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**Advanced Therapy in Traumatic Brain Injury Inpatient Rehabilitation: Effects on
Outcomes During the First Year after Discharge**

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Key words

Brain injuries, traumatic; Rehabilitation; Outcome assessment (health care); Physical therapy; Occupational therapy; Speech therapy; Recreation therapy; Propensity score

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1 **Advanced Therapy in Traumatic Brain Injury Inpatient Rehabilitation: Effects on**
2 **Outcomes During the First Year after Discharge**

3 **Abstract**
4

5 *Objective:* To use causal inference methods to determine if receipt of a greater proportion
6 inpatient rehabilitation treatment focused on higher level functions, e.g. executive functions,
7 ambulating over uneven surfaces (Advanced Therapy, AdvTx) results in better rehabilitation
8 outcomes.

9 *Design:* A cohort study using propensity score methods applied to the TBI-Practice-Based
10 Evidence (TBI-PBE) database, a database consisting of multi-site, prospective, longitudinal
11 observational data.

12 *Setting:* Acute inpatient rehabilitation (IRF).

13 *Participants:* Patients enrolled in the TBI-PBE study (n=1843), aged 14 years or older, who
14 sustained a severe, moderate, or complicated mild TBI, receiving their first IRF admission to one
15 of 9 sites in the US, and consented to follow-up 3 and 9 months post discharge from inpatient
16 rehabilitation.

17 *Interventions:* Not applicable.

18 *Main Outcome Measures:* Participation Assessment with Recombined Tools-Objective-17,
19 FIMTM Motor and Cognitive scores, Satisfaction with Life Scale, and Patient Health
20 Questionnaire-9.

21 *Results:* Controlling for measured potential confounders, increasing the percentage of AdvTx
22 during inpatient TBI rehabilitation was found to be associated with better community
23 participation, functional independence, life satisfaction, and decreased likelihood of depression
24 during the year following discharge from inpatient rehabilitation. Participants who began

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25 rehabilitation with greater disability experienced larger gains on some outcomes than those who
26 began rehabilitation with more intact abilities.

27 *Conclusions:* Increasing the proportion of treatment targeting higher level functions appears to
28 have no detrimental and a small, beneficial effect on outcome. Caution should be exercised when
29 inferring causality given that a large number of potential confounders could not be completely
30 controlled with propensity score methods. Further, the extent to which unmeasured confounders
31 influenced the findings is not known and could be of particular concern due to the potential for
32 the patient's recovery trajectory to influence therapists' decisions to provide a greater amount
33 AdvTx.

34

35 Abbreviations:

36 AdvTx	Advanced Therapy
37 ASD	Absolute standardized difference
38 CSI	Comprehensive Severity Index
39 FIM	Functional Independence Measure
40 HTE	Heterogeneity of treatment effect
41 IPW	Inverse probability weighting
42 OT	Occupational therapy
43 PART-O	Participation Assessment with Recombined Tools-Objective
44 PHQ-9	Patient Health Questionnaire-9
45 POC	Point of care
46 PSM	Propensity score methodology
47 PT	Physical therapy

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48	RCT	Randomized controlled trial
49	SDC	Supplemental digital content
50	ST	Speech therapy
51	SWLS	Satisfaction with Life Scale
52	TBI	Traumatic brain injury
53	TBI-PBE	Traumatic brain injury Practice Based Evidence study
54	TR	Therapeutic recreation

55

56 Conventional rehabilitation theories are based on the assumption that a hierarchical sequence of
57 recovery steps must be followed to restore normal function, and challenging patients too quickly
58 or encouraging compensatory strategies too early is seen as a wasted effort, if not potentially
59 counterproductive.¹⁻³ These “bottom-up” approaches, including neurodevelopmental treatment
60 (e.g. the Bobath approach¹) in motor rehabilitation and restorative techniques in cognitive
61 rehabilitation⁴, assume underlying component skills or functions must first be restored before
62 more complex functions can be addressed successfully. However, recent perspectives reflect an
63 evolution of ideas that recognize the dynamic system’s complexities and inter-relationships
64 between functional abilities, neuroplasticity, and psychological factors, such as engagement and
65 motivation. For instance, Winstein and Kay⁵ posit that effective rehabilitation must engage and
66 empower the individual, and to do so requires the active ingredients to be: 1) challenging; 2)
67 progressively increasing in level of difficulty; and 3) intrinsically motivating and engaging.
68 Likewise, recent recommendations in cognitive rehabilitation take a pragmatic perspective,
69 introducing compensatory strategies earlier rather than later and thereby allowing the individual

