

GOLIAH: A gaming platform for home based intervention in Autism - Principles and Design

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Provisional

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17 **Keywords: Autism Spectrum Disorder, Early Start Denver Model, serious game,**
18 **intensive intervention, Imitation, Joint attention, nomadic settings**

19 **Abstract**

20 Children with Autism need intensive intervention and this is challenging in terms of
21 manpower, costs and time. Advances in Information Communication Technology and
22 computer gaming may help in this respect by creating a nomadically deployable
23 closed loop intervention system involving the child and active participation of parents
24 and therapists.

25 An automated serious gaming platform enabling intensive intervention in nomadic
26 settings has been developed by mapping two pivotal skills in autism spectrum
27 disorder: Imitation and Joint Attention (JA). Eleven games – seven Imitation and four
28 JA – were derived from the Early Start Denver Model. The games involved
29 application of visual and audio stimuli with multiple difficulty levels and a wide
30 variety of tasks and actions pertaining to the Imitation and JA. The platform runs on
31 mobile devices and allows the therapist to (1) characterize the child's initial
32 difficulties/strengths, ensuring tailored and adapted intervention by choosing
33 appropriate games and (2) investigate and track the temporal evolution of the child's
34 progress through a set of automatically extracted quantitative performance metrics.
35 The platform allows the therapist to change the game or its difficulty levels during the
36 intervention depending on the child's progress.

37 Performance of the platform was assessed in a 3-month open trial with 10 children
38 with autism (Trial ID: NCT02560415, Clinicaltrials.gov). The children and the
39 parents participated in 80% of the sessions both at home (77.5%) and at the hospital
40 (90%). All children went through all the games but, given the diversity of the games
41 and the heterogeneity of children profiles and abilities, for a given game the number
42 of sessions dedicated to the game varied and could be tailored through automatic
43 scoring. Parents (N = 10) highlighted enhancement in the child's concentration,
44 flexibility and self-esteem in 78%, 89% and 44% of the cases respectively and 56%
45 observed an enhanced parents-child relationship.

46 This pilot study shows the feasibility of using the developed gaming platform for
47 home-based intensive intervention. However, the overall capability of the platform in
48 delivering intervention needs to be assessed in a bigger open trial.

49 **1 Introduction**

50 Autism Spectrum Disorder (ASD) is a spectrum of neurodevelopmental disorders
51 characterized by the presence of atypical social communicative interaction and
52 behaviors [1]. Typically, ASD is diagnosed through behavioral analysis in the 3 – 5
53 years age range and, once diagnosed, its treatment is mainly delivered through
54 behavioral intervention following different intervention models. In essence, these
55 models try to teach a child cognitive, social and behavioral skills that are considered
56 essential for independent living in the long run and various techniques have been
57 developed over the years [2–7]. However, two major problems associated with such
58 interventions are: 1) a person's specific development intervention protocol,
59 accounting for the actual difficulties and strengths of a child, needs to be designed to
60 achieve maximal effects – ASD is a broad spectrum with significant inter-child
61 variability and it has already been established that tailor-made personalized
62 intervention may be more effective compared to any generic type of intervention [8],
63 and 2) at least 20 hours/week are supposed to be needed for an intensive intervention
64 [9][10].

65 Characterization of a child is typically done through behavioral assessment by a
66 trained therapist in clinical settings but such an approach is often prone to have
67 subjective biases. To avoid such biases, one needs to employ a set of stimuli multiple
68 times ensuring their repeatability and then extracting a set of objective measures for
69 characterizing the outcomes. Repeatability is an essential criterion in this case so that
70 an average performance measure in a stimulus-specific way could be obtained
71 reflecting the child's actual ability for responding to the stimuli in question. Such
72 repeatability and the 20 hours/week intensive intervention are difficult to achieve
73 [10]. In fact, its implementation needs a trained therapist and, given the prevalence of
74 ASD, the workload of a therapist could make the effective implementation of this
75 strategy impractical. Moreover, the involvement of trained parents/caregivers to be
76 part of intervention also in home setting seems to be an effective strategy in order to
77 increase the learning opportunity for children with ASD [11, 12]. This requires parent
78 training and regular monitoring to check whether the parents are implementing and
79 properly adhering to the intervention protocol outlined by the therapist. However, the
80 economic implication of such process is quite substantial.

81 In recent years, computer based approaches have been shown to be effective in
82 improving the learning cognitive and social skills of children with various learning

83 disability conditions [13–15]. In these methods the target intervention is mapped into
84 a set of computer games and is thereby training the children since children enjoy
85 playing games rather than going through the conventional learning process [16–18].
86 Most of these computer applications designed for people with autism focus on the
87 relationship between one user and one computer and aim to help with specific
88 behavioral problems associated with autism. Computers are motivating for children
89 with autism due to their predictability and consistency, compared with the
90 unpredictable nature of human responses. In regard to social interaction, the computer
91 does not send confusing social messages. Research on the use of computers [19] for
92 students with autism revealed increase in: (1) focused attention, (2) overall attention
93 span, (3) sitting behavior, (4) fine motor skills, (5) generalization skills (from
94 computer to related non-computer activities); and decrease in (6) agitation, (7) self-
95 stimulatory behaviors, and (8) perseverative responses. The importance of assistive
96 technology for children with autism has been established by the fact that this
97 technology can be used in rehabilitation for daily activities.

98 Motivated by these facts, we conceived a closed-loop system with computer gaming
99 at its center that allows the interaction between subjects with autism and a partner.
100 This approach may help in mitigating the effect of isolation that could affect the
101 traditional computer applications mentioned above. The solution we developed is
102 innovative because it seeks to go over the actual lacuna in various computer games for
103 children with ASD. In fact, in most computer games for ASD, the children are
104 engaged only with a computer screen. In our protocol children are engaged with
105 another person (therapist/caregiver) who has a computer and share the activity with
106 the child.

107 The intensity of intervention for ASD plays a crucial role in terms of clinical
108 outcome. However, the hours of intervention assigned to children with ASD are
109 usually less than the real need of the children. To mitigate this problem, the gaming
110 platform is an interesting solution to increase (1) the hours of treatment for children
111 with ASD and (2) involve caregivers in the intervention. The intensity of the
112 treatment and the involvement of caregivers are two important requirements of the
113 intervention in ASD. In this sense, the gaming platform is in line with the recent
114 recommendation about the intervention proposed by [11, 12].

115 The conceptual view of a closed-loop system that may enable effective intervention
116 integrating both the home and clinical settings is shown in Figure 1.

117 At the heart of the system is a computerized gaming library (GOLIAH – Gaming
118 Open Library Intervention for Autism at Home) which consists of a set of computer
119 games created by mapping the desired intervention stimuli, Imitation and Joint
120 Attention (JA) in this case, into the games. In theory, the library could be divided in
121 two parts –assessment games and intervention games – although they could be used
122 interchangeably without loss of any generality. At the beginning the child would be
123 asked to play a set of games carefully selected from the library by the therapist for
124 characterizing the child’s difficulties/strengths. Since a particular type of stimulus
125 could be mapped in different ways in multiple games, this will allow using different
126 games for ascertaining the child’s difficulties/strengths pertaining to a type of
127 stimulus in a repeatable way without inflicting boredom on the child and thereby
128 obtaining a much more precise average assessment of the child. Once characterized,

129 the therapist could choose appropriate games (designated as the intervention games
130 for convenience) from the gaming library that the child needs to play at his/her home
131 setting on a regular basis adhering to a protocol outlined by the therapist. The aim
132 here is to enhance the cognitive performance of the child through playing these games
133 at home so that the effective intervention hours could be increased. The games could
134 be made flexible enough so that the child may play the games with his/her parents
135 (actively involving the parents without requiring an extensive training process) on a
136 regular basis and with the therapist remotely connected through the internet at pre-
137 scheduled times. The gaming system could have an automated evaluation process
138 embedded in it that would extract a set of quantitative evaluation metrics
139 characterizing the child's performance with each game and thereby providing the
140 temporal evolution characteristics of the child's performance. On the other hand, the
141 parents could also assign a score manually according to a scoring criterion suggested
142 by the therapist to signify how the child's performance has evolved against each
143 stimulus according to their own perception. All the automated and manually evaluated
144 scores could be transmitted to the therapist who may compare them to check, on one
145 hand, how the child is improving and, on the other hand, whether the parents are
146 adhering to the prescribed protocol truthfully. This could act as the basis of the
147 evaluation by the therapist when he/she plays the game remotely with the child at a
148 pre-scheduled time. Depending on this final evaluation the therapist may choose a set
149 of different intervention games from the gaming library once the child achieves the
150 target set by the therapist and the whole process may continue. This closed-loop
151 approach may help in alleviating several problems currently encountered by the
152 autism therapists and have many advantages as described below in Table 1.

