------------|----------------------|
| | pre-treatment | on-treatment | | |
| N | 47 | | 56 | – |
| Sex | 26 male, 21 female | | 31 male, 25 female | >0.99 |
| Age (years) | 29.04 \pm 8.72 | | 30.09 \pm 10.81 | 0.59 |
| Years of education | 13.77 \pm 2.12 | | 13.81 \pm 2.29 | 0.91 |
| Race | 44 White, 2 AA, 1 Asian | | 23 White, 19 AA, 4 Asian, 10 other | <0.001 |
| Ethnicity | 3 Hispanic | | 7 Hispanic | 0.34 |
| Years of opioid use | 5.83 \pm 5.95 | | – | – |
| Alcohol use disorder ² | 9 | | 9 | >0.99 |
| Stimulant use disorder ² | 13 | | 2 | 0.001 |
| Cannabis use disorder ² | 15 | | 14 | 0.66 |
| Prescription opioid use | 32 | | – | – |
| Heroin use | 33 | | – | – |
| Number of days since last opioid use | 18.23 \pm 17.01 | 29.66 \pm 17.50 | – | – |
| Number of cigarettes smoked per day ³ | 13.23 \pm 8.56 | 9.83 \pm 8.18 | 12.84 \pm 7.34 | 0.81; 0.060 |
| UDS positive for stimulant ⁴ | 5 | 8 | 3 | 0.47; 0.11 |
| UDS positive for cannabis ⁴ | 17 | 20 | 23 | 0.55; >0.99 |
| Opioid craving (0–9) ⁵ | 3.62 \pm 2.89 | 2.12 \pm 2.50 | – | – |

OUD opioid use disorder, AA African American, UDS urine drug screen.

¹P-values were obtained from independent t-tests for numeric variables and Fisher's exact tests for categorical variables. Separate tests were performed on pre- and on-treatment sessions when applicable.

²Diagnosis of alcohol, stimulant, and cannabis use disorder was missing in 5 non-OUD participants.

³Number of cigarettes per day at on-treatment was missing in 3 OUD participants.

⁴Urine toxicology data were missing in 2 non-OUD participants.

⁵Opioid craving at on-treatment was missing in 1 OUD participant.

will offer crucial mechanistic insights into its clinical efficacy and may inform on the long-term brain health of treated patients.

In this longitudinal observational study, we used structural MRI to examine changes in regional cortical thickness in patients receiving XR-NTX treatment for OUD. To examine whether such changes represented reversal of impairments caused by OUD, we compared the cortical thickness of non-OUD individuals to that of OUD patients before and during XR-NTX treatment. We then investigated the association between the change in cortical thickness and the clinical efficacy of XR-NTX as indexed by the reduction in opioid craving in OUD patients. Lastly, given the MOR antagonism property of XR-NTX, we examined whether XR-NTX-induced cortical thickness changes were related to interregional variation in MOR binding potential. We hypothesized that cortical regions with higher MOR binding potential (e.g., the prefrontal, anterior cingulate, and anterior insular cortices [38]) would show more pronounced cortical thickness change during XR-NTX treatment in OUD patients and that the change in cortical thickness would be associated with reductions in opioid craving.

METHODS

Participants

Detoxified OUD patients were recruited from the greater Philadelphia region between 2012–2014 and were offered up to 3 monthly XR-NTX injections. Of the 113 individuals that were initially enrolled, we excluded fifty-two who dropped out before receiving XR-NTX, fourteen who did not complete MRI, and two with poor MRI data quality, leaving a total of forty-seven participants in the final analysis that completed at least one XR-NTX injection as well as MRI assessments immediately before (pre-treatment) and 11 \pm 3 (mean \pm SD) days after (on-treatment) the first injection [19, 20]. A subset of 25 participants completed post-treatment MRI 44 \pm 17 (mean \pm SD) days after the third injection (see Procedure). The DSM-IV-TR

