1 20 CLINICAL EVALUATION OF BCIs

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revious chapters in this book have discussed the techni-4 cal principles and methods of BCI technology. These 8 chapters show that, despite their current limitations, BCIs are fast becoming effective communication and control 6 devices. However, the rapid growth of this research and its 7 remarkable progress are still confined almost entirely to the 8 cosseted environments of a multitude of laboratories through-9 out the world. Furthermore, most BCI experiments have been 10 and continue to be conducted in able-bodied humans or ani-11 mals rather than in the severely disabled people for whom this 12 new technology is primarily intended. 13

Certainly, there are compelling theoretical and practical 14 reasons for this overwhelming focus on laboratory studies in 15 normal subjects: labs provide the strictly controlled environ-16 ments and expert oversight conducive to the development and 17 optimization of new technology; and able-bodied populations 18 19 are more available and avoid the additional variables introduced by disease and injury that may vary widely across 20 individuals. 21

Nevertheless, this focus leaves a major research gap that 22 must be addressed if BCIs are to fulfill their primary purpose 23 and justify the considerable support that their development 24 receives from governments and other funding entities. That is, 25 the BCIs that work well in the laboratory need to be shown to 26 27 work well in real life, to provide people with disabilities new communication and other capabilities that improve their daily 28 29 lives. In some ways, this essential task is considerably more com-

In some ways, this essential task is considerably more complicated and more demanding than the laboratory research that produces a BCI system. That original research has a single aim: to design and optimize a BCI that provides reliable and accurate communication or control in a carefully controlled and closely monitored laboratory setting. In contrast, research that seeks to establish the real-life usefulness of a BCI system has four different aims. They may be stated as a set of four questions:

38	• Can the BCI design be implemented in a form
39	suitable for long-term independent use?
40	• Who are the people who need the BCI system,
41	and can they use it?
42	• Can their home environments support their us

- 43 of the BCI, and do they actually use it?
- Does the BCI improve their lives?

This chapter addresses each of these questions in turn. 45 It considers the steps involved in answering each and the potential problems that must be overcome. Since the present 47 peer-reviewed literature lacks any formal multisubject studies 48 that address these questions (and indeed has few reports of any 49 kind that are directly relevant to these questions), the discussion necessarily relies heavily on the authors' experience to 51 date, which is primarily with a noninvasive EEG P300-based 52 BCI system (see chapter 12 in this volume). Nevertheless, the 53 chapter's overall intent is to provide information and insight 54 that would apply to any effort to take any BCI system out of the 55 lab and validate its effectiveness in the everyday lives of people 56 with disabilities. 57

CAN THE BCI DESIGN BE IMPLEMENTED58IN A FORM SUITABLE FOR LONG-TERM59INDEPENDENT USE?60

For some BCIs, this first question is readily answered in the 61 negative. For example, the expense, size, and complexity of 62 fMRI-based or MEG-based BCI systems confine them to labo- 63 ratory settings, at least for the foreseeable future (Bradshaw 64 et al. 2001; Buch et al. 2008; Cohen 1972; Kaiser et al. 2005; Lee 65 et al. 2009; Mellinger et al. 2007; Tecchio et al. 2007; van Gerven 66 and Jensen 2009). BCIs that rely on implanted devices (e.g., 67 electrocortigraphy [ECoG], local field potentials [LFPs], or 68 single units) have demonstrated impressive capacity both in 69 animals and in humans. These BCIs face the same safety 70 requirements as any device for clinical use, and, in addition, 71 they must demonstrate that they are sufficiently reliable and 72 effective to warrant human implantation (Donoghue 2008). At 73 present, BCIs based on EEG (and possibly also those based on 74 functional near-infrared spectroscopy [fNIRS]) are the best 75 candidates for independent use (Bauernfeind et al. 2008; Coyle 76 et al. 2007; Naito et al. 2007). Even so, their transition from the 77 laboratory to the home, and to long-term everyday use, requires 78 substantial reconfiguration of their components and consider-79 ation of issues that do not generally arise in the laboratory. 80

Any BCI system deployed for independent use must be 81 safe to operate in the home environment without on-site technical support. Components should be few, small, portable, and 83 relatively inexpensive; and the connections between them 84 should be minimized (e.g., by use of telemetry) and extremely 85 robust. They must be packaged in sturdy and configurable 86