153 Improving social interaction skills of children with autism is a difficult task for their
154 families as well as for well-trained therapists [20, 21]. Although ASD remains a
155 devastating disorder with a poor outcome in adult life [22, 23], there have been
156 important improvements in the condition with the development of various therapeutic
157 approaches. The literature on interventions in ASD has become quite extensive, with
158 increasing convergence between behavioral and developmental methods [24, 25]. The
159 focus of many interventions is directed toward the development of skills that are
160 considered to be "pivotal", such as Imitation and JA [26–28].

161 Imitation plays a critical role in the development of every child. Among the several
162 definitions of imitation, no definition is universally agreed upon: (1) Thorndike [26]
163 offered a definition based on visual aspects: "learning to do an action by watching
164 someone doing it". However, a full definition of imitation must consider multi-
165 sensory aspects. (2) Wallon [28] defined imitation as a learning technique without
166 reward (or reinforcement). (3) Whiten and Ham [29] defined imitation as the process
167 by which the imitator learns some behavioral characteristics of the model. Imitation
168 fulfils two essential functions for adaptation: it is used for learning and it serves to
169 communicate without words [30]. Two children involved in imitation are temporally
170 synchronized; they respond to the perception of movements or actions to produce a
171 similar behavior. Compared to imitation, JA introduces a third partner during
172 interaction. Emery defined JA as a triadic interaction that showed that both agents
173 focus on a single object [31]. Some authors [32] have argued that JA implies viewing
174 the behavior of other agents as intentionally driven. In that sense, JA is much more
175 than gaze following or simultaneous looking [33].

176 Lack of Imitation and JA are the main problems when interacting with children with
177 ASD. While playing a game or conducting other activities with a social partner, these
178 children tend to not concentrate on what others are actually doing, switching to
179 repetitive and stereotypical behaviors that are of interest for the child but that usually
180 have no or few relations with the actual social context. Imitation is possible but the
181 communicative value of early imitation seems poorly understood [30]. Also, children
182 with ASD can display concerted attention to toys or objects that they like, but they
183 have difficulties in sharing attention or interests with others [34]. For example,
184 maintaining eye contact with the caregiver is especially complicated [35, 36] and the
185 lack of JA is the consequence [37, 38].

186 Owing to the importance of Imitation and JA as core difficulties in ASD, we mapped
187 a subset of related stimuli from the Early Start Denver Model (ESDM) protocol into
188 the gaming platform containing a set of games with varying levels of difficulties that
189 could be dynamically adjusted by the therapists. This program aims to meet the socio-
190 emotional needs of children and their families, to identify and use validated and
191 effective intervention techniques that are based on developmental needs [39]. The
192 ESDM recently received strong evidence of its efficacy at the level of clinical
193 outcome [40] and brain plasticity [2].

194 Motivated by these facts, the purpose of the work is to design a novel computerized
195 gaming platform that would allow: (1) delivering intensive intervention in nomadic
196 environments for Imitation and JA tasks in children with autism, (2) tailoring and
197 adapting intervention through child-specific assessment of difficulties, (3) enhancing
198 effective intervention hours (4) without increasing the cost of delivery. The major
199 point to note here is that GOLIAH is not intended to replace one of the state-of-the-art
200 intervention for ASD but to supplement and expand it for achieving its maximal
201 benefit.

202 **2 Methods**

203 **2.1 Participants**

204 We tested the software in a 3-month open trial with 10 children with ASD (all boys,
205 aged 5 to 9 years) to assess the performance of the software itself. All children were
206 recruited in the Department of Child and Adolescent Psychiatry, Hôpital Pitié-
207 Salpêtrière, Paris and in the Department of Child Neuropsychiatry, IRCCS Stella
208 Maris Foundation, Calambrone, Pisa. The study was approved by the local ethics
209 committees of each institution (*Comité de Protection des Personnes Ile De France VI*
210 under agreement number CCP 21-14, and Comitato Etico of the Stella Maris under
211 agreement number 05/2011) and was in accordance with the declaration of Helsinki.
212 Each parent gave informed written consent before inclusion for participation and for
213 publication of the individual clinical data. Clinical characteristics of the children are
214 given in Table 4.

215 **2.2 Procedures**

216 The intervention protocol used with children included 6 sessions per week (from
217 Monday to Friday) of training with GOLIAH: 5 sessions per week were at home with
218 the parents (mother or father) playing with their children in the afternoon; 1 session
219 per week was planned at the hospital. The duration of each session, both at home and

220 at hospital, was equal to 20 minutes. The sessions at home and at hospital were the
221 same in terms of tasks. The only differences were the different setting (i.e. home or
222 hospital) and the partner (therapist or parent). Each child's plan was tailored on the
223 basis of functional profile and adapted during the 3-months protocol according to
224 children progress in playing the games. This open-trial aimed at assessing (1) the
225 usefulness of the gaming platform with children-therapist interactions as well as with
226 children-parents, (2) whether tailored intervention was useful when used at home and
227 with non-professional therapist/parents and (3) whether children performed as
228 expected when using the different Imitation and JA games. To do so, we used both
229 objective data computed from the platform and clinical annotations produced by
230 therapists during weekly sessions at hospital. (4) Finally, subjective views from users
231 were also explored through a questionnaire.

232 At the beginning of the study, a 3 month open trial was planned with 60 sessions (four
233 sessions at home per week + one session at the hospital per week = five sessions per
234 week x 12 weeks = 60 sessions). To assess in detail the usability of the gaming
235 platform, we planned a systematic recording of the number of times each game was
236 played in each session by each of the ten children included in the 3-month study
237 period. Details are shown individually in Table 5.

238 **2.3 Instruments**

239 **2.3.1 Software Design**

240 The game software has been developed in Microsoft Visual Studio 10 Platform in C#
241 language. The platform has as many classes as the number of included mini-games;
242 thus, creation of new games will not alter the existing ones. Real-time communication
243 between two devices is performed through a multi-threading process which includes:
244 (1) game flow thread in which all the game tasks are performed (including sending
245 objects to the other user) and (2) receiving thread in which the objects sent by the
246 other user are received and fire the semaphore in the game flow thread. The two
247 players are connected to a server, developed in C#, which acts as a bridge between
248 them. In fact, the objects exchange occurs through a Socket connection based on a
249 TCP/IP protocol which ensures that the information exchange will not be lost during
250 the transmission.

251 **2.3.2 Choice of stimuli**

252 The ESDM is a comprehensive behavioral early intervention protocol for children
253 with autism. It uses a combination of developmental and behavioral techniques in
254 both therapist and parent-implemented early intervention models [41, 42]. It is an
255 intervention for infants with ASD aged 12-48 months that combines Applied
256 Behavior Analysis (ABA) with developmental and relationship-based approaches.
257 The intervention is provided by trained therapists (Antonio Narzisi is a certified
258 therapist from MIND Institute, University of California, Davis) and parents.

259 Each child's treatment program includes models based on: development, functional
260 profile, relational patterns and modification of behaviors. The curriculum includes,
261 among others, systematic activities on receptive and expressive communication, as
262 well as social, play, cognitive, self-care and fine and gross motor skills. Particular
263 attention is devoted to specific tasks regarding Imitation and JA. ESDM considers JA
264 as an activity in which two subjects are engaged with each other in the same

265 cooperative activity, attending to the same objects, or playing or working together on
266 a common activity. A JA routine is made up of several phases: 1) the opening or set-
267 up phase which involves the acts that precede the establishment of the first shared
268 play activity based on the theme of the play. 2) The child and adult are engaged in a
269 definable play activity, either object centered, like building blocks, pouring water,
270 marking with crayons, or involving a social game like singing a song, dancing to
271 music, or playing hide and seek. 3) The elaboration phase involves variation on the
272 theme to keep it interesting or to highlight different aspects of the activity. This
273 preserves the play from becoming repetitious and allows more skill areas to be
274 addressed. 4) The closing is the fourth and final phase when attention is waning or the
275 teaching value of the activity is all used up. It is a time to put materials away and to
276 transit to something else. Closing allows nice transitions in changing activity, location
277 and time.

278 Regarding imitation, in the ESDM different tasks may be proposed to the children: (a)
279 imitation of actions on objects, (b) imitation of gestures and (c) vocal imitation of
280 sounds and words. During intervention sessions, children are asked to imitate
281 conventional or unconventional actions with and/or without objects using or not the
282 vocalizations.

283 **2.3.3 Mapping ESDM stimuli for Imitation and JA into a computerized gaming** 284 **platform**

285 The Imitation and JA stimuli are mapped into 11 games: seven Imitation and four JA
286 games. Although currently the proposed platform consists of 11 games, it is flexible
287 enough for developing/adding new games according to the need. A list of the games
288 and the ESDM stimuli they address is depicted in Table 2. In developing the games,
289 special attention has been devoted to their realistic resemblance to the real-life
290 scenario, more importantly emulating human-human interactions during the game
291 playing phase. Each of the games incorporates different levels of difficulty ranging
292 from the application of one stimulus (e.g. the sound of a train), to a combination of
293 different stimuli (e.g. the sound and the image of a train).