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70 to engage in more advanced activities, even if some of the underlying functions have not been
71 restored.⁶

72

73 These differing perspectives continue to co-exist in the literature.⁷⁻¹⁰ Unfortunately, there is a
74 dearth of empirical evidence to guide a clinician's decision-making as to when to provide
75 challenging interventions, compensatory activities, and metacognitive strategies in TBI inpatient
76 rehabilitation. The evidence that does exist is based on applications in alternative settings and
77 with different levels of acuity. For example, a recent meta-analysis supported the initiation of
78 intensive rehabilitation in the ICU to improve outcomes following severe traumatic brain injury
79 (TBI).⁸ However, the therapeutic activities studied targeted lower level functions, such as
80 following commands and increasing awareness of the environment. At the other end of the
81 continuum, compensatory and metacognitive strategies have been found effective for improving
82 executive functioning, however most studies have been conducted in outpatient settings with
83 patients many months post-injury.⁷ The effect of introducing strategy training in the more acute
84 stages of rehabilitation has received minimal investigation.

85

86 Recent findings from studies of stroke rehabilitation support the use of therapeutic interventions
87 that target functions at a substantially higher level than the patient's current level of ability.⁹
88 Practice-based evidence studies with patients who had a stroke have found that therapy that
89 challenges patients with severe impairments, such as therapies targeting advanced gait
90 (negotiating uneven surfaces), home management, and problem-solving, were associated with
91 better outcomes than therapies targeting lower level functions such as bed mobility.^{11,12} The

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92 authors of these studies conclude from these findings that a “leap-frog” approach that introduces
93 challenge earlier rather than later is necessary for neuroplasticity and effective rehabilitation.

94

95 The TBI Practice-Based Evidence (PBE) study yielded findings similar to those found for the
96 stroke population.¹³⁻¹⁵ Differences in difficulty levels of therapy activities during inpatient
97 rehabilitation added substantial variance to the prediction of TBI outcomes at rehabilitation
98 discharge, with some of the most beneficial activities targeting relatively more advanced
99 functions. Participants with the greatest cognitive impairments were among those who appeared
100 to benefit most.

101

102 The purpose of the current study is to extend the previous studies by evaluating the effects of
103 receiving a greater proportion of Advanced Therapy (AdvTx) using causal inference methods^{16,17}
104 and a multidisciplinary treatment classification system of AdvTx. The amount of AdvTx was
105 determined by therapist discretion, environment, and other factors. For cognitive abilities, the
106 targets of AdvTx were higher-level executive functions and the independent use of compensatory
107 strategies with complex tasks. For physical abilities, the targets included capacity to manage
108 unintended perturbation and skilled learning. The management of challenges within a changing
109 environment, including distractions and physical barriers, were included in this definition. The
110 functions targeted by rehabilitation fall along a continuum from more basic to the most
111 advanced; for the purposes of this study we included functions and abilities at the extreme end of
112 the continuum to ensure that the interventions are challenging for all patients, even those who
113 presented with less severe disability at admission to rehabilitation.

114

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115 The current study then evaluates the effects of the ‘dose’ of AdvTx relative to non-advanced.
116 We hypothesized that when a greater proportion of therapists’ time is spent providing AdvTx,
117 patients achieve better outcomes. We also hypothesized that patients who presented to
118 rehabilitation with the greatest amount of disability, and who were therefore most challenged by
119 the AdvTx, would experience greater benefit from a higher proportion of AdvTx than those who
120 presented with less severe disability.

121

122 **METHODS**

123 *Participants.* The Participant Flow Diagram for this cohort study can be found in supplemental
124 digital content (SDC). A cohort of 1843 participants was drawn from the TBI-PBE Database
125 (n=2120).¹⁴ The criteria for inclusion in the current analysis were that the participant received
126 their first course of rehabilitation for complicated mild, moderate, or severe TBI from one of 9
127 US sites during the recruitment and data collection period (2008-2011), consented to follow-up,
128 received therapy after the initial assessment period (first 3 days of admission to rehabilitation)
129 and was age 14 years or older. Institutional review board approval was obtained by the sites that
130 participated in the original TBI-PBE study.