diagnosis of opioid dependence was established with history and physical exam and the Mini International Neuropsychiatric Interview (MINI) for DSM-IV [39]. Inclusion criteria were ages between 18 and 60 years; a DSM-IV-TR diagnosis of opioid dependence confirmed by self-report and medical records documenting daily opioid use for more than 2 weeks in the past 3 months; evidence of detoxification from opioids before XR-NTX injections as established by urine drug screen (UDS) (Redwood Toxicology Laboratory) and a negative naloxone challenge test; and good physical health ascertained by history and physical examination, blood chemistry, and urinalysis. Exclusion criteria were current use of medications that could confound blood oxygen level-dependent brain response, such as antidopaminergic agents, anticonvulsants, and β -blockers; current psychosis, dementia, intellectual disability, or lifetime history of schizophrenia; clinically significant cardiovascular, hematologic, pulmonary, hepatic, renal, metabolic, gastrointestinal, neurologic, or endocrine abnormalities; pregnancy or breastfeeding; history of clinically significant head trauma; contraindications for XR-NTX, such as medical conditions requiring opioid analgesics such as chronic pain disorder, planned surgery, obesity, elevated liver enzymes >3 times the upper limit of normal, or failure to complete opioid detoxification; contraindications for MRI, such as indwelling magnetically active foreign bodies, or fear of enclosed spaces.

A convenience cohort of fifty-six non-OUD individuals who completed one single MRI session was included as a comparison group [31]. The inclusion and exclusion criteria for the non-OUD group were similar to those for the OUD group, with the exception that all non-OUD individuals were tobacco cigarette smokers, and diagnosis of opioid dependence and eligibility for XR-NTX were not required. The non-OUD group was comparable to the OUD group with regard to demographics (except for race), tobacco smoking severity, comorbid non-opioid substance use disorders (except for stimulant use disorder), and current substance use verified by urine toxicology (see Table 1).

The study was approved by the University of Pennsylvania Institutional Review Board (No. 814234/819008/819597). Informed consent was obtained from all participants. All methods were performed in accordance with the relevant guidelines and regulations.

Study medication

To ensure completeness of opioid detoxification, XR-NTX was preceded by a challenge with 0.6 mg of naloxone hydrochloride IV. The OUD participants were offered up to three monthly intramuscular injections of XR-NTX (380 mg of naltrexone-HCl gradually released from dissolvable polymer microspheres over a period of one month, manufactured by Alkermes Inc, Cambridge, MA, under the brand name Vivitrol®). As part of the consent procedure, participants were briefed about the expected loss of pharmacological effects of opioids resulting from the XR-NTX treatment, and the dangers of attempting to overcome the opiate receptor blockade with higher than usual opioid doses [40, 41]. Medication was provided in the context of ongoing psychosocial support (two weekly sessions of professional drug counseling and anti-relapse strategies by trained clinical psychologists) and twice-weekly UDS monitoring. Plasma concentrations of naltrexone and 6 β -naltrexol (an active metabolite of naltrexone) were measured on the day of the on-treatment session using established liquid chromatography and tandem mass spectrometry technique [19, 42]. Upon study completion, continuation of care was discussed with the patients, and they were given referrals to treatment providers in the community.

Procedure

The OUD individuals completed baseline assessments including demographics, history and physical exam, UDS, and the MINI. Eligible OUD participants were offered a total of three monthly injections of XR-NTX. MRI scans and craving assessments were performed both before and after the first XR-NTX injection. Specifically, immediately before the first XR-NTX injection (i.e., pre-treatment), the OUD participants completed an MRI session and reported craving for opioids. Craving was measured by the question "To what degree are you feeling any craving/desire for opiates?" using a 10-point scale (0=none; 9=extremely). An average of 11.36 (SD = 3.09) days after the first XR-NTX injection (i.e., on-treatment), MRI and craving assessments were repeated. Craving scores were missing in one OUD participant at on-treatment. An average of 44.00 (SD = 17.06) days after the third and last XR-NTX injection (i.e., post-treatment), a subsample of 25 OUD participants completed a third session of MRI and craving assessments. Timing of the study sessions was based on a prior pharmacokinetic study showing that plasma concentrations of naltrexone and its primary metabolite 6 β -naltrexol reach a plateau at approximately 7–14 days following XR-NTX injection and return to baseline after approximately one month [43]. Details on the post-treatment session are reported in the Supplementary Information (see Figure S1 and Table S2). The non-OUD individuals completed assessments of demographics, UDS, the MINI, and one MRI session.

MRI data acquisition and preprocessing

MRI data were collected using a Siemens Tim Trio 3T system at the University of Pennsylvania. High-resolution T1-weighted whole-brain images were acquired using the magnetization-prepared rapid acquisition gradient echo (MPRAGE) sequence with repetition time/echo time = 1510/3.71 ms, field of view = 256 × 192 mm², matrix = 256 × 192, slice thickness/gap = 1/0 mm, 160 slices, effective voxel resolution = 1 × 1 × 1 mm³, and flip angle = 9°.