294 The seven Imitation-based games comprise of tasks involving the imitation of
295 drawing, speech, sounds and building actions. For instance, the one related to the
296 sound imitation (Imitation game 4) requires the child to repeat the sound played on
297 the device, either a tablet or a computer. Whereas in the building action game
298 (Imitation game 6) the child would build an object, starting from simple cubes, in a
299 similar way to a normal session with Lego toys. The other four games are based on JA
300 stimuli, including the identification of objects (like fruits, home furniture and
301 vehicles), described or pointed to by the therapist/parent.

302 **2.3.4 The gaming platform**

303 The multi-player gaming platform developed here requires two computers or tablets
304 with an active internet connection. One computer/tablet is operated by the therapist or
305 parent (depending upon the application scenario) acting as the *therapist/parent* and
306 the other by the child designated as the *player*. Currently the platform is available in
307 three different languages (Italian, English and French) for providing instructions to
308 the child and the therapist/parent.

309 The choice of the language, the game to play as well as the goal setting is made by the
310 therapist/parent. As instance, when playing the musical instrument game, the
311 *therapist/parent* can select between two different goal settings: listen and recognize a
312 sequence of (a) three or (b) six musical instruments. The role of the player is to
313 achieve the goal set by the therapist/parent at the end of the game. In the game
314 described above, the child will listen to a sequence of instruments and, depending on
315 the goal selected, he will listen and recognize the sequence of three or six instruments.

316 The games can also be categorized in (a) stand-alone operation game and (b) game
317 requiring active co-operation between the therapist and the child. (a) The stand-alone
318 operation games contain pre-developed libraries containing the stimuli and the
319 instruction to achieve the goal. The imitation game 4 – Imitate Sound is an example of
320 stand-alone game; the therapist/parent selects a list of animal's sounds to imitate: the
321 player will listen to each sound and imitate it. (b) In the second category of games, the
322 therapist/parent has an active role: he/she needs to cooperate with the child to achieve
323 the goal of the game and can also create new stimuli. An example of this category is
324 the Joint Attention game 2 – Cooperative drawing-connect dots: both therapist/parent
325 and the child have to cooperate to connect the dots and create the final figure. Details
326 and figures of these games can be found in the supplementary material.

327 All the games have different levels of difficulty allowing the therapist/parent to adjust
328 the initial level of difficulty according to the cognitive skills identified by the therapist
329 at the beginning of the treatment process or dynamically adjusting it as the player's
330 performance progresses with time.

331 The performance of the player could be assessed mainly in two different ways:
332 through an (a) automated evaluation based on a predefined scoring convention and
333 through a (b) manual evaluation by the therapist/parent. (a) The automated evaluation
334 does not require any action to the therapist/parent: the game will automatically assign
335 a score to the performance of the child. For example, the game will assign a positive
336 score if the child has selected the right musical instruments. (b) The manual
337 evaluation requires to the therapist/parent to select among three different buttons:
338 score 0 if the player did not achieve the goal, 1 for partial achievement and 2 for
339 successfully satisfying the goal. As instance, at the end of the imitation game 4 –
340 Imitate Sound, the therapist/parent has to click among three buttons indicating score
341 0, 1 or 2. Without loss of generality, a more complicated scoring system could be
342 programmed easily according to the need of granularity to assess the achievement of
343 the player.

344 Apart from the simple scores describing whether the player has achieved the goal, a
345 set of objective metrics and an array of possible events are also extracted by the
346 platform in an automated way. A list of such objective measurements is given in
347 Table 3 along with their definitions.

348 This set of objective metrics allows the therapist to analyze quantitatively the
349 performance of the player in a stimulus-specific way not only at a particular time
350 point but also the progression of the child's performance over a time window (hours,
351 days, months, etc.) giving a holistic picture of the child's development. For example,
352 the therapist might want to analyze if the child recognize a particular musical
353 instruments and if this recognition becomes quicker throughout the sessions. In
354 addition, the objective metrics allow the therapist to ascertain the appropriateness of

355 scoring and adherence to the prescribed protocol by the parents. Such analysis could
356 be done both online and offline by the therapist as the metrics are stored each time the
357 player plays the game. For example, in the imitation game 1- Free drawing, both the
358 therapist/parent and the player's drawing are saved as well as the scores given by the
359 parent. The therapist could then check if the parent's scores adhere to the scoring
360 guidelines suggested by the therapist.

361 The gaming platform provides a flexible means for giving a reward to the player on
362 successful completion of the goal capturing the essence of reward-based intervention.
363 In the current version a smiley face is shown at the end of each game in the player's
364 device, regardless of the score obtained as a positive reinforcement which also gives
365 an impression of feedback to the player. Such feedback is once again programmable
366 and an appropriate reward could be set by the therapist depending on the player's
367 motivation factors (such as playing music that the child likes, etc.).

368 **2.4 Descriptions of the games**

369 At the start of the game, the main window, shown in Figure 2 will appear on the
370 therapist/parent's device. He/she will first choose the language in which the stimuli
371 and instructions will be played. Thereafter, the therapist/parent selects the desired
372 game which will automatically be launched on both devices.

373 Here we report only the description of two games (Free drawing and Bake a recipe)
374 and we use it to illustrate the children's performances through sessions of both
375 Imitation and JA (a detailed description of all other games is reported on
376 Supplementary Materials GamesDescription.doc).

377 **2.4.1 Joint attention game 3 – Bake a recipe**

378 This game is targeted to cook a recipe by mixing six ingredients in a bowl, as shown
379 in Figure 3. The therapist/parent selects the recipe to cook among 11 dishes from a
380 standardized library, which includes pizza, tiramisu', lasagne, omelette, roasted
381 chicken, pasta, etc. For each of the six ingredients, as soon as the therapist/parent
382 clicks on it, an arrow connecting this ingredient to the bowl appears on the player's
383 device, as shown in Figure 3. The player needs to drag the ingredients into the bowl.
384 When all the ingredients have been dragged into the bowl, the player has to click on
385 the Mix button and, finally, he/she has to choose the recipe they cooked among seven
386 dishes.

387 As before, an event with positive or negative score is generated each time the player
388 clicks on an ingredient and drags it into the bowl, as well as when the correct recipe is
389 recognized.

390 **2.4.2 Imitation game 1 – Free drawing**

391 This imitation game is intended for examining the player's ability to imitate several
392 objects drawn by the therapist/parent, starting from very basic drawings, such as
393 scribbles and dots, to very complicated, like letters and numbers. The whole process
394 of this game is shown in Figure 4, where the blue window indicates the
395 therapist/parent's window and the red window indicates the player's window. Once
396 launched, a window will appear on both therapist/parent and player's device with
397 clearly marked separate drawing panels. The therapist/parent can draw any object of

398 any shape in the panel dedicated to him/her (on the right). Once completed, the
399 therapist/parent's drawing appears on the player's device and the player needs to
400 imitate that drawing in his/her dedicated panel (on the left). The live outline of the
401 player's drawing will appear on the therapist/parent's device. Depending on whether
402 the drawing is correct or not, the therapist/parent can decide to finish the game (by
403 clicking on the tick button) or encourage the player to have another try (by clicking on
404 the cross button). The quality of the imitation will be evaluated by the therapist/parent
405 among three possibilities: correct, incorrect or partially correct. To avoid
406 discrepancies and to create normalization, the therapists involved in this study have
407 reached an agreement, according to the ESDM, on how to evaluate the drawings and
408 sounds imitation and train the parents to adhere to it.

409 **3 Results and Discussion**

410 **3.1 Validation by testing with children**

411 Overall, during the study period, the children and the parents participated in 77.5% of
412 the planned sessions at home and in 90% of the hospital sessions. All children went
413 through all games (seven Imitation games and four JA games). Given the diversity of
414 the games and the heterogeneity of children profile and abilities, for a given game the
415 number of sessions dedicated to the game varied. Also given the levels of difficulty
416 within a game, all the conditions of the games have not been exploited by the children
417 at the end of the 3 months. All games were well tolerated and followed both by
418 children and parents showing the robustness of the gaming platform and the feasibility
419 of the course of the games. One family initially had troubles in using the two tablets
420 system related to Wi-Fi connecting problems that could be easily corrected. Tailoring
421 treatment during the hospital session and data transfer from home was easily
422 achieved.

423 **3.2 Children's performance through sessions and games**

424 We selected two games to illustrate the children's performances through sessions of
425 both Imitation and JA by using either quantitative or qualitative scoring. Our goal
426 here was to verify how meaningful the extracted scores were from each game session
427 to follow the child's progress or difficulties.

428 **3.2.1 Bake a recipe (Joint attention game 3 – quantitative scoring)**

429 Figure 5 and Figure 6 show children's performances for the JA game 3 - Bake a
430 recipe. Figure 5 represents the evolution of the time (in seconds) to complete the task
431 for the JA game 3. For one session ($T_i, T_{i+1} \dots$), completion time is averaged, as the
432 children practice the game several times during one session. As sessions progressed
433 over time, children become faster to achieve the task. Each line corresponds to the
434 evolution of the task completion time across different sessions for a given child. The
435 red dot curve represents the evolution of task completion time averaged for all
436 children ($N = 10$): a common overall decrease was observed in all subjects. To assess
437 whether the task completion time significantly decreased over the sessions, we used a
438 linear mixed model with the Log (time to complete the task) to be explained by the
439 number of sessions as a continuous variable. The Log function was required to have a
440 normal distribution. We found that the time to complete the task significantly
441 decreased along sessions ($\beta = -0.021, t \text{ value} = -5.53, p < .001$).