131

132 For the purposes of evaluating heterogeneity of treatment effects (HTE) the sample was divided
133 into two subgroups. The Severe Group consisted of 820 patients who presented to rehabilitation
134 requiring total or maximal assistance with all self-care needs (operationalized as FIM Motor <
135 28.75 and FIM Cognitive scores \leq 15). The Less Severe Group consisted of the remainder of the
136 sample (n=1023).

137

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138 *Data source for the intervention.* As part of the original TBI-PBE study¹⁴, point of care (POC)
139 forms and associated syllabi were developed by discipline-specific committees for occupational
140 therapy, physical therapy, speech therapy, and therapeutic recreation (OT, PT, ST, TR).
141 Therapists recorded the time spent in various treatment activities in each session on POC forms.
142 Data collection quality was supported through a comprehensive quality assurance program.
143
144 As part of the current study, representatives from each discipline reviewed tables of treatment
145 activities. Using the definition of AdvTx provided earlier, they identified those session
146 components that met the definition. In a few instances, where the interpretation of the syllabus
147 text was unclear, therapists outside of the research team were contacted to answer questions as to
148 how they would classify the activity and/or intervention. See SDC for graphics illustrating the
149 classification system.

150 The percentage of total therapy time spent in AdvTx was calculated, with the numerator equaling
151 therapy minutes spent in AdvTx, and the denominator equaling all therapy minutes. The
152 distribution of the proportion of time spent in AdvTx was slightly skewed, with a mean of
153 16.16% (SD=12.14) and median of 14.15%. The analysis compared outcomes of patients who
154 received different proportions of time in AdvTx.
155

156 *Outcomes.* Data on outcomes were collected at discharge and at 3 and 9 months post-discharge.
157 The primary outcome was community participation, as measured by the Participation
158 Assessment with Recombined Tools-Objective (PART-O-17) at 9 months.^{18,19} The PART-O-17
159 includes three subtests: Productivity, Being Out-and-About, and Social Relations. Test-retest
160 reliability has been established²⁰ and studies of validity have focused on dimensionality and

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161 relationships with other measures and constructs.²¹⁻²⁴ In addition to a Total score that reflects the
162 average of the 3 domain scores, an alternative method for calculating a unidimensional
163 participation score has been developed based on Rasch analysis.²⁴ Since the two summary
164 scores characterize the construct slightly differently, both the PART-O Rasch Total score and the
165 original Total score were used in this study, along with the three domain scores.

166
167 Secondary outcomes included: functional independence as measured by the FIMTM Motor and
168 Cognitive Rasch-converted scores²⁵⁻²⁸; life satisfaction as measured by the Satisfaction with Life
169 Scale (SWLS);²⁹ and depression as measured by the Patient Health Questionnaire-9 (PHQ-9).³⁰
170 All of these measures have established reliability and validity for use with persons with TBI.
171 ^{18,21,23,24,31-36} The PHQ-9 was analyzed as a dichotomous variable: likely major depression vs. no
172 major depression.³⁶ When the person with TBI was not able to complete the follow-up, the
173 SWLS and PHQ-9 were not administered and the FIM and PART-O-17 were based on a proxy
174 report.

175
176 *Potential confounders.* Since the purpose of the study was to examine the potential effectiveness
177 of AdvTx, other potential predictors of these outcomes were considered confounders and
178 controlled through propensity score methodology. Data on premorbid history, injury
179 characteristics, and functioning at admission to rehabilitation were abstracted from rehabilitation
180 medical records. Only variables that were unlikely to be influenced by treatment received in
181 inpatient rehabilitation were considered as potential confounders, and therefore only those that
182 were measured prior to treatment or at rehabilitation admission (first 3 days), were included in
183 the propensity score model (admission assessments are conducted during the first 3 days of

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184 rehabilitation¹⁵). In addition to more traditional measures of severity, we used the
185 *Comprehensive Severity Index (CSI®)*^{11,37,38} Brain Injury and Non-Brain Injury scores to
186 represent the complex interactions between physiological and psychological phenomena that
187 contribute to disease.¹⁴ We grouped sites by the typical length of their therapy sessions, with
188 shorter session sites having a mean of .56 hours (SD .06) and longer session sites having a mean
189 of .71 hours (SD .06).