Figure 20.1 (A) The current Wadsworth P300-based BCI home system. The components include a laptop computer, an eight-channel EEG amplifier (Guger Technologies,), an electrode cap (Electro-Cap International,), a 20" monitor, and connecting cables. (B) A compact traveling BCI evaluation unit designed for easy setup, breakdown, and storage of all necessary hardware and supplies.

housing to provide flexible setup and easy storage and must be 1 able to withstand potentially rough handling over many 2 months. Ideally, the amplifiers should be insensitive to the 3 many sources of electromagnetic noise present in home set-4 tings, and the electrodes and their mounting (e.g., for EEG, the 5 electrode cap) should be capable of functioning safely and 6 effectively for many hours per day over months without main-7 tenance or replacement. The software should be easy to use and 8 thoroughly tested (i.e., impervious to BCI user or caregiver 9 error). Before attempting to take a BCI system out of the labo-10 ratory, investigators should meet these requirements to the 11 greatest extent possible. At the same time, they should recog-12 nize that further changes are likely to be needed when the BCI 13 is actually deployed in the home environment. In this regard 14 the principles of modularity in the software (e.g., Schalk et al. 15 2004) and in the hardware (e.g., Cincotti et al. 2008) can expe-16 dite the implementation of improvements and upgrades, and 17 18 the tackling of unexpected failures. Figure 20-1A shows the current version of the P300-based BCI home system developed 19 at the Wadsworth Center of the New York State Department of 20 Health (Albany, NY); and figure 20-1B shows a compact trav-21 eling unit for evaluating this system's suitability for potential 22 users who are homebound. 23

Figure 20–2A shows the Wadsworth BCI home system in operation. This system has now been used by seven severely disabled people in their homes over months and years. It is 26 managed by the caregivers in the users' homes, with internet 27 oversight from the Wadsworth BCI laboratory and occasional 28 home visits by technical personnel from the lab. The foreground 29 of figure 20–2A shows the crowded environment of the users' 30 room. It is typical of the environments of people with severe 31 disabilities. 32

WHO ARE THE PEOPLE WHO NEED THE 33 BCI, AND CAN THEY USE IT? 34

Present-day BCIs have relatively modest capabilities. Thus, the 35 communication and control applications they can provide are 36 likely to be of significant value only to people with extremely 37 severe disabilities that prevent them from using conventional 38 assistive technologies (see chapter 11). Over the past decade a 39 number of studies have begun to explore the BCI capacities of 40 people severely disabled by disorders such as ALS or high-level 41 spinal cord injury (e.g., Bai et al. 2010; Bai et al. 2010; Birbaumer 42 et al. 1999; Conradi et al. 2009; Farwell and Donchin 1988; 43 Hochberg et al. 2006; Hoffmann et al. 2008; Ikegami et al. 2011; 44 Kauhanen et al. 2007; Kennedy and Bakay 1998; Kubler 45 et al. 2001; Kubler et al. 2005a; Kubler et al. 2009; McFarland 46 et al. 2010; Miner et al. 1998; Mugler et al. 2010; Muller-Putz 47



Figure 20.2 (A) A person severely disabled by amyotrophic lateral sclerosis (ALS) using the Wadsworth brain-computer interface (BCI) system in his home. He wears a modified eight-channel electrode cap. (B) Monitor display used by caregiver to check electrode impedance. Red dots are the locations of the eight recording electrodes. When all the locations become green, electrode impedance is sufficiently low, and the caregiver can begin the BCI session.

326 | BRAIN-COMPUTER INTERFACES

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1 et al. 2005; Nijboer et al. 2008; Pfurtscheller et al. 2000; Piccione et al. 2006; Pires et al. 2011; Sellers and Donchin 2006; 2 Sellers et al. 2010; Silvoni et al. 2009; Townsend et al. 2010;). 3 Although some subjects have been studied in their home envi-4 5 ronments, most of this work has generally consisted only of limited sessions with the experimenters closely overseeing 6 BCI operation. Nevertheless, the results to date are encourag-7 ing in that they indicate that many people with severe dis-8 9 abilities can use BCIs that could in theory help them in their 10 daily lives.

These individuals are usually home-bound (or institutionbound) and attended by caregivers 24 hours per day (Albert et al. 2009). They comprise the target user population for the BCIs that are available now or likely to be available within the next decade. How does a BCI researcher find good subjects for studies testing the effectiveness and utility of BCI home use for people with severe disabilities? And how does he or she proceed with these subjects once they are identified?

