1	Integrating plasticity into precision psychiatry
2 3	Igor Branchi
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5 6 7 8	Center for Behavioral Sciences and Mental Health,
7	Istituto Superiore di Sanità, Rome, Italy
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25	Correspondence to:
26 27	Igor Branchi, Ph.D.
28	
29	Center for Behavioral Sciences and Mental Health
30	Istituto Superiore di Sanità
31	Viale Regina Elena, 299
32	00161 Roma, Italy
33 2//	Tol + + 20 06 4000 2822
34 35	Tel.: +39 06 4990 2833 E-mail: <u>igor.branchi@iss.it</u>
36 36	ORCID: https://orcid.org/0000-0003-4484-3598
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38 Abstract

39 Understanding transitions from psychopathology to wellbeing is crucial for promoting recovery. Plasticity -40 -- the ability to modify brain functioning and mental states -- is increasingly recognized as essential because 41 it enables the reorganization of neural and mental processes underlying such transitions. Recently, a 42 network-based approach that operationalizes plasticity, and the ability to transition to wellbeing, as the 43 inverse of the connectivity strength within the symptom network has been proven effective in predicting 44 both the likelihood and timing of recovery from major depressive disorder. This innovative method to 45 measure plasticity is opening new avenues for timely diagnosis, patient stratification, and targeted, 46 individualized treatment of mental illness. Overall, integrating the assessment of plasticity levels into 47 precision psychiatry holds significant potential for developing novel and effective personalized therapeutic 48 strategies in psychiatry.

50 Plasticity as a critical factor to achieve mental wellbeing

57 In psychiatry and neuroscience, plasticity is defined as the ability to modify brain functioning and mental 52 states [1]. It arises from processes occurring across multiple scales, from the molecular to the behavioral 53 one. Plasticity is increasingly acknowledged as a crucial process in the recovery from psychiatric disorders 54 because it underlies the reorganization of neural and mental processes during transitions from 55 psychopathology to wellbeing [2].

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57 Plasticity is not inherently beneficial: the relevance of context

58 It is noteworthy that the above definition of plasticity implies that it is neither inherently beneficial nor 59 detrimental as an enhancement of plasticity increases the likelihood of mental state transitions without 60 determining the direction in which these transitions occur (Fig. 1a). The direction is determined by 61 moderators including contextual factors, such as living conditions or subjective appraisal of quality of life 62 [1]. Accordingly, evidence increasingly demonstrates that treatments able to enhance plasticity produce 63 effects that can be highly context-dependent, amplifying the influence of contextual factors in shaping 64 mental health and behavioral outcomes. Consequently, high plasticity has a greater therapeutic impact 65 when combined with supportive living conditions or psychotherapeutic approaches [1-3] (Fig. 1b). Indeed, 66 the efficacy of treatments such as selective serotonin reuptake inhibitors (SSRIs), psychedelics and 67 ketamine - that reportedly enhance plasticity -- is dependent, at least partially, on their pairing with 68 favorable environmental conditions [2, 4, 5]. Accordingly, the combination of antidepressants with 69 psychotherapy is more effective than the drugs alone [6].

70

77 Plasticity levels as determinant of the inter-individual variability in the efficacy of 72 environmental, lifestyle interventions and psychotherapy

73 Therapeutic strategies based on lifestyle, environmental, or psychotherapeutic interventions are 74 increasingly recognized as essential for promoting mental health. However, not everyone benefits equally 75 from these approaches. For many individuals, targeting the living conditions [7] or subjective appraisal [6] 76 may not be sufficient. This disparity can be attributed, among other factors, to differences in plasticity.

77 Individuals with high plasticity can swiftly modify their mental state in response to these interventions (Fig. 78 1b), while those with low plasticity cannot [2] (Fig. 1c). Therefore, the outcome of plasticity on mental 79 health depends on context and vice versa, making their interplay highly relevant for developing personalized 80 therapeutic strategies in psychiatry. Specifically, fostering high plasticity with supportive contextual 81 conditions is essential for promoting recovery and wellbeing. In the clinical settings, it is thus necessary to 82 assess both an individual's quality of context and plasticity levels. While psychometric tools to evaluate the 83 quality of context, such as quality of life questionnaires, have long been available, methods to assess and 84 operationalize plasticity remain limited. Only recently have innovative strategies started to emerge.