442 In parallel, the number of errors decreased also over time (Figure 6). For this game,
443 the mistakes which have been taken into account are: wrong and fake answers during
444 the first “mixing ingredients” phase of the game (when the child selects the wrong
445 ingredient or when he presses one or several wrong ingredients after selecting the
446 correct one) and wrong answers during the “choose recipe” phase of the game (when
447 he/she has to guess the cooked recipe). For reasons of readability of the boxplot type
448 graph (Figure 6), the sessions have been grouped into four periods (period 1 = T₁, T₂,
449 T₃, T₄; period 2 = T₅, T₆, T₇, T₈; period 3 = T₉, T₁₀, T₁₁, T₁₂; period 4 = T₁₃, T₁₄, T₁₅,
450 T₁₆).

451 According to our data, the children who had already good performances at the
452 beginning (Period 1), kept their performances constant all along. But there is an
453 important decrease of the number of errors per child across the four periods,
454 particularly for the children who committed several mistakes initially. At the end
455 (Period 4), the number of mistakes is very low for all children. To assess whether the
456 number of errors significantly decreased over the number of sessions, we used a linear
457 mixed model with a binomial variable (the probability of correct answers) to be
458 explained by the number of sessions as a continuous variable. We found that the
459 probability of correct answers significantly increased with the number of sessions ($\beta =$
460 0.039 , z value = 2.78 , $p = .005$). In sum, for this game, the results after 3 months
461 training are promising.

462 3.2.2 Free drawing (Imitation game 1 – qualitative scoring)

463 For the second game (Imitation game 1- Free drawing), the evolution of performances
464 is illustrated from the results of one child, since the results are mainly qualitative and
465 it is difficult to compare the drawing performances of one child with another
466 (complexity of pictures, differences in drawing time, differences in fine motor skills,
467 etc.).

468 Figure 7 shows that the child becomes faster at reproducing the drawing model
469 ($R^2 = 0.867$). In addition, the quality of imitation improved throughout the sessions as
470 shown by the evolution of the imitation scores (given by the therapist/parent) in
471 Figure 8. The quality of the imitation is evaluated by the therapist/parent among 3
472 possibilities: correct (score 2), partially correct (score 1) and incorrect (score 0).
473 Figure 8(a) shows that the average score ($av = 1.7$) during the third period (T₇-T₉) is
474 closer to the maximum score (score 2) and different from the initial scores for the
475 periods T₁-T₃ ($av = 1.2$) and T₄-T₆ ($av = 0.9$). Furthermore, as shown in Figure 8(b),
476 the child needed fewer trials to reproduce the therapist/parent’s drawing. As an
477 illustration, Figure 9 represents the evolution of child’s imitation skills in drawing
478 across the 3 periods.

479 3.3 Parents experience and view

480 At the end of the 3-month open trial, a web questionnaire was sent to the parents of
481 children who participated in the open-trial (10 parents). The questionnaire contained
482 12 questions with a positive or negative orientation toward the serious game (see
483 details at <https://goo.gl/foMpPI>). The questions asked about the use of the game
484 (ease of use for parents, chosen media, technical problems, etc.) and the improvement
485 in the child's skills (concentration, attention, imitation, self-esteem, etc.). The parents
486 had to answer through a Likert scale from 1 to 5 (1 = strongly disagree, 2 = disagree,

487 3 = no opinion, 4 = agree, 5 = strongly agree). Results are summarized in Figure 10
488 and show that parents have positively assessed the use of the serious game as a
489 treatment. 67% of interrogated families did not observe a decrease in the child's
490 motivation to work on tablets; 44% of them were not particularly disturbed by the
491 constraints on daily activities caused by the use of the serious game on tablets and
492 33% judged that the feasibility of treatment was not seriously hampered due to
493 technical problems. The media (digital tablet) was not considered as too stimulating
494 by 89% of the families and more than 67% of them thought that there was a
495 specifically attractive aspect related to the media itself. Only one negative point was
496 noted: 44% of the parents found that the games were inadequate given their children's
497 profile. At the beginning of our pilot study we were aware of this possible limitation.
498 However, since our focus was to assess the feasibility and usability of the game, older
499 participants were preferred because they could be more willing to collaborate and test
500 the game.

501 Concerning progress on the children's skills, it seems that there is not so much
502 progress on Imitation since the majority of the parents (67%) had no specific opinion
503 on this topic. On the contrary, JA (spontaneous sharing) seemed to be slightly
504 ameliorated (33% agreement). Interestingly, some skills that were not directly trained
505 by the games strongly evolved during the course of the 3-month open trial according
506 to parents: child's self-esteem, child's concentration and child's flexibility. Moreover,
507 the quality of parents-child relationship was qualified as enhanced for 56% of the
508 parents. We could hypothesize that the interactive nature of GOLIAH and its
509 pleasantness for the child had the effect of improving parent-child interaction also in
510 other contexts, which is a generalization effect that often is lacking in treatments for
511 autism.

512 **4 Conclusions**

513 In the current paper, we described a gaming platform for home-based intervention in
514 ASD. Within the context of a pilot open trial, we showed the feasibility of the
515 intervention. We found that (1) the gaming platform was useful during both children-
516 therapist interaction at hospital as well as children-parents interaction at home, (2)
517 tailored intervention was compatible with at home use and non-professional
518 therapist/parents, (3) children performed as expected when using the different
519 Imitation and JA games and no game appeared inaccurate, (4) data computed from the
520 platform and clinical annotations produced by parents and therapists allowed session
521 to session monitoring and helped therapists to dynamically reconfigure treatment and
522 (5) subjective views from users (mainly parents here) were overall positive. From the
523 clinical point of view the most important benefits of this novel method of intervention
524 for children with autism are: a) the rapid performance amelioration on tasks based on
525 Imitation and JA that are considered pivotal for children with autism; b) to create a
526 scenario where the spontaneous, and usually lone, activity with video games is easily
527 pushed to become a shared activity; c) a general amelioration of attention and
528 availability to discuss the results of a performance. Nevertheless, some limitations
529 must be considered. First, the lack of more precise and external evaluation of
530 improvements in Imitation and JA with specific methodology; second, a deeper
531 analysis of the minority of parents who have signaled difficulties in applying
532 GOLIAH is needed to individuate for which child and for which family it could be
533 more indicated; third, in a future study it will be important to study the gender

534 differences than the current GOLIAH tasks and to evaluate the appropriateness of the
535 GOLIAH tasks also with girls with ASD. Given the promising preliminary results, we
536 are moving now within the context of FP7 MICHELANGELO project to further
537 ascertain the efficacy of the gaming platform in the context of a bigger (N = 30) and
538 longer (6 months) clinical trial including a control group. Besides Imitation and JA,
539 two cognitive skills directly targeted within the gaming platform, we plan to use
540 external primary variables (i.e. Vineland scores and Social Communication
541 Questionnaire) to assess generalization.

542 **5 Competing interests**

543 The authors declare that they have no competing interests.

544 **6 Authors' contributions**

545 Valentina Bono created the entire gaming platform with help from Wasifa Jamal and
546 Stephane Hommel. Koushik Maharatna and Mike Wald first conceptualized the
547 gaming platform and Koushik Maharatna coordinated the work. Antonio Narzisi
548 made critical evaluations of the stimuli to be selected from ESDM protocol, recruited
549 and evaluated the children in Pisa and ran the open trial; Anne-Lise Jouen adapted
550 ESDM stimuli in serious game stimuli; Jean Xavier recruited the children in Paris;
551 Elodie Tilmont recruited and evaluated children in Paris and ran the open trial;
552 Mohamed Chetouani, David Cohen and Filippo Muratori provided supervision and
553 reviewed the paper. The Michelangelo study group contributed to the overall project
554 and study design, help in managing computational data and engineering issues.

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559 statistical advice.

560 **8 Appendix A**

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566 (University of Ulster, UK).

567 **9 Availability of Data and Materials**

568 The data used to represent the results of the games Bake a recipe and Free Drawing
569 can be found in the Supplementary material as DataGames.xls.