19 DEFINING THE POPULATION OF 20 PROSPECTIVE BCI HOME USERS

As in most clinical studies, subjects are selected according to a
specific set of criteria. For the user population described above,
the basic inclusion criteria would be:

24 · Little or no useful voluntary muscle control (e.g., people with late-stage ALS, muscular 25 dystrophy, severe Guillain-Barré syndrome, 26 brainstem stroke, severe cerebral palsy, 27 high-level spinal cord injury, or a variety 28 of other severe neuromuscular disorders). 29 (For people with ALS or other progressive 30 diseases, this criterion might be extended to 31 include those who have not yet reached this 32 level of disability but can be expected to do 33 so eventually.) 34 35 Conventional assistive (i.e., muscle-based) communication devices (e.g., eye-gaze systems, 36 EMG switches) are not adequate for their 37 needs: they may be entirely unable to use these 38 devices; their control may be inconsistent or 39 they may fatigue quickly; they may not like the 40 devices; or they may desire the additional 41 communication and control capabilities that a 42 BCI could provide. 43 · Medically stable, with the intent, and a 44

- reasonable expectation, of living for at least one
 year. If they have ALS, they have already begun
 artificial ventilation or have decided to do so
 when it becomes necessary.
- 49 Able to follow spoken or written directions.
- Absence of any other impairment that would
 prevent BCI usage (e.g., extremely poor vision

would prevent use of a BCI that uses visual 52 stimuli). 53 Stable living environment. 54 Reliable caregivers (family members and/or 55 professionals) possessing or capable of 56 acquiring basic computer skills and enthusiastic 57 about supporting the subject's BCI usage. 58 · Subject and caregivers able and willing to 59 provide informed consent and clearly 60 enthusiastic about participating in a research 61 study that may have no lasting direct benefit to 62

Given the wide variety of disorders that can cause severe 64 motor disability, the complexity of the disabilities they cause, 65 and other variables associated with these disorders (e.g., medi- 66 cation, other medical problems), it is often difficult to deter- 67 mine whether a particular person satisfies these criteria 68 (Kuebler et al. 2006). For example, aphasia, which occurs in 69 association with over 25% of strokes, can interfere with the 70 ability to understand instructions about how to use the BCI 71 and/or with formulation of messages to be communicated with 72 it (Pederson et al. 1995; Wade et al. 1986). On the other hand, 73 a right or left hemianopsia (i.e., loss of the right or left visual 74 field) produced by stroke would probably not interfere with 75 BCI use if the screen is positioned in the remaining visual field. 76 Since many prospective BCI users are older adults with ALS or 77 strokes, age-related visual impairments (e.g., macular degen-78 eration, glaucoma, and cataracts [Streiff 1967]) might also 79 affect BCI capability. 80

them (Vaughan et al. 2006).

Appropriate assessment questions (e.g., can the person 81 read text on a screen?) or a standard measure of visual acuity 82 (e.g., Snellen test [Tucker and Charman 1975]) may evaluate 83 this visual issue. Another relevant factor includes current med-84 ications (e.g., sedatives) that may interfere with brain function 85 or affect the EEG (Towler et al. 1962). Cognitive impairments 86 (which occur in up to 40% of people with ALS [Woolley et al. 87 2010; Volpato et al. 2010]) and depression may also interfere 88 with BCI use. Although the recent literature indicates that 89 people with advanced ALS generally rate their quality of life as 90 quite high, moderate depression is often present (Gauthier 91 et al. 2007; Chio et al. 2004; Robbins et al. 2001; Simmons et al. 92 2006; Kubler et al. 2005b). As in other therapeutic endeavors 93 (Kirchhoff and Kehl 2007) (as well as in most life endeavors), 94 mood can affect motivation and play a significant role in BCI 95 effectiveness (Kleih et al. 2010). 96

RECRUITING PARTICIPANTS FOR BCI 97 HOME-USER STUDIES 98

Subject recruitment is a key part of any clinical study and often 99 presents significant difficulties (e.g., Bedlack et al. 2010). 100 Recruiting and retaining individuals who have entered the late 101 stages of a progressive neurological disease can be particularly 102 challenging (Shields et al. 2010). Hospitals, regional clinics, 103