190
191 *Analysis.* Data were analyzed using SAS v9.3^a and STATA version 14.0^b. Potential confounders
192 were controlled using inverse probability weighting (IPW) based on a generalized propensity
193 score. The proportion of AdvTx was allocated evenly across 10 quantiles or bins (5 bins were
194 used when the sample was stratified due to smaller n). A cumulative logistic model was used to
195 estimate the predicted probability of being in each quantile, and inverse probability weights
196 constructed.³⁹ Multiple models were evaluated, including evaluation of interaction terms, until it
197 was determined that the best possible balance was achieved. Participants with extreme weights
198 (>10) or who were dropped from the generalized propensity score models were not included in
199 subsequent analyses (n=17). The average absolute standardized difference (ASD) between all
200 pairs of quantiles was calculated; if the ASD for a potential confounder exceeded .10 (a
201 conservative threshold), the potential confounder was considered not to be sufficiently balanced
202 by the weighting and considered for inclusion in the adjusted models used for the outcome
203 analysis.^{40,41} However, if the number of possible covariates threatened the stability of the model,
204 covariates were also chosen based on a) content knowledge indicating which covariates were
205 most influential and b) the distribution of the covariates (those that had sparse cells were not

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206 included). Since an ASD $< .20$ is often considered sufficient to indicate balance⁴², covariates
207 with ASD $\geq .20$ were of greatest concern.

208

209 The hypothesis that a higher proportion of AdvTx would be associated with better outcomes was
210 evaluated through marginal regression models with robust sandwich error estimates. The first
211 step included only AdvTx in the model; the next step added those confounders that did not meet
212 the criterion for achieving sufficient balance through IPW. We assessed the impact of missing
213 outcome data through the use of multiple imputations to simulate a complete sample, and then
214 comparing results to those obtained with the sample for which the outcome data were complete.
215 Multiple imputation models by chained equations (MICE), with predictive mean matching for
216 continuous outcomes and K-nearest neighbors for categorical variables, included all outcomes,
217 treatments and covariates explored between the treatment exposures and outcomes.

218

219 The extent that severity of initial disability modified the effect of AdvTx was tested with an
220 interaction term (Severity*AdvTx). In addition, we evaluated whether results changed when the
221 Severe and Not Severe subgroups were analyzed as separate strata.

222

223 Results

224 Table 1 lists key covariates describing the sample and the quantile distributions before and after
225 weighting (a table with all 75 covariates appears in SDC). Prior to weighting, ASD ranged from
226 .03-.79, with an average ASD of .17. After weighting, ASD ranged from .05 to .30, with an
227 average ASD of .11; 40 covariates had an average ASD $> .10$. While there was a large number

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228 of covariates with ASD $>.10$, only 3 exceeded $.20$ (FIM Motor, FIM Cognitive, and days from
229 injury to rehabilitation admission) and the maximum average ASD was still relatively low.

230

231 Prior to adjustment for the 40 unbalanced confounders, increasing the proportion of time in
232 AdvTx was found to be associated with better community participation at both 3 and 9 months
233 for the total scores (PART-O Total, PART-O Rasch Total) and most domain scores (PART-O
234 Out-and-About at 9 months, Productivity, and Social Relations at 3 and 9 months). In addition,
235 positive effects were observed for functional independence (FIM Cognitive and Motor) at
236 discharge, 3 and 9 months ($p<.05$, see Table in SDC). Following adjustment for unbalanced
237 covariates, the effects were somewhat attenuated, but more precise. As shown in Table 2,
238 findings remained significant for the PART-O total scores, Productivity at 3 and 9 months, Out-
239 and-About at 9 months, FIM Cognitive and Motor, and estimates became stronger for SWLS (9
240 months only) and PHQ-9 at 3 and 9 months (odds for depression decreased by 3% at each time
241 point). No substantive differences in inference were noted following multiple imputation of
242 outcomes.