85

86 Operationalizing plasticity: measuring susceptibility to change mental state

87 Plasticity can be assessed through various advanced methods. Neuroimaging techniques, such as functional 88 magnetic resonance imaging (fMRI), track changes in brain activity over time. Electrophysiological 89 techniques like electro-encephalograms (EEG) measure real-time neural responses, helping assessing 90 plasticity at the cortical level [8]. These tools have been instrumental in demonstrating how the brain can 91 undergo structural and functional changes in response to various experiences, and in effectively assessing 92 neuronal coherence and connectivity [9, 10]. Yet, these techniques are limited in depicting real time 93 plasticity changes because of sub-optimal space resolution of EEG and insufficient temporal resolution of 94 fMRI. An additional limitation, particularly for fMRI, is its relatively high costs and practical challenges in 95 implementation. Moreover, for effective clinical application, these approaches should measure plasticity 96 encompassing an individual's overall ability to modify their mental state to transition from psychopathology 97 to wellbeing. Therefore, novel strategies to operationalize plasticity are still warranted.

The seminal works by Denny Borsboom on the network theory of psychopathology [11] have been among the most innovative scientific ideas in the mental health field in recent years. By conceptualizing mental disorders as networks, the onset, progression and recovery of psychopathology can be explored exploiting the general properties of networks and graphs [11]. Building on this theoretical framework, the *network theory of plasticity* has been recently introduced [2]. This theory proposes the connectivity strength among the elements of a system as a measure of system plasticity and thus of its ability to change its

104 outcome. In a highly connected network, each element is limited in its ability to change as its modifications 105 are constrained by the necessity of simultaneously modifying all the other connected elements. Conversely, 106 in a weakly connected network, each element can be modified with limited or no constraints. Plasticity has 107 thus been operationalized as the inverse of connectivity strength. When conceptualizing an individual as a 108 network of interconnected symptoms, the individual's plasticity -- and thus their ability to transition from 109 psychopathology to wellbeing -- is predicted to be inversely related to the connectivity strength within the 110 symptom network. For instance, in the case of studies on depression, connectivity has been measured as 111 the sum of absolute correlations, reflecting the overall degree -- whether positive or negative -- of co-112 occurrence among the nine standard symptoms of major depressive disorder as defined by the DSM-5. The 113 validity of this operationalization has been recently demonstrated through an analysis of two independent 114 datasets, the STAR*D-Sequenced treatment alternatives to relieve depression and the CO-MED-Combining medications to enhance depression outcomes [12, 13]. Findings revealed the baseline connectivity strength 115 116 among symptoms is significantly weaker in responders than in non-responders (e.g., those not experiencing 117 significant improvement after an adequate course of treatment). This difference reflects the higher plasticity 118 and greater capacity for change in depression scores observed in responders. Moreover, baseline 119 connectivity strength inversely correlates with subsequent improvement over four weeks: the weaker the 120 connectivity, and thus the higher the plasticity, the larger the improvement in depression score. As high 121 plasticity promotes changes in mental states according to contextual factors, baseline connectivity strength 122 correlates with the susceptibility to change depression score according to the quality of context both in 123 patients showing an improvement or a deterioration of the symptomatology. Finally, the operationalization 124 of plasticity exhibited high sensitivity, effectively differentiating individuals based on the timing of their 125 recovery trajectory [13]. Further investigations are warranted to consolidate the reliability of these findings 126 and to identify the limitations of the approach. Overall, the network-based operationalization of plasticity 127 represents a novel mathematical tool for understanding and predicting resilience, vulnerability, and 128 capability to recover. In addition, it holds promise to improve approaches to prevent and treat depression. 129 As the measure of plasticity pertains to basic features of complex systems, it is likely generalizable at 130 multiple levels of analysis, from the symptomatology to the neural features, and across diseases.

137 Precision psychiatry: stratification according to plasticity and context

132 By assessing individual plasticity levels through its operationalization, patients can be stratified according 133 to both plasticity and quality of context. This stratification can be leveraged to design targeted therapeutic 134 strategies within a precision psychiatry approach. For instance, patients with high plasticity are expected 135 to possess the potential for transitioning to wellbeing. However, if they experience unfavorable contextual 136 factors, they need to undergo therapies improving their guality of life to harness their ability for a beneficial 137 outcome, such as lifestyle interventions or psychotherapy. By contrast, patients with low plasticity are 138 expected to show no or slow transition to wellbeing even if exposed to supportive conditions. In this case, 139 the transition toward wellbeing might be promoted by treatment with SSRI and psychedelics [1, 4] or, more 140 in general, by approaches able to enhance plasticity [14] (see Fig. 1d for further details).