MRI images were processed using the volume-based cortical thickness pipeline implemented in Advanced Normalization Tools (ANTs) [34, 44]. Details of the pipeline can be found in Tustison et al. [34]. Specifically, N4 bias field correction was performed on the raw structural images to minimize the impact of low-frequency field inhomogeneity [45]. Bias-corrected images were subjected to brain extraction via optimized template registration and Atropos three-tissue segmentation. Atropos six-tissue segmentation was then performed iteratively with N4 bias field correction using atlases derived from the Open Access Series of Imaging Studies (OASIS) dataset [46]. Voxelwise cortical thickness was estimated within the volumetric domain using the diffeomorphic registration-based cortical thickness (DiReCT) algorithm that measures of the distance between the gray matter-white matter interface and the gray matter-cerebrospinal fluid interface while taking into consideration neuroanatomical constraints [47]. Cortical thickness measure from ANTs has shown high test-retest reliability and external validity [34]. Individual-level cortical thickness maps were created and spatially smoothed with full width at half maximum (FWHM) set to 4 mm using SPM12 (Wellcome Trust Centre for Neuroimaging, London, UK). For confirmatory purpose, we repeated the main analyses using cortical thickness data that were unsmoothed and smoothed with 12-mm FWHM

as well as using voxel-based morphometry data that were estimated by the Computational Anatomy Toolbox (CAT) (see the Supplementary Information).

Data analysis

A whole-brain paired t-test examined the change in regional cortical thickness from pre-treatment to on-treatment among the OUD individuals. Significant changes were determined using the threshold-free cluster enhancement (TFCE) algorithm at cluster-level familywise error-corrected $p < 0.05$ [48]. Regions showing a significant change were defined as the regions of interest (ROIs). Mean cortical thickness were extracted from the ROIs and subjected to subsequent statistical analyses in R (www.R-project.org). Specifically, we performed two-sample t-test to compare the cortical thickness at the ROIs between the non-OUD and OUD individuals (for both pre-treatment and on-treatment timepoints). However, given that the non-OUD group completed only one MRI session, comparisons between the two groups should be treated as exploratory. We also performed Pearson correlation to test for the association between the change in cortical thickness and the change in opioid craving among the OUD individuals. Exploratory whole-brain analyses were conducted to examine the group difference and the correlation with the change in craving in brain regions beyond the ROIs.

We further examined whether cortical thickness change was correlated with MOR binding potential across brain regions in the OUD cohort. A whole-brain MOR binding potential map was obtained from a previous study in which 204 adults underwent [¹¹C]carfentanil positron emission tomography (PET) [38]. A polynomial regression analysis was performed to test the association between mean cortical thickness change and MOR binding potential across the 360 cortical regions defined by the Human Connectome Project multimodal parcellation (HCP-MMP) atlas of the cerebral cortex [49]. Starting with a basic model that only included the constant term, we added linear, cubic, quadratic, and subsequent higher-order terms to the model one at a time. F-test was used to determine whether the addition of each term significantly improved the fit of the model. The process was continued until the improvement in the model fit was no longer significant.

We performed additional exploratory analyses to examine (1) the association between cortical thickness change and the duration of abstinence (i.e., the number of days since last opioid use), (2) the association between cortical thickness change and data quality, and (3) cortical thickness at post-treatment. We also performed confirmatory analyses on un-smoothed data as well as data that were smoothed using 12-mm FWHM. Details of these analyses are in the Supplementary Information.

RESULTS

Participant characteristics

Participant characteristics of the OUD and the non-OUD groups are summarized in Table 1. The OUD and non-OUD groups significantly differed in race and diagnosis of stimulant use disorder, which were controlled for in subsequent comparisons between the two groups. The OUD individuals showed a significant reduction in opioid craving from pre-treatment to on-treatment (difference = 1.39, 95% confidence interval [CI] = [0.49, 2.30], $t(45) = 3.10$, $p = 0.003$). There was also a significant reduction in the number of cigarettes smoked per day (difference = 2.94, 95% CI = [1.34, 4.54], $t(43) = 3.70$, $p < 0.001$), a finding that we have reported elsewhere [50]. Positive UDS results for stimulant and cannabis did not differ between pre- and on-treatment sessions (McNemar's test, $\chi^2(1) = 0.36$ & 0.57, $p = 0.55$ & 0.45).

