

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26

Mapping future directions to test biopsychosocial pathways to health and well-being

Jenalee R. Doom, PhD

Department of Psychology, University of Denver

Author Note

Keywords: biopsychosocial model; theory; subjective well-being; societal well-being; mental health; physical health; development

Acknowledgements: This work is supported by funding from the National Heart, Lung, and Blood Institute (K01HL143159).

Conflicts of Interest: I have no conflicts of interest to disclose.

Corresponding Author: Jenalee Doom, Department of Psychology, University of Denver. 2155 S. Race St. Denver, CO 80210. Jena.Doom@du.edu

27

Abstract

28 The original biopsychosocial (BPS) model by Engel, although important for challenging
29 the biomedical model and adding psychological and social factors to the study of health,
30 has long been criticized for being too vague and untestable. The BPS-Pathways model
31 introduced by Karunamuni, Imayama, and Goonetilleke (2020) builds on the original
32 model by making the model more specific and testable. The authors cite research that
33 provides support for individual pathways between biological, psychological, and social
34 variables that influence subjective well-being and physical health. The current
35 commentary discusses three considerations for scientists and practitioners using the
36 model, including 1) expanding the range of outcomes that should be considered within
37 the model to include mental health and societal well-being, 2) considering how certain
38 factors may fall into more than one category (biological, psychological, and/or social),
39 and 3) considering ways that social factors may directly affect biology independent of
40 psychological mediation. Future directions are discussed, which include considering
41 biopsychosocial pathways across development, studying individual differences in
42 susceptibility to specific biological, psychological, or social factors, and using rigorous
43 methods such as randomized controlled trials and advanced statistical tools at the
44 biological, psychological, and societal levels to test these pathways and create more
45 effective interventions.

46

47 *Keywords:* biopsychosocial model; theory; subjective well-being; societal well-
48 being; mental health; physical health; development

49

50 **Mapping future directions to test biopsychosocial pathways to health and well-**
51 **being**

52

53 **Introduction**

54 The introduction of the biopsychosocial (BPS) model was revolutionary for
55 challenging the prevailing biomedical model when Engel proposed the BPS model in the
56 1970s (Engel, 1977). Engel originally proposed the BPS model to highlight the
57 psychological and social factors that influence health, which were not considered in the
58 biomedical model prominent in medicine at the time. Although the introduction of the
59 BPS model was innovative and led to greater incorporation of social and psychological
60 factors into medicine and health research, many have criticized the model for being too
61 vague and untestable (Benning, 2015; Farre and Rapley, 2017; Ghaemi, 2010). As a
62 result, an update to the BPS model outlining specific pathways linking biological,
63 psychological, and social factors in a specific and testable manner is needed.

64 **Overview**

65 The BPS-Pathways model proposed by Karunamuni, Imayama, and Goonetilleke
66 (Karunamuni et al., 2020) in this issue carefully examines the interrelationships among
67 factors across 3 domains—biological, psychological, and social—to understand how
68 these factors contribute to health and well-being. The purpose of the model is to better
69 delineate these pathways between biological (B), psychological (P), and social (S)
70 factors in order to make more specific and testable predictions than Engel’s original
71 BPS model (Engel, 1977; Karunamuni et al., 2020). The authors present causal
72 evidence, consider epidemiological criteria, and use analytical reasoning to examine

73 each of the pathways in the model ($B \rightarrow P$ [i.e., biological factors to psychological factors
74 pathway], $B \rightarrow S$, $P \rightarrow S$, $P \rightarrow B$, $S \rightarrow B$, $S \rightarrow P$). In the literature, there are fewer studies
75 focusing on some pathways than others. For example, there are many experimental
76 studies demonstrating that changes in psychological factors cause biological changes in
77 the brain, immune system, and epigenetics. There are fewer studies examining direct
78 biological to social changes, for example, health conditions influencing social factors
79 such as social norms or stigma. Karunamuni et al. (2020) effectively highlight the
80 limitations and challenges of using the BPS-Pathways model and some future directions
81 for using the model.

82 Biological, psychological, and social factors interact in this model to predict
83 subjective well-being and physical health. However, subjective well-being and physical
84 health can also influence each other as well as influence biological, psychological, and
85 social factors in the BPS-Pathways model. Importantly, there is no set of factors
86 (biological, psychological, or social) that has greater importance in the model than
87 others. Rather, the strength of associations between individual factors across biological
88 psychological, and social domains can be investigated individually. As a result,
89 biological factors are not prioritized over psychological factors, for example. Clinicians
90 and health practitioners can instead consider the range of biological, psychological, and
91 social factors that may be influencing health and well-being. Based on the patient or
92 client's particular circumstances, there may be factors with well-researched, robust
93 influences on health that may guide clinicians to focus on that particular factor to most
94 effectively improve health and well-being. The BPS-Pathways model uses analytical
95 reasoning and considers causal evidence to present links between BPS factors while

96 the original biopsychosocial model separately considered how biological, psychological,
97 and social factors were associated with health. The BPS-Pathways model carefully
98 considers subjective experiences, or psychological factors, which is particularly
99 important for understanding individual differences in response to factors. For example, a
100 social factor such as a surprising life event may be interpreted positively by some,
101 resulting in positive affect and excitement, while others may react to a surprise with fear
102 and anxiety, thus leading to different behavioral (S→P pathway) and biological
103 responses (S→B pathway mediated by psychological factors, as described in the BPS-
104 Pathways model). Similarly, high levels of biological arousal may be interpreted
105 positively by some, leading to more positive affect, but may be interpreted negatively by
106 others as anxiety, leading to more negative affect (B→P pathway). The BPS-Pathways
107 model stresses the importance of psychological interpretations of biological,
108 psychological, and social factors.