243

244 *HTE for initial level of disability.* The interaction term for initial level of disability and
245 proportion of AdvTx was used to assess HTE. Cumulative logistic regression models estimated
246 the generalized propensity scores on the full cohort, with refinement to achieve balance by
247 severity groups across 5 quantiles. Prior to IPW, the mean ASD for the Severe subgroup ranged
248 from $.04$ to $.57$, averaging $.18$; after IPW, the ASD ranged from $.03$ to $.36$, averaging $.14$, with 55
249 covariates having ASD $>.10$ (11 covariates with ASD $\geq .20$). Prior to IPW, for the Less Severe
250 subgroup ASD ranged from $.03$ to $.63$, averaging $.17$. After IPW, the ASD ranged from $.06$ to

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251 .29, averaging .15 with 62 covariates $> .10$ (15 covariates with $ASD \geq .20$). Since the combined
252 number of covariates that did not meet the criterion of $ASD < .10$ was too large to include in the
253 outcome analysis, the covariates were selected based on additional decision parameters (i.e.
254 content knowledge, sparseness of cells).

255

256 Prior to adjustment for unbalanced covariates, the interaction term (Severity*AdvTx) was
257 significant for FIM Cognitive and Motor scores, at all time points. No other outcomes showed
258 significant interaction effects. After adjusting for unbalanced covariates, the effects were
259 somewhat attenuated but remained significant for FIM Cognitive and Motor (Table 3). Those
260 who presented with severe disability at admission appeared to experience more benefit from
261 AdvTx on these two outcome variables, and no significant differences were observed on the
262 other outcome variables.

263

264 We evaluated whether findings changed when the subgroups were analyzed separately. For the
265 Severe group, prior to IPW the ASD ranged from .03 to .51, averaging .17. After IPW the ASD
266 ranged from .05-.30, averaging .13 with 54 covariates with $ASD \geq .10$ (8 with $ASD > .20$). Prior
267 to IPW, ASD for the Less Severe group ranged from .03 to .57, averaging .16. After IPW, it
268 ranged from .03 to .20, averaging .10, with 29 covariates with $ASD > .10$ (1 covariate with ASD
269 $\geq .20$). Using the models adjusted for unbalanced covariates (SDC Table), the Severe subgroup
270 experienced greater benefits from greater proportion of AdvTx than the Less Severe subgroup
271 on: FIM Cognitive and Motor (all time points), and PART-O Rasch Total, and Productivity at 3
272 months. These findings are generally consistent with those found using the interaction term.

273

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274 **Discussion**

275 The current findings suggest therapeutic activities during acute inpatient TBI rehabilitation
276 targeting the highest level functions in the physical and cognitive realms are associated with
277 better community participation, functional independence, life satisfaction, and decreased
278 likelihood of depression during the year following discharge from inpatient rehabilitation.
279 Furthermore, participants who begin rehabilitation with greater disability experience larger gains
280 on some outcomes than those who begin rehabilitation with more intact abilities.

281
282 The current findings are consistent with the previous TBI-PBE studies.^{13 15 43} This consistency
283 implies that the construct (AdvTx continuum) is relatively robust in the context of different
284 operational definitions. The previous studies used a method for classifying treatment that
285 differed from the current operational definition in three key ways: 1) previous studies defined
286 ‘advanced’ activities relative to other activities within a discipline, rather than across disciplines;
287 2) to increase the likelihood that activities chosen as advanced were challenging for everyone,
288 only the most challenging activities were designated as advanced in the current study; and 3) the
289 current study used multiple sources of information from the POC forms (e.g. activities,
290 interventions, targeted functions) while the previous studies only used information on activities.

291
292 Taken together, the findings support the notion that challenging patients to perform functions
293 above their current level can spur recovery. As noted by Winstein and Kay⁵ in their synthesis of
294 the neuroplasticity and stroke rehabilitation literatures, cortical reorganization has been found to
295 be dependent upon active problem-solving, challenges that are progressively more difficult, and
296 engagement of the patient. While the current study design does not allow a direct assessment of

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297 the degree to which the activities were “progressively more difficult” for the individual patient,
298 by definition AdvTx activities involved higher-level problem solving and the ability to adapt to a
299 changing environment. In addition, patients were taught how to use compensatory strategies to
300 perform more complex activities required for community integration, presumably facilitating
301 patient engagement.