Cortical thickness change across time in the OUD individuals

Whole-brain comparison between the pre-treatment and on-treatment sessions showed a significant reduction in the cortical thickness of the medial prefrontal cortex (mPFC) and the adjacent anterior cingulate cortex (aCC) among the OUD individuals (whole-brain TFCE-corrected $p < 0.05$; see Fig. 1a and Table S1). The opposite contrast for increased cortical thickness from pre-treatment to on-treatment did not reveal any significant clusters.

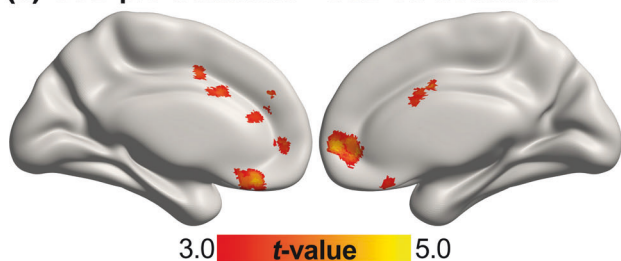
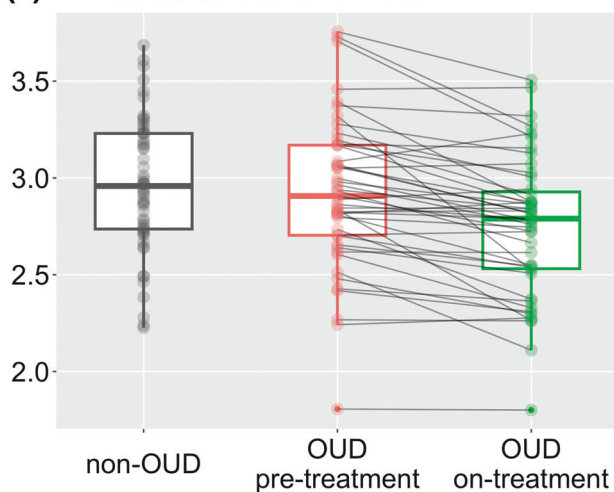
(a) OUD pre-treatment > OUD on-treatment**(b) mPFC/aCC cortical thickness**

Fig. 1 Cortical thickness change across time. **a** Significant reduction in cortical thickness from pre-treatment to on-treatment in the OUD group revealed by whole-brain paired *t*-test, thresholded at corrected $p < 0.05$. **b** Cortical thickness of the mPFC/aCC region of interest in the non-OUD group and the OUD group at the pre-treatment and on-treatment sessions. OUD opioid use disorder, mPFC medial prefrontal cortex, aCC anterior cingulate cortex.

Given the spatial proximity of the mPFC and aCC clusters, we combined them into a single ROI in the subsequent analyses. For visualization purposes, we extracted and plotted the cortical thickness of the mPFC/aCC ROI at pre-treatment and on-treatment (see Fig. 1b).

The observed change in mPFC/aCC thickness was not attributable to duration of abstinence or imaging data quality. Exploratory analysis showed that mPFC/aCC cortical thickness at the post-treatment session was significantly lower than the pre-treatment session but did not differ from the on-treatment session (see Fig. S2). Details of these analyses are reported in the Supplementary Information.

Exploratory comparisons between the OUD and non-OUD individuals

Compared to the non-OUD group (mean \pm SD = 2.96 ± 0.34), the OUD group had comparable mPFC/aCC ROI cortical thickness at pre-treatment (2.92 ± 0.39 , $t(92.8) = 0.55$, $p = 0.58$) but significantly lower thickness at on-treatment (2.75 ± 0.36 , $t(96.2) = 2.98$, $p = 0.004$) (see Fig. 1b and S2). Linear regression analyses that controlled for race and stimulant use disorder similarly showed differences between non-OUD and OUD in mPFC/aCC thickness (pre-treatment, coefficient = -0.10 , standard error [SE] = 0.09 , $t(96) = 1.13$, $p = 0.26$; on-treatment, coefficient = 0.29 , SE = 0.09 , $t(96) = 3.42$, $p = 0.001$). Whole-brain exploration showed widespread, lower frontal, parietal, and temporal cortical thickness in the OUD than the non-OUD group for both pre-treatment and on-treatment (see Fig. S3 and Tables S3 & S4).