109 I argue that the BPS-Pathways model answers the need for a more specific and
110 testable model for understanding pathways between biological, psychological, and
111 social factors. I further argue that researchers and clinicians who want to better
112 understand and test these biological, psychological, and social pathways should
113 consider using the BPS-Pathways model due to its improvement upon previous models
114 in specificity, testability, and attention to how subjective experiences may change
115 pathways in the model. The goals of this commentary are to 1) outline additional
116 considerations for those looking to use the BPS-Pathways model in their own work, and
117 2) to present promising future research directions while using the model.

118 **Considerations for the BPS-Pathways model**

119 The BPS-Pathways model improves upon the main critiques of Engel's
120 biopsychosocial model by making the model more specific and testable and providing
121 specific examples of BPS factors that are associated with one another. Considerations
122 for scientists and practitioners using the model include: 1) expanding the range of
123 outcomes that should be considered within the model beyond subjective well-being and
124 physical health, 2) considering how certain factors may fall into more than one category
125 (biological, psychological, and/or social), and 3) considering ways that social factors
126 may directly affect biology independent of psychological mediation. These
127 considerations are discussed below.

128 First, the paper by Karunamuni and colleagues (2020) focuses on the outcome of
129 subjective well-being, which is predicted by biological, psychological, and social factors
130 in the model, though there is a secondary focus on physical health as an outcome in the
131 model. Subjective well-being was chosen as the primary outcome because Engel's
132 model emphasizes the importance of considering an individual's subjective experience
133 within their life context. Subjective well-being is dynamic over time due to changing
134 conditions. Subjective well-being incorporates mental health measures that are not
135 typically included in physical health outcomes, though subjective well-being and
136 physical health are typically correlated with one another (Cross et al., 2018). Subjective
137 well-being as an outcome is situated within the psychological domain in the BPS-
138 Pathways model. Although subjective well-being is an umbrella term that incorporates
139 aspects of mental health including negative and positive affect, life satisfaction and
140 eudaimonic well-being, it would be informative to use the model to test aspects of
141 mental health that do not fall under the umbrella of subjective well-being. Subjective

142 well-being inherently depends on one's own self-rated assessments, which do not
143 always align with one's functioning. For example, some individuals with psychological
144 disorders such as personality disorders or those experiencing a manic episode do not
145 report any issues with affect, life satisfaction, or well-being even though they are
146 experiencing significant disruptions in functioning (Berk et al., 2007; Hart et al., 2018).
147 Some individuals with anorexia nervosa may be dangerously underweight yet still do not
148 acknowledge they have a problem nor report deficits in subjective well-being
149 (Gregertsen et al., 2017). Another example is an individual with a substance use
150 disorder or gambling disorder who does not report that their addiction interferes with
151 their subjective well-being yet may have significant problems with functioning (el-
152 Guebaly et al., 2012). As a result, though subjective well-being does significantly
153 overlap with mental health, there are aspects of mental health that are distinct from
154 subjective well-being. I argue that the model will be useful to researchers studying
155 psychological disorders that do not result in deficits in subjective well-being as
156 outcomes. Considering these outcomes will broaden the clinical utility of the model,
157 guiding researchers testing the biological and social inputs to subjective well-being,
158 psychological functioning, and mental health. In this way, the model will be especially
159 useful to researchers and practitioners in psychiatry, clinical psychology, and counseling
160 psychology.

161 Physical health is within the biological domain though it is affected by
162 psychological and social factors. As Karunamuni and colleagues (2020) suggest, it will
163 be important for those testing the BPS-Pathways model to break physical health down
164 into components. For example, researchers may separately examine cardiovascular

165 health, nutrition status, neurological health, and dental health to consider how factors
166 may differentially affect various aspects of physical health. For example, high perceived
167 discrimination may be detrimental to cardiovascular health (Lockwood et al., 2018),
168 though associations with dental health may not be as strong. Understanding how BPS
169 pathways differentially affect various aspects of physical health, and what factors affect
170 the strength and direction of these paths across individuals will be important to consider.