302
303 The observed effect sizes were relatively small, though meaningful. For example, using the
304 PART-O Total Rasch-transformed score, increasing the proportion of AdvTx by 20% (e.g. 10%
305 AdvTx to 30%) could increase the number of days out of the house in a week from 1-2 days to
306 5+ days at 9 months post-discharge. During an exercise to evaluate meaningful changes on the
307 outcome measures, consumer stakeholders involved in the project indicated that even smaller
308 changes (e.g. getting out of the house or socializing with friends one more time per week) were
309 important. They noted that a small change in one area can prompt change in other, non-measured
310 areas as well.

311
312 Winstein and Kay’s⁵ recommendation that therapy be “difficult, but not too difficult” should be
313 kept in mind when applying the results of this study. The application of the findings to the
314 practice of rehabilitation will need to take into account patients’ level of functioning and factors
315 that may impede their ability to participate in AdvTx, such as fatigue or pain. The potential risk
316 for patients’ safety will also need to be evaluated. Therapist and environmental factors may also
317 influence the extent to which AdvTx can be consistently delivered across patients, given current
318 demands on therapists to minimize preparation time and to see an increasing number of patients.

319

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320 *Limitations.* Several limitations should be considered in interpreting and applying the study
321 findings. This study may not represent all individuals receiving rehabilitation and only assesses
322 the relationship of Advance Therapy during acute inpatient rehabilitation, not at later time points.
323 We used multiple imputation to assess the impact of missing outcomes on the results; it is
324 possible that the outcomes were not missing at random (as required for multiple imputation).
325
326 Other limitations apply to the use of causal inference methodology rather than an RCT to
327 evaluate treatment effectiveness. Our confidence in the findings is dependent on the extent to
328 which there is evidence to support assumptions. There may have been unmeasured confounders,
329 including for example, unknown reasons for therapists choosing to use AdvTx. In particular, it is
330 possible that patients who showed some initial benefit from AdvTx or who made unexpectedly
331 fast progress were more likely to receive additional AdvTx. While the propensity score
332 methodology controlled for confounders associated with the recovery trajectory, it is notable that
333 the 3 variables that were least balanced by IPW are often strong predictors of rehabilitation
334 outcomes (FIM Motor and Cognitive at admission and days from injury to rehabilitation). Our
335 use of double-adjustment for unbalanced covariates should substantially reduce the influence of
336 these unbalanced confounders.⁴¹ However caution should be exercised in inferring causality.
337 The analysis of heterogeneity of treatment effects requires particular caution in interpretation
338 because the number of unbalanced confounders was substantial and it was not possible to include
339 all in the outcome models.
340
341 While uncontrolled confounding may have inflated effect sizes, the method used for
342 operationalizing AdvTx may have attenuated effect sizes. The categorization of a therapy

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343 segment as Advanced vs. non-Advanced was based on post-hoc sorting of POC entries, not on
344 direct observation of the session. It is quite possible that the particular setting, instructions,
345 feedback, and other ingredients selected by the therapist made a segment AdvTx, but was
346 categorized as non-Advanced because we lacked some of these details on the POC forms. A
347 prospective study with a carefully planned a priori categorization of treatment segments along
348 the non-Advanced to Advanced dimension could result in increased effect sizes.

349

350 **Conclusions**

351 The findings suggest inpatient TBI rehabilitation patients, especially those presenting with the
352 most severe level of disability, may benefit from tasks that target the highest level cognitive and
353 physical functions. These findings are consistent with recent literature indicating that challenging
354 patients in engaging tasks can lead to cortical reorganization and optimized outcomes.

355

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470 **Suppliers**471 ^aSAS v9.3 38 (SAS Institute, Inc., Cary, NC)472 ^bSTATA version 14.0 39 (StataCorp, College Station, TX).

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474 **Figure 1, SDC, Participant Flow Diagram**

475

Table 1. Selected confounding variables: minimum and maximum quantile values, average standardized differences between quantiles before and after inverse probability weighting.