570 **10 References**

- 571 1. *Diagnostic and Statistical Manual-Text Revised DSM-IV-TR (2000 ed.)*,
572 American Psychiatric Association (2000).
573
- 574 2. G. Dawson, S. Rogers, J. Munson, M. Smith, J. Winter, J. Greenson, A.
575 Donaldson, and J. Varley, Randomized, controlled trial of an intervention for
576 toddlers with autism: the Early Start Denver Model, *Pediatrics* 125, e17 (2010).
577
- 578 3. R. J. Landa, Diagnosis of autism spectrum disorders in the first 3 years of life,
579 *Nature Clinical Practice Neurology* 4, 138 (2008).
580
- 581 4. W. D. National Academy of Sciences-National Research Council, *Educating*
582 *children with autism*, ERIC Clearinghouse (2001).
583
- 584 5. B. Reichow and M. Wolery, Comprehensive synthesis of early intensive
585 behavioral interventions for young children with autism based on the UCLA
586 young autism project model, *Journal of autism and developmental disorders* 39,
587 23 (2009).
588
- 589 6. W. L. Stone and P. J. Yoder, Predicting spoken language level in children with
590 autism spectrum disorders, *Autism* 5, 341 (2001).
591
- 592 7. P. Szatmari, S. Bryson, M. Boyle, D. Streiner, and E. Duku, Predictors of
593 outcome among high functioning children with autism and Asperger syndrome,
594 *Journal of Child Psychology and Psychiatry* 44, 520 (2003).
595
- 596 8. R. Picard and M. Goodwin, Developing innovative technology for future
597 personalized autism research and treatment, *Autism Advocate* 50, 32 (2008).
598
- 599 9. B. Remington, R. P. Hastings, H. Kovshoff, F. degli Espinosa, E. Jahr, T. Brown,
600 P. Alsford, M. Lemaic, N. Ward, and J. W. E. MacLean, Early intensive
601 behavioral intervention: outcomes for children with autism and their parents after
602 two years, *American Journal on Mental Retardation* 112, 418 (2007).
603
- 604 10. C. P. Johnson, S. M. Myers, and others, Identification and evaluation of children
605 with autism spectrum disorders, *Pediatrics* 120, 1183 (2007).
606
- 607 11. L. Zwaigenbaum, M. L. Bauman, R. Choueiri, D. Fein, C. Kasari, K. Pierce, W.
608 L. Stone, N. Yirmiya, A. Estes, R. L. Hansen, and others, Early Identification and
609 Interventions for Autism Spectrum Disorder: Executive Summary, *Pediatrics*
610 136, S1 (2015).
611
- 612 12. L. Zwaigenbaum, M. L. Bauman, R. Choueiri, C. Kasari, A. Carter, D.
613 Granpeesheh, Z. Mailloux, S. S. Roley, S. Wagner, D. Fein, and others, Early
614 intervention for children with autism spectrum disorder under 3 years of age:
615 recommendations for practice and research, *Pediatrics* 136, S60 (2015).
616
- 617 13. A. Battocchi, F. Pianesi, D. Tomasini, M. Zancanaro, G. Esposito, P. Venuti, A.
618 Ben Sasson, E. Gal, and P. L. Weiss, Collaborative Puzzle Game: a tabletop
619 interactive game for fostering collaboration in children with Autism Spectrum

- 620 Disorders (ASD), (2009), pp. 197–204.
621
- 622 14. L. Cheng, G. Kimberly, and F. Orlich, *KidTalk: online therapy for Asperger’s*
623 *syndrome*, (2003).
624
- 625 15. A. M. Piper, E. O’Brien, M. R. Morris, and T. Winograd, SIDES: a cooperative
626 tabletop computer game for social skills development, (2006), pp. 1–10.
627
- 628 16. Z. R. Mevarech, O. Silber, and D. Fine, Learning with computers in small groups:
629 Cognitive and affective outcomes, *Journal of Educational Computing Research* 7,
630 233 (1991).
631
- 632 17. M. Moore and S. Calvert, Brief report: Vocabulary acquisition for children with
633 autism: Teacher or computer instruction, *Journal of autism and developmental*
634 *disorders* 30, 359 (2000).
635
- 636 18. D. M. Pascualvaca, B. D. Fantie, M. Papageorgiou, and A. F. Mirsky, Attentional
637 capacities in children with autism: Is there a general deficit in shifting focus?,
638 *Journal of Autism and Developmental Disorders* 28, 467 (1998).
639
- 640 19. S. Boucenna, A. Narzisi, E. Tilmont, F. Muratori, G. Pioggia, D. Cohen, and M.
641 Chetouani, Interactive technologies for autistic children: A review, *Cognitive*
642 *Computation* 6, 722 (2014).
643
- 644 20. D. Cohen, R. S. Cassel, C. Saint-Georges, A. Mahdhaoui, M.-C. Laznik, F.
645 Apicella, P. Muratori, S. Maestro, F. Muratori, and M. Chetouani, Do parentese
646 prosody and fathers’ involvement in interacting facilitate social interaction in
647 infants who later develop autism?, *Plos one* 8, e61402 (2013).
648
- 649 21. C. Saint-Georges, A. Mahdhaoui, M. Chetouani, R. S. Cassel, M.-C. Laznik, F.
650 Apicella, P. Muratori, S. Maestro, F. Muratori, and D. Cohen, Do parents
651 recognize autistic deviant behavior long before diagnosis? Taking into account
652 interaction using computational methods, *PLoS one* 6, e22393 (2011).
653
- 654 22. P. Howlin, P. Moss, S. Savage, and M. Rutter, Social outcomes in mid-to later
655 adulthood among individuals diagnosed with autism and average nonverbal IQ as
656 children, *Journal of the American Academy of Child & Adolescent Psychiatry* 52,
657 572 (2013).
658
- 659 23. A. M. Roux, P. T. Shattuck, B. P. Cooper, K. A. Anderson, M. Wagner, and S. C.
660 Narendorf, Postsecondary employment experiences among young adults with an
661 autism spectrum disorder., *Journal of the American Academy of Child and*
662 *Adolescent Psychiatry* 52, 931 (2013).
663
- 664 24. A. Narzisi, F. Muratori, S. Calderoni, F. Fabbro, and C. Urgesi,
665 Neuropsychological profile in high functioning autism spectrum disorders,
666 *Journal of autism and developmental disorders* 43, 1895 (2013).
667
- 668 25. M. B. Ospina, J. K. Seida, B. Clark, M. Karkhaneh, L. Hartling, L. Tjosvold, B.
669 Vandermeer, and V. Smith, Behavioural and developmental interventions for

- 670 autism spectrum disorder: a clinical systematic review, *PloS one* 3, e3755 (2008).
671
- 672 26. E. L. Thorndike, Animal intelligence: An experimental study of the associative
673 processes in animals, *Psychological Monographs: General and Applied* 2, i
674 (1898).
675
- 676 27. K. Toth, J. Munson, A. N. Meltzoff, and G. Dawson, Early predictors of
677 communication development in young children with autism spectrum disorder:
678 Joint attention, imitation, and toy play, *Journal of autism and developmental*
679 *disorders* 36, 993 (2006).
680
- 681 28. H. Wallon, *De l'acte à la pensée.*, Flammarion (1942).
682
- 683 29. A. Whiten and R. Ham, On the nature and evolution of imitation in the animal
684 kingdom: reappraisal of a century of research, *Advances in the Study of Behavior*
685 21, 239 (1992).
686
- 687 30. J. Nadel, Does imitation matter to children with autism, *Imitation and the social*
688 *mind* 118 (2006).
689
- 690 31. N. Emery, The eyes have it: the neuroethology, function and evolution of social
691 gaze, *Neuroscience & Biobehavioral Reviews* 24, 581 (2000).
692
- 693 32. M. Tomasello, Joint attention as social cognition, *Joint attention: Its origins and*
694 *role in development* 103 (1995).
695
- 696 33. M. Carpenter, K. Nagell, M. Tomasello, G. Butterworth, and C. Moore, Social
697 cognition, joint attention, and communicative competence from 9 to 15 months of
698 age, *Monographs of the society for research in child development* i (1998).
699
- 700 34. S. J. Rogers and G. Dawson, *Early Start Denver Model Curriculum Checklist for*
701 *Young Children with Autism*, Guilford Press (2009).
702
- 703 35. S. Maestro, F. Muratori, M. C. Cavallaro, C. Pecini, A. Cesari, A. Paziente, D.
704 Stern, B. Golse, and F. Palacio-Espasa, How young children treat objects and
705 people: an empirical study of the first year of life in autism, *Child Psychiatry and*
706 *Human Development* 35, 383 (2005).
707
- 708 36. C. Saint-Georges, R. S. Cassel, D. Cohen, M. Chetouani, M.-C. Laznik, S.
709 Maestro, and F. Muratori, What studies of family home movies can teach us about
710 autistic infants: A literature review, *Research in Autism Spectrum Disorders* 4,
711 355 (2010).
712
- 713 37. P. F. Dominey and C. Dodane, Indeterminacy in language acquisition: the role of
714 child directed speech and joint attention, *Journal of Neurolinguistics* 17, 121
715 (2004).
716
- 717 38. D. Premack and G. Woodruff, Does the chimpanzee have a theory of mind?,
718 *Behavioral and brain sciences* 1, 515 (1978).
719