171 Social factors such as social policies and social circumstances are considered in
172 the model, though there are no society-level outcomes mentioned. *Societal well-being*
173 (Allin, 2007), including measures such as life expectancy, rates of health problems,
174 social welfare, gross domestic product (GDP), and rates of unemployment, poverty, and
175 homelessness, may be influenced by biological, psychological, and social factors.
176 Societal well-being should be considered as a social outcome for this model, though it is
177 likely more difficult to test associations between biopsychosocial factors and societal
178 well-being than for individuals' subjective well-being, mental health, and physical health.
179 Similar to physical health, different aspects of societal well-being (e.g., life expectancy,
180 poverty, unemployment) may be differentially affected by BPS factors. For example, a
181 country may have high life expectancy while also having a low GDP just as an individual
182 could have good neurological health but poor cardiovascular health. It will be important
183 to better understand these outcomes by considering the individual components that
184 make up health and well-being. Biological, psychological, and social factors all
185 contribute to societal well-being, and developing a completer understanding which of
186 these pathways may lead to the largest improvements in societal well-being will be
187 important for researchers and policymakers. Examining societal well-being as an

188 outcome in the social factors system will make this model useful for guiding research in
189 sociology, economics, political science, and other social sciences where society-level
190 factors are targeted as outcomes. As subjective and societal well-being, and physical
191 and mental health, are intertwined, it will be fruitful to investigate factors that robustly
192 predict all four of these outcomes so that we can target these factors in interventions to
193 produce more favorable outcomes. Figure 1 provides an expanded model adapted from
194 Karunamuni et al. (2020) that examines subjective and societal well-being and mental
195 and physical health as outcomes.

196 Second, given the complexity of human behavior and health, it is unsurprising
197 that certain factors may be difficult to categorize as solely biological, psychological, or
198 social. Karunamuni and colleagues (2020) list the accurate classification of factors as
199 biological, psychological, or social as one of the challenges of using the model. Certain
200 social factors are identified as being particularly challenging to classify. The accurate
201 classification of BPS factors is a challenge for researchers using a BPS framework. An
202 example of a challenging factor to categorize is behavior. Behavior is categorized as a
203 psychological variable in the BPS-Pathways model as it is certainly heavily influenced
204 by cognition, emotion, and other psychological factors at the individual level. However,
205 there are strong biological and social components of behavior that make it challenging
206 to only classify behavior as a psychological factor. For example, a reflex is a behavior
207 that is an automatic response to a stimulus that occurs without conscious thought. In
208 this instance, behavior can be classified as a biological factor when it occurs without
209 conscious processing or moderation by psychological factors. In the case of addiction,
210 strong biological impulses may override psychological factors to give rise to drug-

211 seeking behaviors even at the risk of negative future consequences (Volkow and Li,
212 2004). There may be different points during the stages of substance use disorders
213 where psychological or social factors have stronger influences on behavior. At more
214 advanced stages of the disorder, strong biological influences such as brain alterations
215 due to long-term drug use (Gould, 2010) or compulsions (Lüscher et al., 2020) may
216 override psychological or social influences on behavior. The BPS-Pathways model can
217 be used guide research on substance use disorders where there are strong biological,
218 psychological, and social influences on behavior. For example, psychological strategies
219 or mindfulness-based interventions may be used to change cognitive, affective, and
220 psychophysiological processes that could reduce craving for substances and produce
221 changes in the brain that may lead to lower substance use (Garland and Howard,
222 2018).

223 Poverty is another complex factor that has biological, psychological, and social
224 components, which is considered by Karunamuni and colleagues (2020) in the context
225 of the BPS-Pathways model. Social factors include both social circumstances and
226 sociocultural influences (Karunamuni et al., 2020), and as a result, poverty can broadly
227 be thought of as a social factor that can influence one's daily experiences, resources,
228 life circumstances, neighborhood, and community. However, poverty has multiple
229 components, and all of these components may not clearly fall into the category of a
230 social factor. As Karunamuni and colleagues state, poverty may be understood as both
231 *material deprivation*, which can affect physical health through B→B pathways, and as a
232 *social circumstance* that affects health through mediation by psychological factors
233 (S→P→B pathway). In addition, poverty can be measured in terms of *absolute poverty*

234 or *relative poverty* (one's level of poverty compared to others in the community). Greater
235 income inequality in a society (social factor) may contribute to lower *subjective*
236 *socioeconomic status* by individuals (psychological factor), which is one's perception of
237 their socioeconomic standing relative to others (Murali and Oyebode, 2004). The
238 perception of lower socioeconomic status relative to others may lead to greater
239 perceived stress and negative emotions (psychological factors), which can lead to
240 deleterious mental and physical health outcomes over time (Evans and English, 2002;
241 Evans and Kim, 2007). Subjective socioeconomic status may differ from objective
242 measures of poverty or socioeconomic status and uniquely contribute to health (Adler et
243 al., 2000), demonstrating the importance of considering the psychological perception of
244 socioeconomic status as an additional component of poverty. In addition, poverty as a
245 social circumstance may determine what type of neighborhood an individual lives in. If
246 poverty makes an individual more likely to live in an unsafe neighborhood or a
247 neighborhood with a lack of resources (social factors), that individual may experience
248 negative influences on their physical health through poor nutrition, lack of exercise, or
249 injury (biological factors). Individuals living in unsafe or low-resource neighborhoods
250 may have greater perceptions of threat or hopelessness (psychological factors)
251 (Bolland, 2003; Farver et al., 2000), which can in turn affect subjective well-being,
252 mental health, and physical health.