Further potential applications of plasticity assessment in clinical settings stem also from viewing the time required to shift from one state to another, such as from psychopathology to wellbeing, related to plasticity levels: the higher the plasticity, the faster the transition. Indeed, a recent study based on the network-based operationalization of plasticity has shown that plasticity levels at baseline, measured as connectivity strength, predict the time to both clinical response and remission [13]. This approach promises to identify disease trajectories at enrollment, leading to tailored approaches.

147

148 Harnessing plasticity to promote mental health

In conclusion, the conceptual shift from viewing plasticity as an instructive factor driving toward recovery, to a permissive factor determining the influence of the contextual factors on mental health [2], provides a novel theoretical framework that holds promise for advancing psychiatry and the understanding of mental illness. In addition, emerging strategies, such as the network-based operationalization of plasticity, that provide a quantifiable measure of plasticity -- and thus of the ability to change the mental state -- pave the way for personalized preventive and therapeutic approaches within precision psychiatry.

Finally, the perspective proposed here not only underscores the importance of integrating plasticity into clinical practice but also emphasizes the relevance of contextual factors, including the individual subjective appraisal of their quality of life, when assessing the efficacy of psychopharmacological interventions.

Overlooking the drug by context interaction may partly explain the high variability in the efficacy of pharmacological treatments, especially those affecting plasticity levels such as classic and novel antidepressants. This oversight could represent one of the causes that has contributed to low trial sensitivity leading to a progressive decline in the investments for the development of pharmacological approaches in psychiatry and brain health. By incorporating plasticity and context as key elements in the drug development process, there is potential to reinvigorate research and attract new investment to ultimately advance treatment options for psychiatric patients.

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173 Conflict of Interest

- The author declares no competing interests. ERANET, Istituto Superiore di Sanità and European Union had no role in design and conduct of the study; collection, management, analysis, and interpretation of the data; preparation, review, or approval of the manuscript; and decision to submit the manuscript for publication.
- 178
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222 Figure legends

223 Figure 1. Overview of the role of plasticity and its interplay with context in the transition from 224 psychopathology to wellbeing. A landscape with valleys representing different mental states, such as 225 psychopathology and wellbeing. The hills between them act as barriers that hinder the transition from one 226 state to another. The therapeutic goal is to help the system (i.e., the individual) transition from a 227 pathological state to wellbeing, which can be imagined as a ball rolling from one valley to another. (a) 228 Enhancing plasticity enables the transition but does not promote the stability of a specific mental state. (b) 229 Combination of high plasticity and a favorable context is the most effective therapeutic strategy as it enables 230 the transition and promotes sustained wellbeing. (c) The action exerted by the context can stabilize 231 wellbeing but it may be not sufficient to achieve it. Adapted from Branchi I, Giuliani A. Shaping therapeutic 232 trajectories in mental health: Instructive vs. permissive causality. European neuropsychopharmacol 2021; 233 43:1-9. (d) Personalized therapeutic strategies within a precision psychiatry approach. By tailoring 234 interventions to both a patient's plasticity level and quality of contextual factors enables effective therapies 235 aimed at maximizing recovery potential.

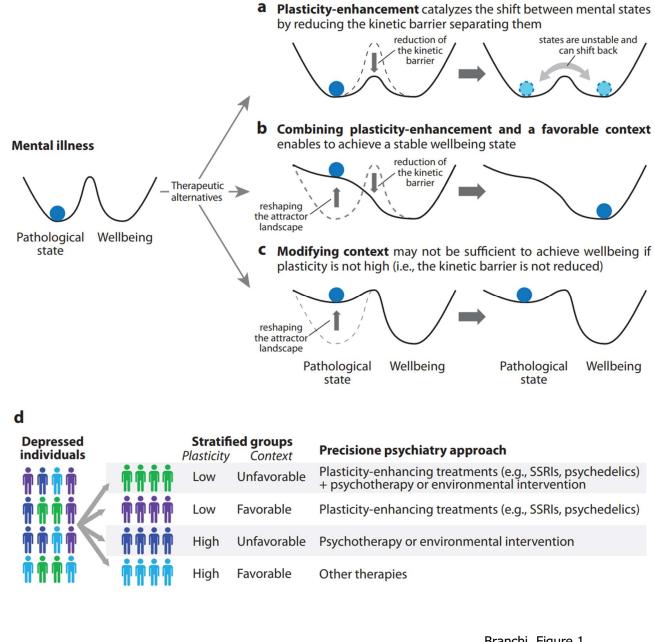
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Branchi, Figure 1