- 720 39. M. Smith, S. Rogers, and G. Dawson, The Early Start Denver Model: a
721 comprehensive early intervention approach for toddlers with autism, *Preschool*
722 *Education Programs for Children With Autism. 3rd ed. Austin, TX: Pro-Ed*
723 *Corporation, Inc 65 (2008).*
724
- 725 40. G. Dawson, E. J. Jones, K. Merkle, K. Venema, R. Lowy, S. Faja, D. Kamara, M.
726 Murias, J. Greenson, J. Winter, and others, Early behavioral intervention is
727 associated with normalized brain activity in young children with autism, *Journal*
728 *of the American Academy of Child & Adolescent Psychiatry 51, 1150 (2012).*
729
- 730 41. S. J. Rogers and G. Dawson, *Early start Denver model for young children with*
731 *autism: Promoting Language, Learning, and Engagement*, Guilford Press (2010).
732
- 733 42. S. Rogers, G. Dawson, and L. Vismara, *An early start for your child with autism*,
734 New York: Guilford Press (2012).
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736

737 **11 Figures**

738 **11.1 Figure 1 - The conceptual closed-loop intervention system**

739 The games contained in the platform are used for assessing the child, first, and for
740 intervention purposes later. The first aim is to characterize the starting cognitive skills
741 of a child by playing games at different levels of difficulty. After identifying the
742 current level of ability of the child, a series of games and difficulties will be planned
743 by the therapist and employed at home. According to the evaluation, both automated
744 and manual, a new set of games will be planned by the therapist.

745 **11.2 Figure 2 - Main windows of the therapist/parent during the beginning of** 746 **the game**

747 The therapist/parent (blue windows) will select the language, the category of the game
748 (whether Joint Attention or Imitation), and the game, according to the category
749 chosen.

750 **11.3 Figure 3 - Flow of the Joint Attention game 3 – Bake a recipe**

751 The therapist/parent (blue windows), after selecting the recipe, will select each
752 ingredient to be dragged into the bowl. The red arrow on the player's device (red
753 window) will indicate the ingredient selected by the therapist/parent. After dragging
754 all the ingredients, the player's will click on the recipe cooked.

755 **11.4 Figure 4 - Flow of the Imitation game 1 – Free drawing**

756 The therapist/parent's drawing (blue window) appears on the player's window (red
757 window) who will then imitate the drawing and send it to the therapist/parent. After
758 the therapist/parent's feedback, the smiley will appear on the player's device while
759 the therapist/parent will evaluate the imitation as Correct/Incomplete/Incorrect.

760 **11.5 Figure 5 - Evolution of the time (in seconds) to complete the task for the**
761 **Joint Attention game 3 – Bake a recipe**

762 Evolution of the time occurred to complete the Joint Attention game 3 for each child
763 (each color represents a child) across different sessions. The average across children,
764 in dotted red, shows a decreasing trend across sessions.

765 **11.6 Figure 6 - Number of errors performed to complete the task for the Joint**
766 **Attention game 3 during different periods**

767 The figure contains the number of mistakes committed by the 10 children during the
768 Joint Attention game 3. The total number of errors decreases across the different
769 periods, as shown by the variability (from 19 to five).

770 **11.7 Figure 7 - Evolution of the time (in seconds) to complete the drawing in**
771 **Imitation game 1**

772 Evolution of the time occurred to complete the Imitation game 1 for one child across
773 different sessions. Figure shows that the child becomes faster at reproducing the
774 drawing model.

775 **11.8 Figure 8 - Evolution of the performances of one child during the Imitation**
776 **game 1**

777 The error bars (a) describes the variations of the scores given by the therapist at
778 hospital for different sessions. The quality of imitation improved throughout the
779 sessions: the average score ($av = 1.7$) during the third period (T7-T9) is closer to the
780 maximum score (score 2) and higher than the initial scores for the periods T1-T3 (av
781 $=1.2$) and T4-T6 ($av = 0.9$). The average of number of trials required to complete the
782 imitation, shown on the right (b), has decreased as well across different sessions from
783 the first period (T1-T3 with $av=2$) to the next periods (T4-T6 and T7-T9 with $av=1.4$).

784 **11.9 Figure 9 - Evolution of the imitation skills of a child across three periods**

785 Example of the evolution of the imitation skill for one of the children across different
786 periods.

787 **11.10 Figure 10 - Results related to the questionnaire proposed to the parents**

788 Answers given by the parents of the children recruited for the study to the
789 questionnaire containing the questions related to the use of the GOLIAH platform.

790 **12 Tables**

791 **12.1 Table 1 - Advantages of the closed-loop GOLIAH approach**

Tailoring intervention through careful assessment of the child

- Being computer based, the stimuli for assessment can be programmed in an exact reproducible way.
 - The same type of stimulus could be mapped into different games giving the child the feeling that he/she plays different games. This is particularly important for assessing the child's difficulties since
-

repetition of the same game may force them not to respond to his/her capability level out of boredom. This fact is also true during the intervention stage.

- Different difficulty levels could be incorporated within the games to ascertain the child's performance even for a specific type of stimulus.
- The whole process could be run automatically without incurring extra load on the therapist at the assessment phase.
- A set of quantitative measures could be extracted in an automated way assessing the child objectively.

Nomadic Intervention

- The process could be deployed in nomadic environments where the child may play the game either with his/her parents or remotely with the therapist through internet connections.
- Parents will need minimal training.
- Automated measurements could give an objective idea about how the child's performance changes over time in stimulus-specific way.
- The therapist can adjust the intervention remotely and dynamically by adding/removing games from the pre-stored library.
- It also opens up the possibility of a batch-mode intervention where the therapist may deliver intervention to multiple children located at various locations in one session.

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793

794 **12.2 Table 2 - Mapping of ESDM stimuli for JA and imitation into the games**

795 FM: Fine Motor subset; IM: imitation subset; RC: Receptive Communication subset;
796 JA: Joint Attention subset.

Game type	Description	ESDM stimuli
Imitation game 1: imitate free drawing	Imitation of the drawing done by the online therapist/parent	(lev.4) FM 4
Imitation game 2: Imitate step by step drawing	Imitation of a drawing created step by step from the online therapist/parent (three difficulties)	(lev.4) FM 4
Imitation game 3: Imitate Speech	Imitation of words or phrases from the library (three difficulties)	(lev.2) IM 3, 9
Imitation game 4: Imitate sounds	Imitation of sounds chosen from the library (four difficulties and two categories of stimuli)	(lev.2) IM 2
Imitation game 5: Imitate actions	Imitation of the actions with balls made by the online therapist/parent (three difficulties and two types of task)	(lev.2) IM 6
Imitation game 6: Imitate actions and build	Imitation of the actions with cubes made by the online therapist/parent (three difficulties and two types of task)	(lev.3) FM 3
Imitation game 7: Guess the instrument	Identification of the musical instruments played and chosen by the therapist/parent from the library (two difficulties)	(lev. 1, 2) IM
Joint attention game 1: Follow the therapist's pointing (both audio and visual)	Identification of the object indicated (verbally, visually or pointed) by the therapist on the video and chosen from the library (six difficulties and eight categories of stimuli)	(lev.1) RC 1, 4 (lev.2) JA 2, 4, 6
Joint attention game 2: Cooperative drawing - connect dots	The therapist and the child cooperate to complete a figure shown on the right, by clicking on the corners of the figure itself (two difficulties and four categories of stimuli)	JA
Joint attention game 3: Bake a cake	The child cooks a recipe by clicking and dragging into a bowl the ingredients chosen by the therapist/parent from the library of recipes (11 categories of stimuli)	JA
Joint attention game 4: Receptive communication	The child identifies the objects described by the therapist/parent and chosen from the library (three difficulties and five categories of stimuli)	(lev.2) RC 5, (lev.1) RC 6, (lev.1) RC 4

797

798

799 **12.3 Table 3 - The objective metrics extracted by the gaming platform**

Measurement type	Measured Metrics	Description
<i>Automated</i>	Name of stimulus	Type of the stimulus embedded within the game and the name of the object the player has to click or drag or draw
	Time of the stimulus	Defined by the difference $\Delta T_s = T_{ss} - T_{es}$ between a start time T_{ss} variable (the time instant the stimulus starts to be shown or played on the child's device) and an end time T_{es} variable (the time instant the stimulus is finished)
	Time of response	Defined by the difference $\Delta T_r = T_{sr} - T_{er}$ between a start time T_{sr} variable (the time instant the child starts to respond) and an end time T_{er} variable (the time instant the child complete his/her response)
	Type of response	Defined by the correctness of the child's response depending on whether the child performs action as intended by the therapist/parent (only Correct or Incorrect)
	Score of response	Assigned score to the response of the child, either 1 or 0 signifying whether the intended response has been achieved or not respectively – a more complicated scoring system could be programmed
	Image of the stimulus and the response	A screenshot of the child's device obtained during imitation drawing and the action games – assisting the therapist to analyze the response further offline to ascertain the quality of response.
<i>Manual</i>	Sound recording	The audio response of the player recorded during the sound and speech imitation games – allowing the therapist to check the quality of response
	Therapist/Parent evaluation	Defined as Complete/Partially complete/Incomplete response of the child according to the therapist/parent judgment
	Manual score	Assigned to 0/1/2 corresponding to the therapist/parent evaluation of the child's action – a more complicated scoring system could be programmed

800 **12.4 Table 4 - Socio-demographic and clinical characteristics of the participants**

801 ASD: Autistic Spectrum Disorder; ADI-R: Autism Diagnostic Interview-Revised;
 802 WISC 3: Wechsler Intelligence Scale for Children 3; WPPSI: Wechsler Preschool and
 803 Primary Scale of Intelligence; VIQ: Verbal Intelligent Quotient; PIQ: Performance
 804 Intelligent Quotient.