253 Additionally, the factors of sex and gender are closely intertwined (Hyde et al.,
254 2019) and can have biological, psychological, and social meaning. Sex may have
255 important implications for biological and brain development (McEwen and Milner, 2017).
256 Gender may be thought of as a psychological construct as it includes an individual's

257 gender identity, though there are biological inputs to gender identity (Polderman et al.,
258 2018) and social implications if others interact with an individual in a gender-dependent
259 manner (Dedovic et al., 2009; Fagot et al., 2012). As a result, scientists and
260 practitioners using the BPS-Pathways model will have to consider whether factors fit
261 neatly within one category or if the factor may fit within multiple categories. These
262 considerations do not invalidate the model. Instead, the classification of factors should
263 be carefully thought through when using this interdisciplinary model to plan future
264 studies, analyses, and interventions in order to properly consider all BPS pathways that
265 may be affecting outcomes.

266 Third, Karunamuni and colleagues (2020) assume that social factors (e.g., life
267 events, social circumstances) are largely—but not solely—mediated through
268 psychological factors such as perceived stress or negative affect. However, when
269 designing research studies or public policies, researchers and policymakers must
270 consider the direct pathways by which social factors might impact biological factors,
271 such as living in a social environment or neighborhood where one is exposed to toxins
272 that directly affect the brain (direct S → B path), which does not require psychological
273 factors such as cognitive appraisal to operate. A recent example is the Flint water crisis
274 where families in Flint, Michigan have been affected by high lead levels in the water for
275 the past several years, which is associated with higher blood lead levels in children
276 (Hanna-Attisha et al., 2016), a known predictor of cognitive and behavioral problems
277 (Kordas, 2010). In this instance, the social environment—living in neighborhoods with
278 high lead levels, which are typically more socioeconomically disadvantaged (Hanna-
279 Attisha et al., 2016)—directly affects biology without a psychological mediator. A social

280 policy that could theoretically be implemented to reduce lead in water in a community is
281 an example of a social factor that would directly affect a biological factor (lead levels in
282 the body) without needing to affect psychological processes to produce change. It is still
283 possible that the social policy may change psychological factors that further influence
284 biology through an indirect pathway, but it is important to acknowledge both the direct
285 and indirect pathways by which social factors influence biology. Likewise, living in
286 certain neighborhoods may affect access to food (e.g., food deserts), which then directly
287 affect nutrition, brain development, and health. Social factors such as neighborhood
288 location and prevalence of community violence may also directly impact whether an
289 individual is injured (a biological factor), which is another way that social factors may
290 directly impact biology. Although individuals across the SES gradient can experience
291 injury or toxic exposures, individuals in low SES neighborhoods are the most likely to
292 experience these biological factors (Evans, 2004). Psychological mediators such as
293 cognitive interpretations of threat, deprivation, or unpredictability from living in low-
294 resource neighborhoods may lead to higher levels of stress, which could also affect
295 biology, so there are likely both direct and indirect pathways by which social factors
296 affect biology.

297 As Karunamuni et al. (2020) suggest, it will also be important to understand
298 placebo and nocebo effects that may change the effects of a factor. An example of a
299 nocebo is knowing one has been exposed to a toxin versus not knowing. Similarly, an
300 example of a placebo is receiving an intervention to mitigate exposure to a toxin while
301 being told it is an effective intervention versus receiving an intervention but being given
302 no information on its effectiveness to better understand P→B pathways. Expectations

303 about side effects of a toxin or of better outcomes following successful mitigation of a
304 toxin could change cognitive, affective, and neurobiological pathways, which then
305 influence outcomes (e.g., Webster et al., 2016). Comparing outcomes across placebo
306 and nocebo conditions will allow us to better understand $S \rightarrow B$, $P \rightarrow B$, and $S \rightarrow P \rightarrow B$
307 effects. Future research should test what portion of social influences on biology
308 operates directly or indirectly through psychological factors in order to understand which
309 factors are most important to change in the context of interventions.

310 **Future directions**

311 Karunamuni and colleagues (2020) reviewed causal evidence to support direct
312 associations between BPS factors in the model, though future research using
313 experimental or randomized controlled trial (RCT) designs to test paths in this model are
314 needed. Conducting experimental research is often more difficult in humans than in
315 animals and introduces unique ethical considerations that can prevent experimentation.
316 As a result, correlational studies are often used for research in humans. Some of these
317 correlational studies are longitudinal, allowing us to test directionality of paths over time.
318 A growing number of these studies are in large, nationally representative cohorts
319 followed over years that measure biological, psychological, and social factors. Two
320 examples of such cohorts, each of which have publicly available data, are the National
321 Longitudinal Study of Adolescent to Adult Health (Harris, 2013) and the Fragile Families
322 and Child Wellbeing Study (Reichman et al., 2001). However, the strongest evidence for
323 causal effects require large RCTs, which are notoriously difficult to conduct and often
324 introduce special ethical concerns. RCTs allow us to isolate factors that may cause
325 changes in BPS pathways over time. It is important to note that not all variables can be