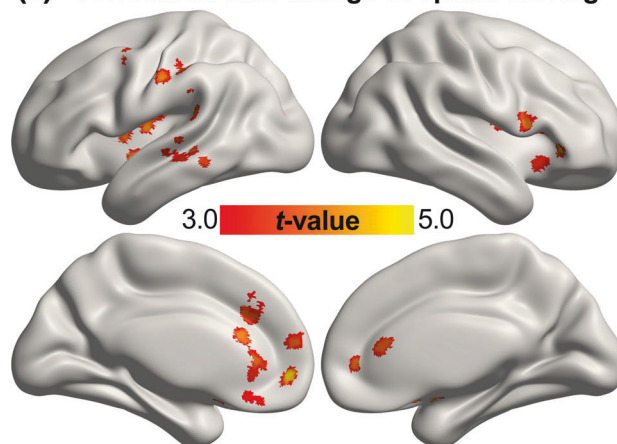
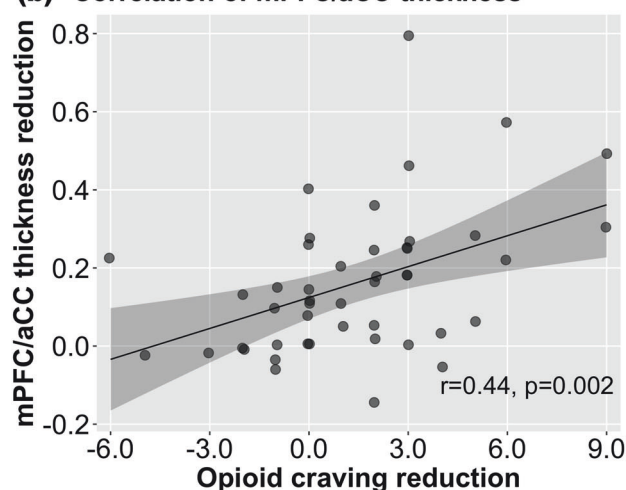
(a) Correlation with change in opioid craving**(b) Correlation of mPFC/aCC thickness**

Fig. 2 Association between changes in cortical thickness and opioid craving. **a** Significant correlation between the change in opioid craving and the change in cortical thickness from pre-treatment to on-treatment in the OUD group revealed by whole-brain regression, thresholded at corrected $p < 0.05$. **b** Association between the change in opioid craving and the change in cortical thickness of the mPFC/aCC region of interest. OUD opioid use disorder, mPFC medial prefrontal cortex, aCC anterior cingulate cortex. Reduction = pre-treatment minus on-treatment. The shaded area represents 95% confidence interval.

Association between changes in cortical thickness and opioid craving

There was a significant positive correlation between the reduction in opioid craving and the reduction in mPFC/aCC thickness from pre-treatment to on-treatment in the OUD group ($r = 0.44$, $p = 0.002$) (see Fig. 2b). Whole-brain regression analysis was performed to explore regions beyond the mPFC/aCC ROI and showed that the change in opioid craving was positively associated with the change in cortical thickness of several additional regions including the bilateral insula, bilateral inferior frontal gyrus, left precentral and postcentral gyrus, left temporoparietal junction, and left middle temporal gyrus (corrected $p < 0.05$; see Fig. 2a and Table S5). There was no significant negative correlation between the change in opioid craving and the change in cortical thickness.

Mapping of MOR binding potential to cortical thickness change

We conducted a polynomial regression analysis to examine the relationship between MOR binding potential and cortical