	ASD (N=10)
Age, mean (\pm SD)	6.8 (\pm 1.4)
Male – Female	10 – 0
ADI-R, current, mean (\pm SD)	
Social impairment score	14.14 (\pm 4.58)
Communication score	10 (\pm 5.82)
Repetitive interest score	4 (\pm 2.91)
Cognitive Level (WISC3/WPPSI)	
VIQ	103.1 (\pm 14)
PIQ	96.1 (\pm 24.8)
Vineland: mean (\pmSD)	
Communication score	88.2 (\pm 16.7)
Daily living score	84.3 (\pm 13.4)
Socialization	79.5 (\pm 10.3)

805

806 **12.5 Table 5 - Number of sessions per game and per child during the 3-month study period**

Child	1	2	3	4	5	6	7	8	9	10	N of sessions per game for all children: mean [range]
<i>IMITATION GAMES</i>											
<i>Imitate free drawing</i>	11	4	4	6	3	19	16	19	15	16	11 [3-19]
<i>Imitate step by step draw</i>	17	13	24	10	5	20	11	18	13	9	14 [5-24]
<i>Imitate Speech</i>	17	13	15	9	11	15	11	19	12	6	13 [6-19]
<i>Imitate sounds</i>	2	19	10	13	11	10	17	9	11	8	11 [2-19]
<i>Imitate actions</i>	15	23	7	6	10	14	11	14	4	16	12 [4-23]
<i>Imitate actions and build</i>	12	11	19	13	12	12	14	11	12	13	13 [11-19]
<i>Guess the instrument</i>	4	3	11	10	9	2	1	7	6	5	6 [1-11]
<i>JOINT ATTENTION GAMES</i>											

<i>Follow the therapist's pointing</i>	15	19	20	17	12	14	13	16	21	12	16 [12-21]	807
<i>Cooperative drawing</i>	2	19	15	11	13	9	11	11	18	18	13 [2-19]	
<i>Bake a cake</i>	11	14	16	15	12	18	9	12	19	7	13 [7-19]	
<i>Receptive communication</i>	21	25	31	20	17	16	15	25	9	12	19 [9-31]	
N of sessions per child for all games: mean [range]	12 [2-21]	15 [3-25]	16 [4-31]	12 [6-20]	10 [3-17]	14 [2-20]	12 [1-17]	15 [7-25]	13 [4-21]	11 [5-18]		

808 **13 Supplementary Material**

809 **13.1 Supplementary Material 1 – GamesDescription.doc**

810 This file contains the description of the other nine games of the gaming platform
811 which have not been described in the paper.

812 **13.2 Supplementary Material 2 – DataGames.xls**

813 This file contains the data used for the analysis of the games Bake a recipe and Free
814 Drawing presented in the Results and Discussion section.

Provisional

Figure 01.TIF

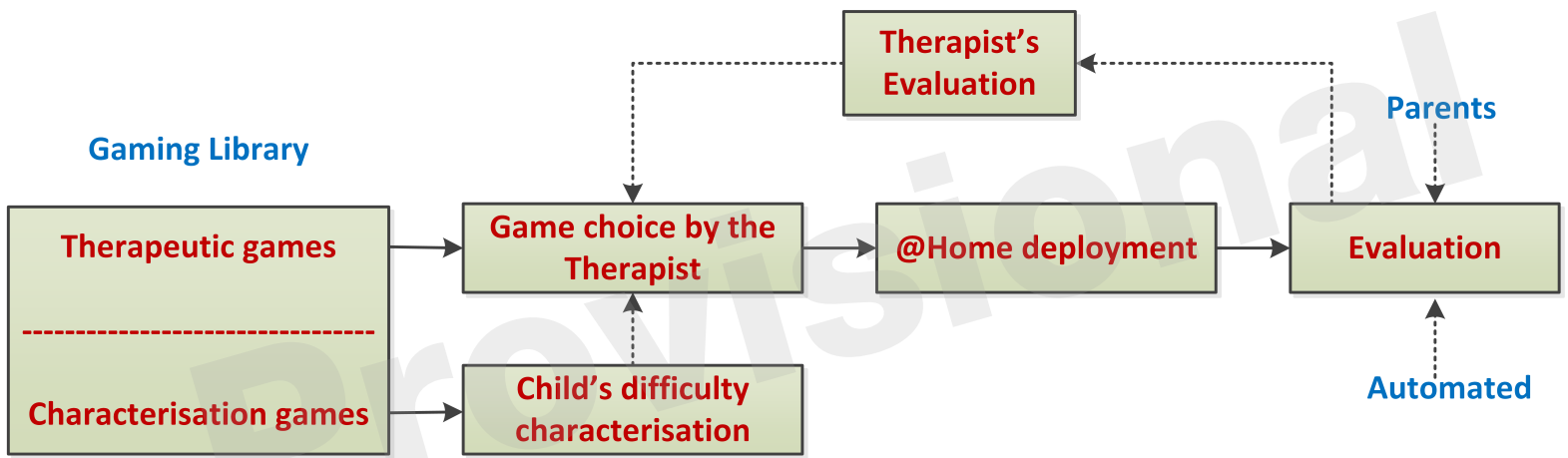
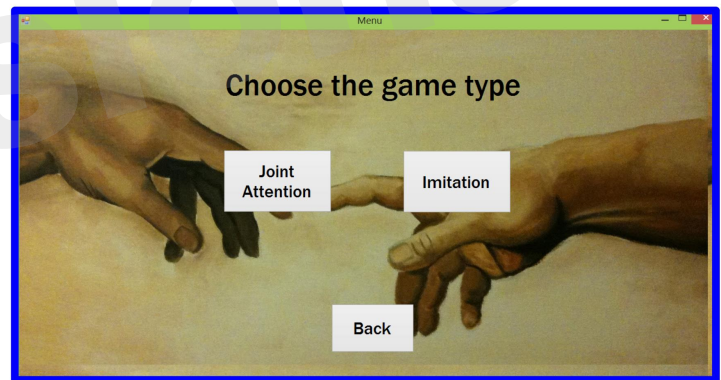
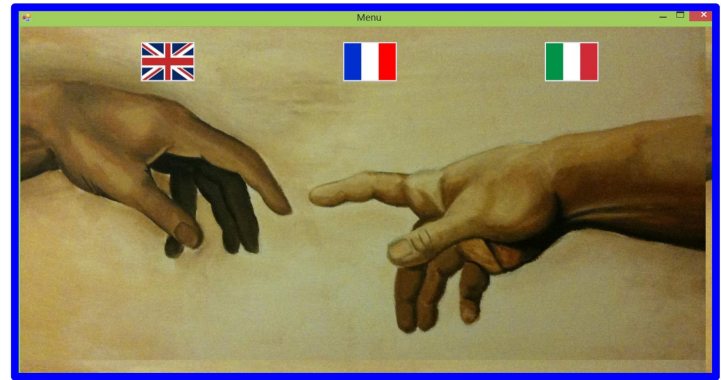
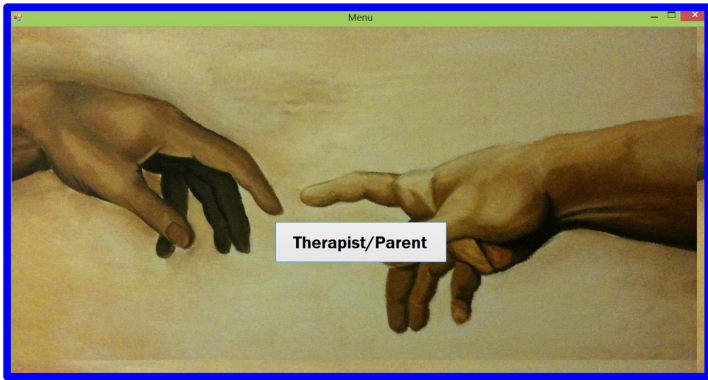