326 experimentally manipulated in humans (e.g., death of a loved one, maltreatment), and
327 as a result, rigorous non-experimental study designs are needed to isolate the impact of
328 the BPS factor of interest. Two examples of ongoing projects using RCT designs in
329 humans to test causal BPS pathways (e.g., $S \rightarrow B$, $S \rightarrow P$, $P \rightarrow B$, $S \rightarrow P \rightarrow B$) are 1) a
330 poverty reduction RCT in families with young children to test whether changing
331 socioeconomic factors improves child brain, biological, and psychological development
332 ($S \rightarrow B$ and $S \rightarrow P$ pathways) (Noble, 2017; Rojas et al., 2020), and 2) a RCT testing
333 whether reducing prenatal maternal depression improves infant mental health and brain
334 development ($P \rightarrow B$ and $P \rightarrow P$ pathways) (Davis et al., 2018). In the first example of the
335 unconditional cash transfer RCT for low-income mothers, researchers can test whether
336 increasing family socioeconomic status through cash transfers improves childhood
337 cognitive function ($S \rightarrow P$), leads to more optimal brain development ($S \rightarrow B$), and
338 improves physical health ($S \rightarrow B$). Due to the longitudinal nature of the work, researchers
339 will also be able to test whether these effects operate through reducing maternal
340 financial stress ($S \rightarrow P$), improving the quality of maternal caregiving behaviors ($S \rightarrow P$),
341 improving child nutrition ($S \rightarrow B$), increasing access to healthcare ($S \rightarrow S$), or reducing
342 toxin exposure by improving living conditions ($S \rightarrow B$). In the second example of the
343 prenatal maternal depression RCT, researchers can test how reducing prenatal
344 maternal depressive symptoms improves child cognition and emotionality ($P \rightarrow P$), leads
345 to more optimal brain development ($P \rightarrow B$), and improves offspring physical health
346 ($P \rightarrow B$). Researchers can test whether reducing prenatal maternal depressive symptoms
347 improves child outcomes through improving the prenatal environment ($P \rightarrow B$) or through

348 improving maternal caregiving behaviors due to continued reductions in postnatal
349 depressive symptoms (P→P).

350 More research using rigorous designs will allow us to test the BPS model and
351 test causality between biological, psychological, and social factors in humans. To
352 understand how social factors influence psychological and biological factors, these tests
353 should involve removing factors hypothesized to cause harm or adding factors
354 hypothesized to improve health. This rigorous evidence is likely to have the biggest
355 impact on policy and interventions by experimentally manipulating biological,
356 psychological, and social factors in humans to improve health. For example, finding that
357 a simple poverty reduction RCT positively impacts child development in a cost-effective
358 manner (Noble, 2017) will provide some of the strongest evidence to date that
359 improving social factors (e.g., socioeconomic status) leads to positive changes in
360 psychological and biological factors. These designs will also allow for testing the
361 strength of specific pathways to compare which mediating factors may have greater
362 influence on health and well-being. Results from these studies can be used to guide
363 interventions by identifying BPS factors and both direct and indirect BPS pathways that
364 can be targeted in interventions to create the most positive change. These studies will
365 also be helpful in ruling out alternative explanations for outcomes and identifying who
366 may be most likely to benefit from interventions. Thus, studies with RCT designs should
367 be used to test the BPS-Pathways model to better understand the pathways by which
368 BPS factors influence health and well-being, and produce policy-relevant research
369 findings.

370 Longitudinal structural equation modeling (SEM) is another method that should
371 be used to assess pathways from BPS predictors to mediators and to outcome
372 variables over time while controlling for potential confounding variables. Another
373 promising option is to combine RCT and SEM methodology by using longitudinal SEM
374 to examine changes in BPS pathways following an RCT to allow us to understand both
375 causality and the direction of BPS pathways over time. Other favorable options for
376 testing the BPS-Pathways model include simulation modeling and N-of-1 trials for
377 understanding health and behavior of individuals (Vieira et al., 2017). Different scientific
378 fields use differing methods depending on their research questions and various
379 constraints, such as the impossibility of using RCTs to manipulate certain factors,
380 including abuse, divorce, or other life events. These considerations are important when
381 evaluating specific BPS pathways.