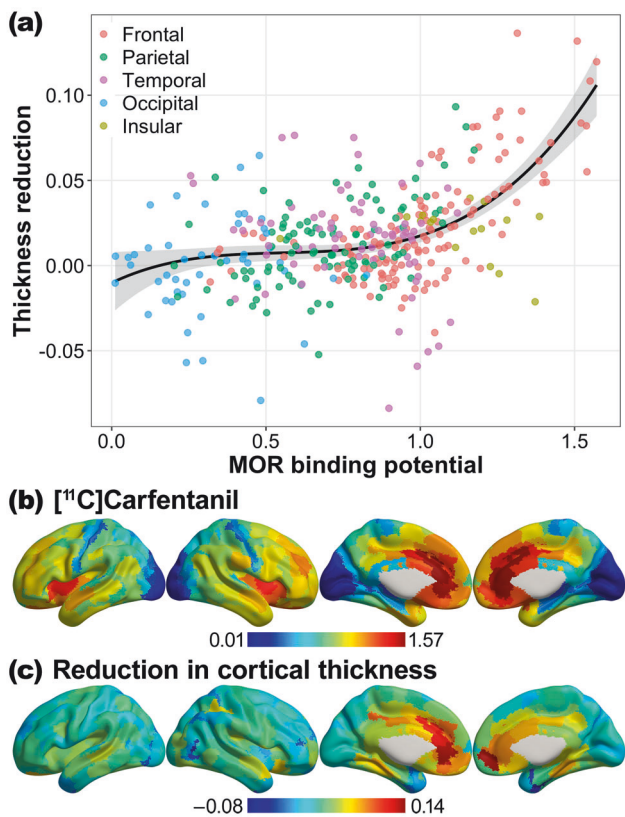


Fig. 3 Mapping of MOR binding potential to cortical thickness change. **a** Curvilinear association between MOR binding potential and the change in cortical thickness (pre-treatment minus on-treatment) across cortical regions in the OUD group. **b** MOR receptor binding potential map obtained from a large sample ($N = 204$) [^{11}C]carfentanil positron emission tomographic imaging study (Kantonen et al. [38], *NeuroImage*). **c** Unthresholded map of cortical thickness change (pre-treatment minus on-treatment) in the OUD group. OUD opioid use disorder, MOR μ -opioid receptor.

thickness reduction in the OUD group. Model comparison using F-tests indicated a cubic model as the optimal model (linear vs. quadratic, $F(1,357) = 37.16$, $p < 0.001$; quadratic vs. cubic, $F(1,356) = 13.38$, $p < 0.001$; cubic vs. quartic, $F(1,355) = 0.11$, $p = 0.74$). The curvilinear relationship was characterized by significant linear, quadratic, and cubic effects of MOR binding potential on cortical thickness reduction ($F(1,356) = 93.64$, 38.45, & 13.38, $ps < 0.001$, $R^2 = 0.29$; see Fig. 3). Examination of the tangent slopes and their 95% CIs suggests a positive association between MOR binding potential and cortical thickness reduction in brain regions with relatively high MOR binding potential (>0.33).

DISCUSSION

We found reduced cortical thickness in the mPFC and the adjacent aCC among the OUD patients during the first two weeks of MOR antagonist treatment with XR-NTX. An exploratory comparison of the OUD and non-OUD individuals showed that the cortical thickness in mPFC/aCC was comparable between the two groups before XR-NTX but was lower in the former during and after XR-NTX. The reduction in mPFC/aCC cortical thickness after treatment correlated with patients' reductions in craving for opioids, but not with the duration of opioid abstinence. A multimodal analysis with [^{11}C]carfentanil PET data suggests that the relationship between MOR binding potential and cortical thickness reduction followed a curvilinear pattern, with larger thickness reduction observed in brain regions with higher MOR binding potential.

MRI-measured cortical thickness reflects the distance between the cerebral cortex's pial surface and the white matter-gray matter boundary [34, 47, 51]. The cerebral cortex comprises of neuronal cell bodies, glia cells, and neuropil – a network of axons, dendrites, and synapses that facilitate neural communication [52]. Cortical thickness correlates negatively with neuronal density [53] and positively with dendritic arborization [54, 55] and density of glia cells [56]. Gene expression studies have also associated variations in cortical thickness with the cellular composition of the cortex, including CA1 pyramidal cells, astrocytes, and microglia [57–59]. Therefore, a thicker cortex may reflect not only the number of neurons but also a more intricate neuropil organization attributable to dendritic arborization and support by glial cells that enhance intracortical connectivity [52].

Preclinical evidence suggests a role for opioids in regulating neurodevelopment. Perinatal blockade of opioid receptors with naltrexone and naloxone was found to increase the number of dendritic spines (i.e., protrusions that receive synaptic input) [60, 61], whereas morphine decreased dendritic spine density [61] and dendritic length [62]. Interestingly, in adult rats, repeated morphine exposure upregulated the expression of genes involved in intra- and inter-cellular signaling and synaptic morphology, which may have implications for neuroadaptation and neuroplasticity processes in the development of and recovery from OUD [63].