Figure 02.JPEG



Task completion time

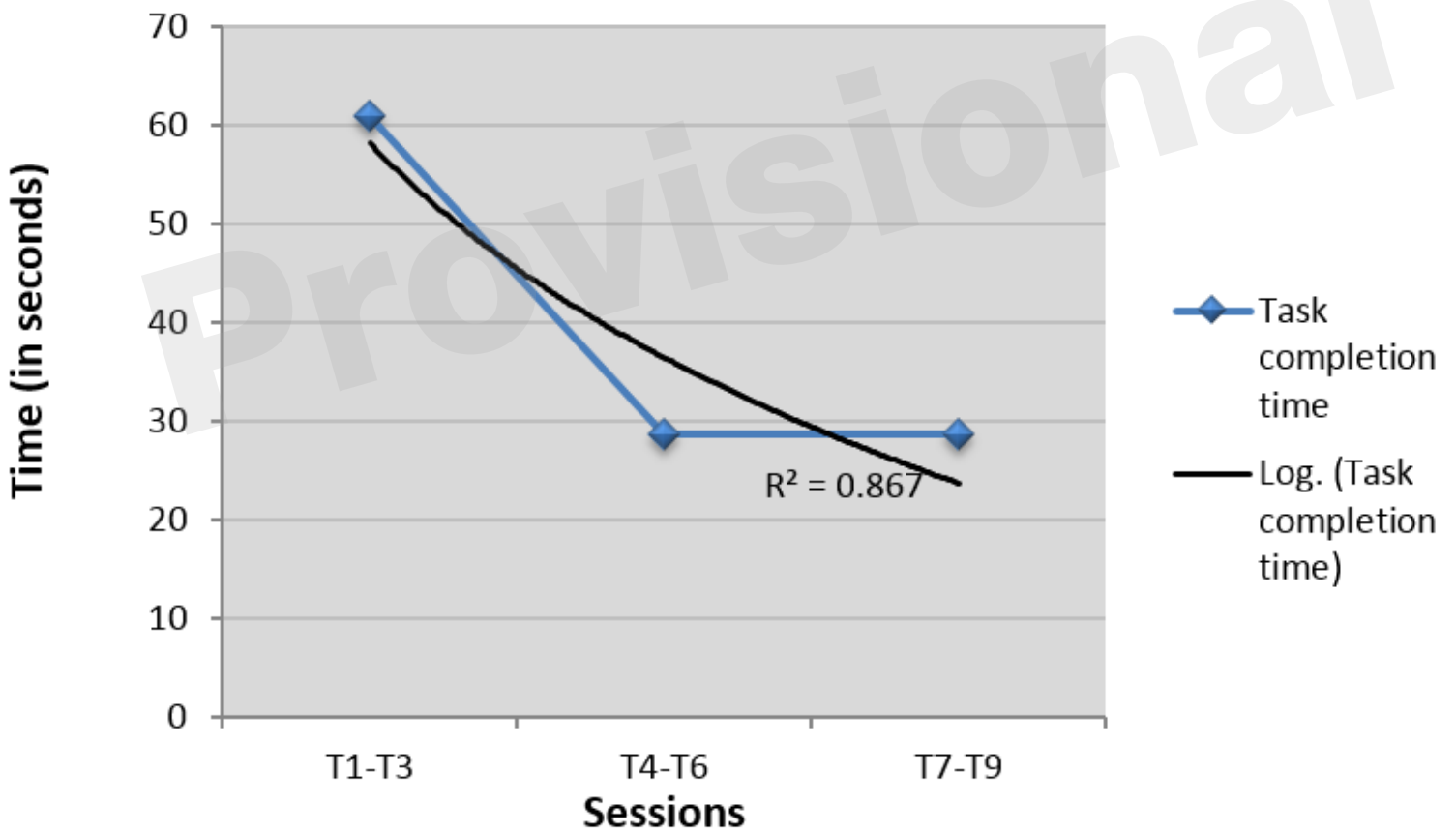


Figure 08.TIF

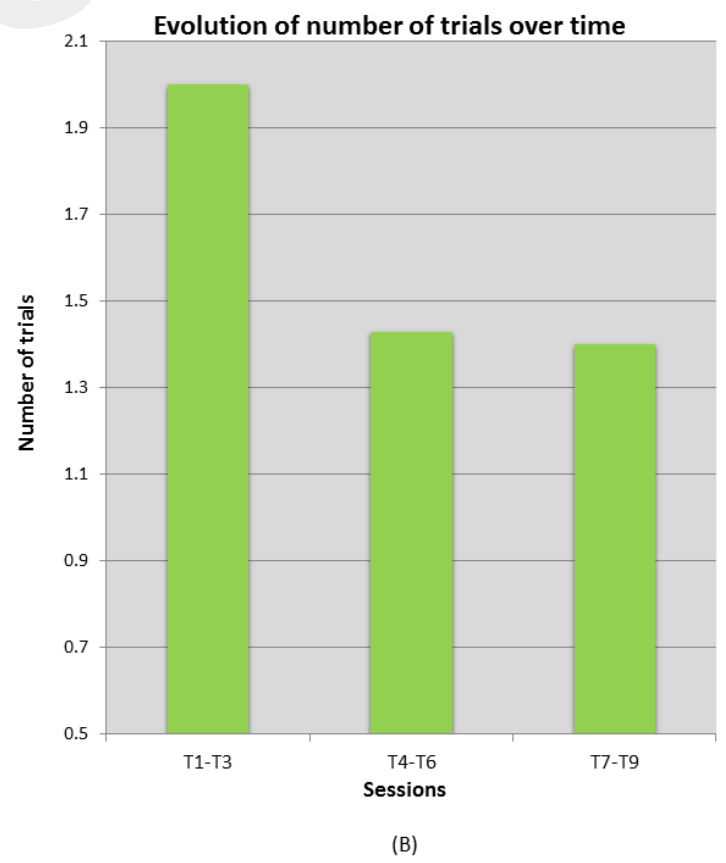
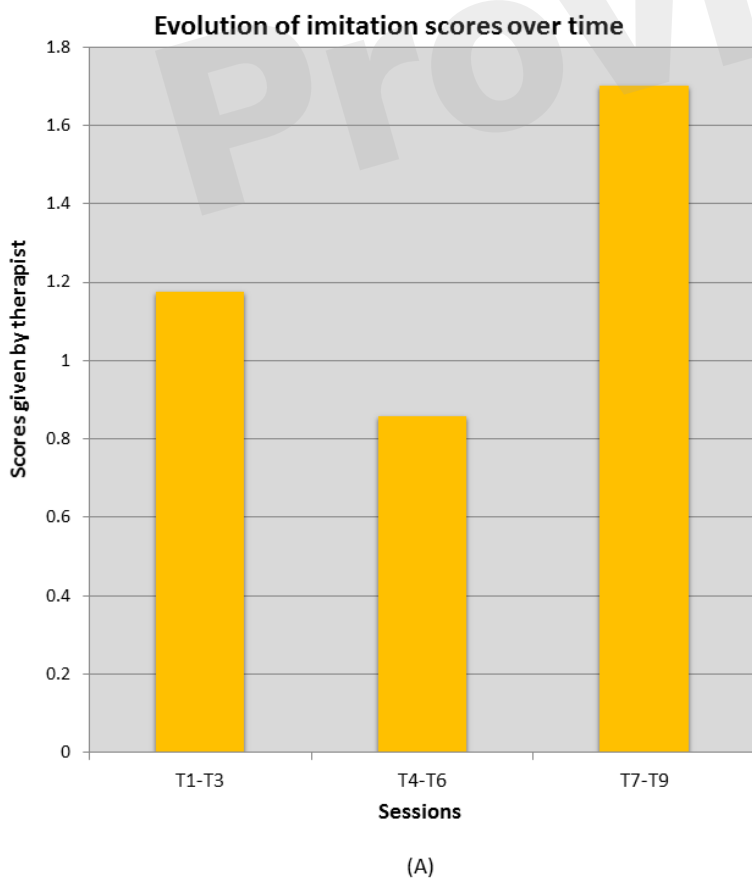
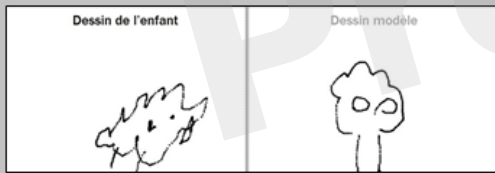
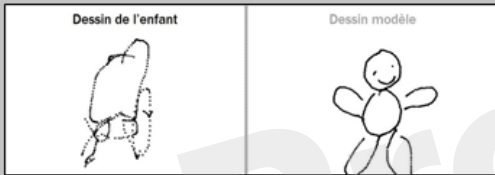
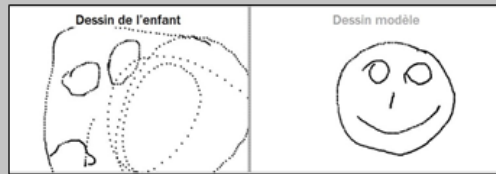
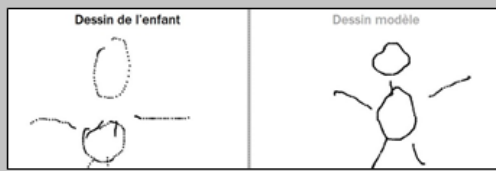


Figure 09.TIF

T1 - T3



T4 - T6



T7 - T9