	Prior IPW Minimum	Prior IPW Maximum	Prior IPW ASD	After IPW ASD
DEMOGRAPHICS				
Age at admission mean (SD)	36.6 (16.5)	50.98 (22.59)	0.31	0.12
Sex: Male	66.3%	78.8%	0.11	0.09
Race: White	72.1%	78.8%	0.05	0.10
Race: White Hispanic	3.8%	8.1%	0.07	0.13
Race: Black	13.0%	19.0%	0.04	0.11
Race: Asian, Other or Unknown	2.16	4.89%	0.05	0.06
Education: High School+	65.76%	65.76%	0.11	0.15
Payer: Private insurance, MCO, HMO	33.5%	56.3%	0.19	0.07
Payer: Medicare	6.6%	38.0%	0.31	0.10
Payer: Medicaid	12.0%	22.7%	0.11	0.10
Payer: Self, Other, None	10.6%	25.1%	0.14	0.12
PREMORBID CONDITIONS				
Preinjury Alcohol Misuse	23.5%	49.7%	0.17	0.08
Preinjury Other Drug Use	11.2%	31.2%	0.18	0.11
INJURY AND STATUS AT REHABILITATION ADMISSION				
Cause of Injury: Fall	22.3%	39.7%	0.16	0.08

Cause of Injury: Moving Vehicle Crash	50.8%	65.2%	0.12	0.06
Cause of Injury: Violence	3.9%	8.7%	0.08	0.13
Cause of Injury: Sports and other causes	2.7%	9.2%	0.09	0.12
Shorter session site	46.2%	87.4%	0.38	0.17
Time to Rehabilitation Admission mean days (SD)	16.04 (11.79)	56.25 (64.83)	0.38	0.21
FIM (Rasch) Motor-Admission mean (SD)	14.33 (15.95)	46.71 (9.62)	0.79	0.30
FIM (Rasch) Cognitive- Admission mean (SD)	21.98 (22.49)	46.99 (12.2)	0.51	0.20
Post-traumatic amnesia cleared prior to rehab	13.4%	60.7%	0.38	0.18
GCS: Intubated/Missing	36.6%	58.7%	0.17	0.09
GCS: Mild (13-15)	5.0%	20.8%	0.13	0.08
GCS: Moderate-Severe (3-12)	33.7%	45.4%	0.10	0.08

ASD: Average standardized difference; IPW: Inverse probability weighting; Bold indicates ASD

> .10

Table 2. Adjusted* model for effect of Advanced Therapy, full cohort

Outcome	Time Point	N	Average Difference	Lower 95% CI	Upper 95% CI	p-value
PART-O Total Rasch	3-Month	1442	0.089	0.035	0.142	0.001
PART-O Total Rasch	9-Month	1383	0.130	0.069	0.191	0.000
PART-O Total	3-Month	1602	0.007	0.002	0.012	0.005
PART-O Total	9-Month	1519	0.009	0.005	0.013	0.000
PART-O Out-and-About	3-Month	1604	0.007	-0.001	0.014	0.072
PART-O Out-and-About	9-Month	1523	0.009	0.002	0.015	0.007
PART-O Productivity	3-Month	1609	0.009	0.004	0.013	0.000
PART-O Productivity	9-Month	1526	0.014	0.008	0.020	0.000
PART-O Social Relations	3-Month	1605	0.005	-0.001	0.011	0.073
PART-O Social Relations	9-Month	1520	0.003	-0.002	0.008	0.227
FIM Cognitive Rasch	Discharge	1826	0.153	0.064	0.242	0.001
FIM Cognitive Rasch	3-Month	1526	0.163	0.040	0.285	0.010
FIM Cognitive Rasch	9-Month	1428	0.256	0.148	0.364	0.000
FIM Motor Rasch	Discharge	1826	0.299	0.238	0.359	0.000
FIM Motor Rasch	3-Month	1512	0.313	0.209	0.416	0.000
FIM Motor Rasch	9-Month	1409	0.347	0.247	0.446	0.000
Satisfaction With Life	3-Month	1200	0.058	-0.021	0.137	0.148
Satisfaction With Life	9-Month	1218	0.074	0.001	0.148	0.048
PHQ-9 ^	3-Month	946	0.967	0.946	0.989	0.003
PHQ-9 ^	9-Month	1213	0.975	0.955	0.995	0.016

Bold indicates $p < .05$; SWLS= Satisfaction with Life Scale; PHQ-9=Patient Health

Questionnaire-9. ^Odds ratio; the reference group is “not depressed”. *Adjusted for: age, race (white Hispanic, black), marital status (single, married) lived with (alone, significant other, family other than spouse, non-family member), retired, high school or greater education, pre-injury driver, payer private, managed care organization or health maintenance organization, previous brain injuries (none, one or two+), premorbid other drug use, premorbid impulse control

problems, prior adult central nervous system disorder, premonitory pain problems, cause of injury (sports/other, violence) shorter session site, days injury to rehabilitation admission, FIM Motor, FIM Cognitive, CSI Brain Injury, CSI Non-Brain Injury, craniotomy, post-traumatic amnesia status at admission, open head injury with contusion/hemorrhage, facial fracture, skull fracture, weight-bearing precautions, moderate-severe aphasia, paralysis at admission.