Studies reporting reduced cortical thickness following a clinically effective pharmacotherapy are a minority within the literature pertaining to the treatment of mental disorders [64]. In most cases, reduction in cortical thickness after early adulthood is regarded as a manifestation or consequence of aging [65] and conditions such as neurodegeneration [66], traumatic brain injury [67], and mental disorders [68–71] (but see [72]). Reductions in prefrontal cortical thickness, specifically, can be associated with cognitive decline such as impaired executive functions [73]. The observed decrease in mPFC/aCC cortical thickness in the current study appears to contradict the absence of clinical evidence in the literature that indicates any cognitive impairment during XR-NTX treatment of OUD [2, 74, 75]. On the contrary, preclinical studies show that naltrexone promotes early neurodevelopment [60] and attenuates age-related decline in attentional set-shifting [76]. In human subjects, naltrexone has been shown to increase cognitive flexibility [77] and adaptive cognitive control [78]. The mPFC and aCC are implicated in a range of cognitive functions (e.g., incentive salience processing [8], impulsivity control [79], decision making [80]), which either remain unchanged or show partial recovery as a result of abstinence [25, 27, 81–84], psychotherapy [85–87], and pharmacotherapy [20, 88–90] in individuals with substance use disorders. The discrepancy between previous findings and the observed mPFC/aCC thickness reduction raises intriguing questions about the mechanisms underlying XR-NTX's effect on brain structure and potential clinical implications of our findings.

One possible interpretation is that MOR blockade by XR-NTX alters the neurotransmission within and thus morphology of MOR-rich brain structures. A previous study showed that the dopamine D2 antagonist haloperidol (a first-generation antipsychotic medication) reduced the volume of the striatum, a region rich in D2 receptors, within 2 hours of administration [91]. Similarly, loss of brain gray matter has been associated with the use of other first-generation antipsychotics such as chlorpromazine and trifluoperazine which are high-affinity D2 antagonists [92, 93]. To be best of our knowledge, no prior research has examined the effect of opioid antagonism on brain structure in humans. Our finding of reduced cortical thickness in MOR-rich regions during XR-NTX treatment appears to corroborate the D2 literature and suggests a link from neurotransmission and/or receptor occupancy to brain morphology [94–96]. Nevertheless, the molecular and cellular mechanisms underlying such a link remain unclear.

The reduced mPFC/aCC cortical thickness may also reflect neuroplasticity that relates to changes in OUD patients' responses to external stimuli. The mPFC and the aCC play a key role in processing rewards [97–100]. Individuals with substance use disorders show heightened mPFC/aCC neural response to drug cues [8, 100] that correlates with elevated drug craving [9, 101, 102]. XR-NTX is highly effective in blunting opioid craving [2–6] and reducing the neural response to opioid cues [19, 20]. The reduction in mPFC/aCC cortical thickness may be attributable to the brain's adaption (e.g., elimination of dysfunctional synapses) to environmental drug cues whose incentive value diminished as a result of XR-NTX treatment. Alternatively, it could reflect changes in the environment (e.g., less exposure to drug cues) that reinforced the craving-reducing effect of XR-NTX.

The observation that post-treatment mPFC/aCC cortical thickness was comparable to on-treatment and lower than pre-treatment suggests an acute effect of XR-NTX that occurred during the first two weeks of treatment. Prior research showed that craving for opioids immediately decreased following the first injection of XR-NTX and remained stable throughout subsequent injections. Given the similar temporal profiles, structural changes of the mPFC/aCC may mediate XR-NTX-induced attenuation of opioid craving. Such speculation was corroborated by the observed positive correlation between the reduction in mPFC/aCC cortical thickness and the reduction in opioid craving.

In an exploratory analysis, we compared the single session of cortical thickness data of the non-OUD group to each of the pre-treatment and on-treatment sessions of the OUD group. We found that, relative to the non-OUD individuals, the OUD patients had comparable pre-treatment mPFC/aCC cortical thickness but significantly lower on-treatment and post-treatment thickness. Hence, the observed thickness reduction in the OUD group may not signify a restorative or normalization process but rather a treatment-related effect that is independent of OUD diagnosis itself. The results parallel those reported in patients with psychosis, where antipsychotics modulate cortical thickness in brain regions unaffected by the illness at baseline, suggesting treatment-induced neuroanatomical alterations beyond the primary pathology [93]. The exact significance of these alterations, whether they are essential for the therapeutic effects or are mere side effects, remains unclear. Our findings thus underscore the complex and multifaceted effects of XR-NTX, whose impact extends beyond mere reversal of impairments caused by OUD.