382 Individual differences in susceptibility to specific biological, psychological, or
383 social factors must also be considered (Boyce and Ellis, 2005; Ellis et al., 2011).
384 Individual differences could arise from a number of genetic, psychological, or social
385 factors. Further, interactions between factors may influence the strength of paths in the
386 model, so it is important to look beyond main effects. Karunamuni et al. (2020) discuss
387 the moderation of BPS pathways by psychological factors including subjective
388 experience and an individual's likes and dislikes, which is an important consideration.
389 Moderation of BPS pathways by both biological and social factors should also be
390 assessed. For example, recent evidence suggests that being born small for gestational
391 age (biological factor), typically thought of as a developmental vulnerability, predicts
392 greater susceptibility to differences in maternal sensitivity (Nichols et al., 2020). Infants

393 born small for gestational age attain lower wealth by age 26 years compared to their
394 appropriate for gestational age peers if they are exposed to low maternal sensitivity.
395 However, small for gestational age children attain higher wealth than their appropriate
396 for gestational age peers if they are exposed to high maternal sensitivity (Nichols et al.,
397 2020). Similarly, increasing evidence suggests that individual differences in
398 neurobiological sensitivity to social context are important factors predicting
399 psychopathology and well-being in adolescents (Guyer, 2020). Brain structure and
400 function may be important biological moderators of social context when predicting
401 psychological outcomes across development (Guyer, 2020), which must be considered
402 in BPS models. Examining only main effects of social contexts or the quality of social
403 interactions may lead to incorrect assumptions about the effect sizes of these variables
404 on our outcomes of interest as a number of biological factors may be moderating these
405 associations. Thus, carefully examining biological and social moderators of BPS
406 pathways will lead to more precise estimates of effect sizes and a better understanding
407 of risk and resilience.

408 Future research using the BPS-Pathways model should consider how the
409 strength of associations between BPS factors may change across development. For
410 example, the role of parents or caregivers likely has different implications for
411 psychological and biological development in infancy than in adulthood, when other
412 social partners may gain in importance for affecting psychological or biological factors.
413 Sensitive periods of development during which BPS factors may have a larger impact
414 on each other—and on health and well-being—than at other times in development
415 should also be considered using the model. For example, the role of nutrition status in

416 predicting lifelong psychological well-being and neurodevelopment is strongest in the
417 prenatal and early postnatal periods when the brain is rapidly developing compared to
418 adulthood when much of brain development is complete (Doom and Georgieff, 2016).
419 Of course, experimental work in children is even more challenging than in adults due to
420 greater ethical concerns, which will make some of the pathways more difficult to test
421 across development. Considering the role of development in the BPS-Pathways model
422 will lead to more precise estimates about the strength and direction of associations over
423 time. This developmental specificity will also inform the timing and type of interventions
424 that should be implemented to improve health and well-being.

425 **Conclusions**

426 Understanding how biological, psychological, and social factors interact across
427 development to influence health and well-being is crucial for creating effective
428 interventions that improve functioning across multiple outcomes. The BPS-Pathways
429 model effectively translates Engel's biopsychosocial model into a model that is more
430 specific, testable, and provides scientific evidence for each of the pathways in the
431 model. Future research using advanced statistical methods and rigorous research
432 designs, including experimentally manipulating biological, psychological, and social
433 factors and measuring changes in mental and physical health, subjective well-being,
434 and societal well-being will be integral for testing this model, informing interventions,
435 and producing policy-relevant results.

436 Research connecting the social sciences and medicine has been greatly
437 influenced by Engel's biopsychosocial model in the past 40 years despite its limitations.
438 The BPS-Pathways model improves upon the foundations of the biopsychosocial model

439 by creating a broad yet testable framework for analyzing associations between
440 biological, psychological, and social factors that influence health and well-being.
441 Although we must consider where complex factors like poverty, behavior, sex, and
442 gender fit into the model, how factors may interact to predict health and well-being, and
443 how paths may change across development, the BPS-Pathways model improves upon
444 the original biopsychosocial model by making it more specific and ultimately testable.
445 Researchers will benefit by using the model to plan future studies and interventions and
446 to guide analyses of existing data. As a result, researchers studying interactions
447 between BPS factors and practitioners working with patients and clients will benefit from
448 using this framework to guide future research and practice.

449

450

451

452

453

454

455

456

457

458

459

460

461

462 References

- 463 Adler, N.E., Epel, E.S., Castellazzo, G., Ickovics, J.R., 2000. Relationship of subjective
464 and objective social status with psychological and physiological functioning:
465 Preliminary data in healthy, White women. *Health Psychol.* 19, 586.
- 466 Allin, P., 2007. Measuring societal wellbeing. *Econ. Labour Mark. Rev.* 1, 46–52.
- 467 Benning, T.B., 2015. Limitations of the biopsychosocial model in psychiatry. *Adv. Med.*
468 *Educ. Pract.* 6, 347.
- 469 Berk, M., Conus, P., Lucas, N., Hallam, K., Malhi, G.S., Dodd, S., Yatham, L.N., Yung,
470 A., McGorry, P., 2007. Setting the stage: from prodrome to treatment resistance
471 in bipolar disorder. *Bipolar Disord.* 9, 671–678.
- 472 Bolland, J.M., 2003. Hopelessness and risk behaviour among adolescents living in high-
473 poverty inner-city neighbourhoods. *J. Adolesc.* 26, 145–158.
- 474 Boyce, W.T., Ellis, B.J., 2005. Biological sensitivity to context: I. An evolutionary–
475 developmental theory of the origins and functions of stress reactivity. *Dev.*
476 *Psychopathol.* 17, 271–301.
- 477 Cross, M.P., Hofschneider, L., Grimm, M., Pressman, S.D., 2018. Subjective well-being
478 and physical health. *Handb. Well-* Salt Lake City UT DEF Publ.
- 479 Davis, E.P., Hankin, B.L., Swales, D.A., Hoffman, M.C., 2018. An experimental test of
480 the fetal programming hypothesis: Can we reduce child ontogenetic vulnerability
481 to psychopathology by decreasing maternal depression? *Dev. Psychopathol.* 30,
482 787–806.
- 483 Dedovic, K., Wadiwalla, M., Engert, V., Pruessner, J.C., 2009. The role of sex and
484 gender socialization in stress reactivity. *Dev. Psychol.* 45, 45.