Table 3. Adjusted* Model for Interaction of Initial Severity and Proportion of Advanced Therapy

Outcome	Time Point	N	Effect	----- Severe -----		----- Not Severe -----			Interaction p-value
				Lower 95% CI	Upper 95% CI	Effect	Lower 95% CI	Upper 95% CI	
PART-O Total Rasch	3-Month	1442	0.130	0.028	0.231	0.082	0.020	0.145	0.42
PART-O Total Rasch	9-Month	1385	0.169	0.090	0.248	0.121	0.060	0.182	0.33
PART-O Total	3-Month	1602	0.006	-0.001	0.013	0.008	0.002	0.013	0.67
PART-O Total	9-Month	1521	0.010	0.003	0.017	0.009	0.004	0.013	0.76
PART-O Out-and-About	3-Month	1604	0.009	0.000	0.018	0.008	0.001	0.015	0.79
PART-O Out-and-About	9-Month	1525	0.010	0.001	0.019	0.009	0.002	0.015	0.83
PART-O Productivity	3-Month	1609	0.006	0.000	0.013	0.008	0.003	0.014	0.64
PART-O Productivity	9-Month	1528	0.017	0.007	0.027	0.011	0.005	0.018	0.29
PART-O Social	3-Month	1605	0.002	-0.008	0.013	0.007	0.000	0.014	0.46
PART-O Social	9-Month	1522	0.003	-0.008	0.014	0.006	-0.001	0.012	0.66
FIM Cognitive Rasch	Discharge	1827	0.483	0.390	0.576	0.012	-0.088	0.113	0.00
FIM Cognitive Rasch	3-Month	1526	0.414	0.229	0.600	0.050	-0.066	0.166	0.00
FIM Cognitive Rasch	9-Month	1430	0.400	0.179	0.620	0.055	-0.057	0.167	0.01
FIM Motor Rasch	Discharge	1827	0.580	0.477	0.683	0.235	0.176	0.295	0.00
FIM Motor Rasch	3-Month	1512	0.605	0.414	0.794	0.198	0.090	0.306	0.00
FIM Motor Rasch	9-Month	1411	0.532	0.337	0.726	0.249	0.143	0.355	0.01

SWLS	3-Month	1200	0.077	-0.029	0.182	0.116	0.028	0.203	0.55
SWLS	9-Month	1220	0.040	-0.074	0.155	0.082	0.009	0.155	0.54
PHQ-9 [^]	3-Month	946	0.998	0.961	1.037	0.964	0.939	0.989	0.13
PHQ-9 [^]	9-Month	1215	0.981	0.948	1.014	0.982	0.960	1.004	0.94

[^]Odds ratio, the reference group is “not depressed”; SWLS=Satisfaction with Life Scale; PHQ-9=Patient Health Questionnaire-9, *Adjustment covariates: days from injury to rehabilitation admission, FIM Cognitive, CSI Brain Injury, prior brain injury (none or 2+), payer (Medicaid, Medicare, private/MCO/HMO, or other/self/none), craniectomy, craniotomy, moderate-severe aphasia, post-traumatic amnesia at admission, shorter session site, weight-bearing precautions, race (white, black), prior adult central nervous system disorder, Glasgow Coma Scale 9-12; paralysis; injury cause (violence, sports/other), subdural hematoma, midline shift (none, 0 to 5 mm, not otherwise specified, unknown) premorbid driver, open head injury with contusion/hemorrhage, closed head injury with no contusion/hemorrhage, maximum pain score first 3 days, epidural hematoma, lived with non-family member, high school+ education; skull fracture, previous living situation, sex male, retired, intraventricular hemorrhage, premorbid learning disorder, premorbid difficulties with activities of daily living.