Our study has several limitations. First, the absence of untreated, placebo-controlled, or agonist-treated OUD cohorts for comparison limited our ability to determine whether the observed reduction in mPFC/aCC cortical thickness was specific to XR-NTX. Implementing a placebo control condition for XR-NTX would pose challenges, as patients almost invariably test opioid blockade in the early stages of treatment, which could increase the risk of relapse and overdose under placebo [103]. Additionally, we did not find an association between the duration of abstinence and cortical thickness, suggesting that abstinence alone could not fully account for the results. Secondly, the non-OUD cohort only completed a single session of MRI, which prevented us from isolating the main effect of time (i.e., pre vs. on). Potential confounding variables, such as signals from non-cortical tissues, would be better addressed with repeated MRI scans for both cohorts. Moreover, the non-OUD cohort was a convenient sample and was not well matched with the OUD cohort on variables including race and comorbid stimulant use disorder (although controlling for these variables produced similar results). Therefore, caution is required in the interpretation of the wide-spread cortical thickness differences between the two cohorts, which were somewhat inconsistent with the results of a prior study [29]. Thirdly, the study did not examine the underlying cellular and molecular processes. Prior research has highlighted the contribution of genetic factors to regional cortical thickness [57–59]. The

brain opioidergic system has also been implicated in shaping brain morphology during both early development and adulthood [60–63]. It would be interesting to examine the role of genetic factors and opioidergic neurotransmissions in brain structural changes during pharmacotherapy of OUD. Fourthly, a lack of neuropsychological assessments prevented us from examining the relationship between cortical thickness reduction and potential cognitive functions. A significant reduction in cortical thickness over a short period (e.g., ≈2 weeks) is uncommon and can be of neurological concern [65–71]. Although cognitive deterioration has not been reported in previous trials involving XR-NTX treatment of OUD [2, 74, 75], the observed acute reduction in mPFC/aCC thickness during the early phase of the treatment underscores the need for more in-depth investigation to determine if it constitutes a side effect. Specifically, future research should combine neuroimaging and neuropsychological assessments to investigate XR-NTX's effects on cognitive functions associated with the mPFC/aCC such as decision making [104], inhibitory control [79], and social cognition [105]. Lastly, the three-month duration of XR-NTX treatment was relatively short compared to the extended period required for recovery from OUD. Although a single on-treatment time point after the first injection minimized the impact of patient dropout, it limited our ability to fully characterize the time course of brain structural changes during the three-month treatment. In addition, our data were collected before the regional drug market became dominated by fentanyl, a synthetic opioid with much higher potency and cytotoxicity than heroin. Effective treatment of OUD amid the fentanyl epidemic will likely require longer (>6 months) treatment duration [106, 107]. It would be valuable to evaluate brain structure at additional time points and their correlation with long-term outcomes such as relapse and overdose.

In conclusion, we demonstrated that XR-NTX treatment is associated with reduced cortical thickness among OUD patients in the mPFC and the adjacent aCC, regions known for their high MOR binding potential. Importantly, cortical thickness reductions covaried with the clinical effectiveness of XR-NTX, as indexed by the reduction in opioid craving. These findings present a novel neurobiological phenomenon in XR-NTX treatment for OUD. Understanding the impact of XR-NTX on cortical morphology and its relationship with clinical outcomes contributes to our knowledge of the underlying mechanisms of the treatment and may guide future interventions aimed at improving the clinical management of OUD.

DATA AVAILABILITY

The cortical thickness change map is available at NeuroVault (<http://neurovault.org/collections/15137>). The [¹¹C]carfentanil PET map is available at NeuroVault (<http://neurovault.org/collections/5706>) [38]. The HCP-MMP atlas is available at NeuroVault (<https://neurovault.org/collections/1549>) [49]. Clinical data that support the findings of this study are available from the corresponding author upon reasonable request.

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AUTHOR CONTRIBUTIONS

JL and DDL designed the study. ZS, JL, and DDL collected the data. ZS, WC, and KGL analyzed the data. ZS, XL, DRT, KGL, JAD, DDL, & CEW interpreted the results. ZS, XL, DRT, DDL, & CEW wrote the manuscript. All authors contributed to the revision of the manuscript for critical intellectual content and approved the final version.

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COMPETING INTERESTS

The authors declare no competing interests.

ADDITIONAL INFORMATION

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