- 485 Doom, J.R., Georgieff, M.K., 2016. Macronutrient deprivation: Biological mechanisms
486 and effects on early neurodevelopment, in: Hall Moran V, L.N. (Ed.), *Nutrition
487 and the Developing Brain*. CRC Press (Taylor & Francis Group), pp. 21–43.
- 488 el-Guebaly, N., Mudry, T., Zohar, J., Tavares, H., Potenza, M.N., 2012. Compulsive
489 features in behavioural addictions: the case of pathological gambling. *Addiction*
490 107, 1726–1734.
- 491 Ellis, B.J., Boyce, W.T., Belsky, J., Bakermans-Kranenburg, M.J., Van IJzendoorn,
492 M.H., 2011. Differential susceptibility to the environment: An evolutionary–
493 neurodevelopmental theory. *Dev. Psychopathol.* 23, 7–28.
- 494 Engel, G.L., 1977. The need for a new medical model: a challenge for biomedicine.
495 *Science* 196, 129–136.
- 496 Evans, G.W., 2004. The Environment of Childhood Poverty. *Am. Psychol.* 59, 77–92.
497 <https://doi.org/10.1037/0003-066X.59.2.77>
- 498 Evans, G.W., English, K., 2002. The environment of poverty: Multiple stressor exposure,
499 psychophysiological stress, and socioemotional adjustment. *Child Dev* 73, 1238–
500 1248.
- 501 Evans, G.W., Kim, P., 2007. Childhood poverty and health: cumulative risk exposure
502 and stress dysregulation. *Psychol Sci* 18, 953–7. [https://doi.org/10.1111/j.1467-
503 9280.2007.02008.x](https://doi.org/10.1111/j.1467-9280.2007.02008.x)
- 504 Fagot, B.I., Rodgers, C., Leinbach, M.D., 2012. Theories of gender socialization, in: *The
505 Developmental Social Psychology of Gender*. Psychology Press, pp. 79–104.

- 506 Farre, A., Rapley, T., 2017. The new old (and old new) medical model: four decades
507 navigating the biomedical and psychosocial understandings of health and illness,
508 in: Healthcare. Multidisciplinary Digital Publishing Institute, p. 88.
- 509 Farver, J.A.M., Ghosh, C., Garcia, C., 2000. Children's perceptions of their
510 neighborhoods. *J. Appl. Dev. Psychol.* 21, 139–163.
- 511 Garland, E.L., Howard, M.O., 2018. Mindfulness-based treatment of addiction: current
512 state of the field and envisioning the next wave of research. *Addict. Sci. Clin.*
513 *Pract.* 13, 14.
- 514 Ghaemi, S.N., 2010. The rise and fall of the biopsychosocial model: reconciling art and
515 science in psychiatry. JHU Press.
- 516 Gould, T.J., 2010. Addiction and cognition. *Addict. Sci. Clin. Pract.* 5, 4.
- 517 Gregertsen, E.C., Mandy, W., Serpell, L., 2017. The egosyntonic nature of anorexia: an
518 impediment to recovery in anorexia nervosa treatment. *Front. Psychol.* 8, 2273.
- 519 Guyer, A.E., 2020. Adolescent Psychopathology: The Role of Brain-Based Diatheses,
520 Sensitivities, and Susceptibilities. *Child Dev. Perspect.*
- 521 Hanna-Attisha, M., LaChance, J., Sadler, R.C., Champney Schnepf, A., 2016. Elevated
522 blood lead levels in children associated with the Flint drinking water crisis: a
523 spatial analysis of risk and public health response. *Am J Public Health* 106, 283–
524 290.
- 525 Harris, K.M., 2013. The add health study: design and accomplishments. Chap. Hill
526 Carol. Popul. Cent. Univ. N. C. Chap. Hill.

- 527 Hart, W., Tortoriello, G.K., Richardson, K., 2018. Are personality disorder traits ego-
528 syntonic or ego-dystonic? Revisiting the issue by considering functionality. *J.*
529 *Res. Personal.* 76, 124–128.
- 530 Hyde, J.S., Bigler, R.S., Joel, D., Tate, C.C., van Anders, S.M., 2019. The future of sex
531 and gender in psychology: Five challenges to the gender binary. *Am. Psychol.*
532 74, 171.
- 533 Karunamuni, N., Imayama, I., Goonetilleke, D., 2020. Pathways to well-being:
534 Untangling the causal relationships among biopsychosocial variables. *Soc. Sci.*
535 *Med.*
- 536 Kordas, K., 2010. Iron, lead, and children's behavior and cognition. *Annu. Rev. Nutr.* 30,
537 123–148.
- 538 Lockwood, K.G., Marsland, A.L., Matthews, K.A., Gianaros, P.J., 2018. Perceived
539 discrimination and cardiovascular health disparities: a multisystem review and
540 health neuroscience perspective. *Ann. N. Y. Acad. Sci.* 1428, 170–207.
- 541 Lüscher, C., Robbins, T.W., Everitt, B.J., 2020. The transition to compulsion in
542 addiction. *Nat. Rev. Neurosci.* 1–17.
- 543 McEwen, B.S., Milner, T.A., 2017. Understanding the broad influence of sex hormones
544 and sex differences in the brain. *J. Neurosci. Res.* 95, 24–39.
- 545 Murali, V., Oyebode, F., 2004. Poverty, social inequality and mental health. *Adv.*
546 *Psychiatr. Treat.* 10, 216–224.
- 547 Nichols, T., Jaekel, J., Bartmann, P., Wolke, D., 2020. Differential susceptibility effects
548 of maternal sensitivity in childhood on small for gestational age adults' wealth.
549 *Dev. Psychopathol.* 32, 197–203.

- 550 Noble, K.G., 2017. Brain trust. *Sci. Am.* 316, 44–49.
- 551 Polderman, T.J., Kreukels, B.P., Irwig, M.S., Beach, L., Chan, Y.-M., Derks, E.M.,
552 Esteva, I., Ehrenfeld, J., Den Heijer, M., Posthuma, D., 2018. The biological
553 contributions to gender identity and gender diversity: Bringing data to the table.
554 *Behav. Genet.* 48, 95–108.
- 555 Reichman, N.E., Teitler, J.O., Garfinkel, I., McLanahan, S.S., 2001. Fragile families:
556 Sample and design. *Child. Youth Serv. Rev.* 23, 303–326.
- 557 Rojas, N.M., Yoshikawa, H., Gennetian, L., Lemus Rangel, M., Melvin, S., Noble, K.,
558 Duncan, G., Magunson, K., 2020. Exploring the experiences and dynamics of an
559 unconditional cash transfer for low-income mothers: A mixed-methods study. *J.*
560 *Child. Poverty* 1–21.
- 561 Vieira, R., McDonald, S., Araújo-Soares, V., Sniehotta, F.F., Henderson, R., 2017.
562 Dynamic modelling of n-of-1 data: powerful and flexible data analytics applied to
563 individualised studies. *Health Psychol. Rev.* 11, 222–234.
- 564 Volkow, N.D., Li, T.-K., 2004. Drug addiction: the neurobiology of behaviour gone awry.
565 *Nat. Rev. Neurosci.* 5, 963.
- 566 Webster, R.K., Weinman, J., Rubin, G.J., 2016. A systematic review of factors that
567 contribute to placebo effects. *Health Psychol.* 35, 1334.

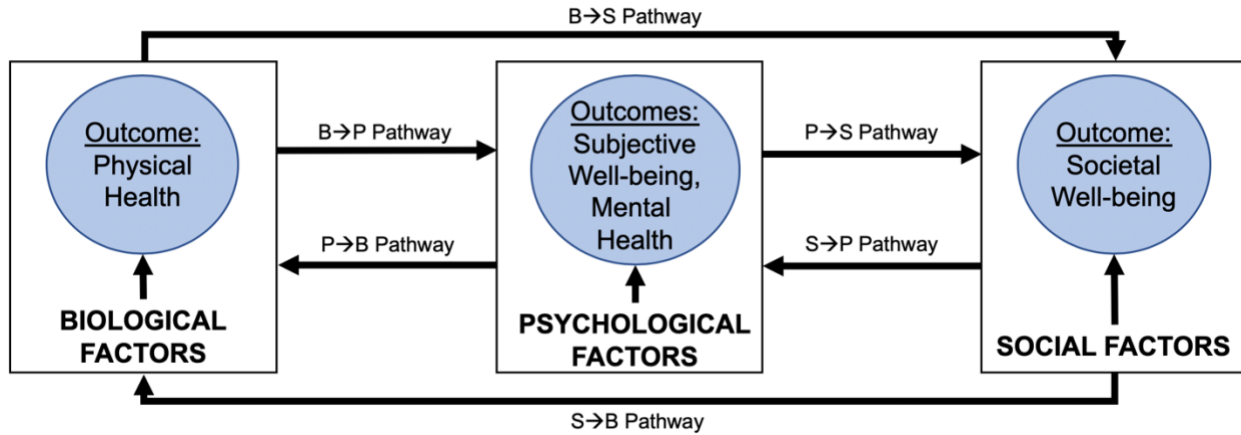
568

569

570

571

572



573

574 Figure 1. The BPS-Pathways model expanded to outcomes in the biological (physical

575 health), psychological (mental health), and social domains (societal well-being).

576 Biological, psychological, and social factors may interact to influence each of these

577 outcomes. Adapted from Karunamuni, Imayama, and Goonetilleke (2020).