CHAPTER 20. CLINICAL EVALUATION OF BCIs | 327

and medical specialists are traditional sources of subject refer-1 rals. However, many potential BCI home users no longer attend 2 a clinic regularly or participate in routine rehabilitation ser-3 vices, and they may not be under the continuing care of medi-4 5 cal specialists. On the other hand, many of these individuals are enrolled in programs that provide assistive technology 6 (AT) for seating, mobility, and communication needs (Cotterell 7 2008). Thus, subject recruitment is often accomplished by con-8 tacting speech/language pathologists and/or physical thera-9 pists. Home-care physicians, rehabilitation hospitals, visiting 10 nurse services, and hospice providers can also be sources of 11 potential BCI home users. Local school districts frequently 12 have information on programs that serve people with extreme 13 physical challenges. Finally, certain registries of patient popu-14 lations can be useful in recruiting a clinical study cohort (e.g., 15 the national registry of veterans with ALS developed by the 16 Veterans Administration, National ALS Registry Home Page; 17 Allen et al. 2008; Lancet Neurology Editorial 2009]). Such reg-18 istries can expand the number of potential contacts well beyond 19 20 the immediate geographic region. Registries vary in the currency of their information and in the steps required to use 21 them in subject recruitment (e.g., Registry board approval, 22 local IRB oversight). 23

Whether a particular individual meets the inclusion crite-24 25 ria defined above can normally be determined from interviews with caregivers, medical personnel, and/or family members. 26 Thus, in most instances, people who do not meet the criteria 27 can be identified and excluded without actually testing them 28 with the BCI. This can substantially reduce the time and effort 29 the research group invests in testing people who do not turn 30 out to be appropriate for the study. It may also substantially 31 32 reduce the possibility that exclusion might greatly disappoint a prospective subject. 33

³⁴ OBTAINING INFORMED CONSENT

The extremely disabled people who could benefit from current 35 BCIs generally lack understandable speech. In many cases their 36 communication depends entirely on subtle movements of the 37 face, especially small movements of the eyes (Neumann and 38 Kubler 2003). Thus, it may be difficult to obtain the subject's 39 informed consent for participation in a BCI study. Nevertheless, 40 individuals who retain a clear capacity to control such simple 41 movements and to thereby communicate (e.g., via a letterboard 42 held by a caregiver) can provide informed consent, although 43 the process may require considerable time and effort for all 44 concerned. Furthermore, for studies that are found to pose no 45 significant risk (e.g., most noninvasive BCI studies), subjects 46 may participate by providing informed assent (Black et al. 47 2010). Informed assent requires only that they be able to answer 48 49 yes/no questions. Unlike informed consent, it does not require 50 that they be able to ask questions.

51 For people in whom the capacity to provide informed con-52 sent (or assent) is uncertain, many locales have established 53 procedures for permitting close relatives to act on behalf of 54 an incapacitated person to provide informed consent for participation in a clinical trial. Although such surrogate 55 approvals may be relatively straightforward for noninvasive 56 minimal-risk BCI systems, they become more problematic for 57 invasive BCI systems, which may entail significant risks 58 (including possible discomfort) (see discussion in chapter 24). 59 For people with progressive diseases such as ALS, informed 60 consent may be obtained (and BCI use might be initiated) 61 during earlier stages of the disease when adequate communi-62 cation capacity is still present. (Early BCI use may also facili-63 tate the transition to extensive BCI use when conventional 64 communication is no longer possible.) 65

DETERMINING WHETHER A POTENTIAL 66 STUDY SUBJECT CAN USE THE BCI 67

For each person who has met the inclusion criteria and pro- 68 vided informed consent (or assent), the next step is an evalua- 69 tion of his or her ability to use the BCI. This evaluation 70 represents a Go/No-Go decision for participation in the clini- 71 cal study. In work to date by the Wadsworth BCI research 72 group using a P300-based BCI, this evaluation has consisted of 73 two or three 1-2 hour sessions. During each of these sessions 74 the subject performs a cued letter-selection task referred to as 75 copy spelling (Birbaumer et al. 1999). The goal is to collect suf-76 ficient data to parameterize the BCI so that henceforth the user 77 can then it to communicate intent (e.g., to spell freely, select 78 icons, etc.). In most cases, as few as 21 copy-spelling selections 79 (i.e., trials) are sufficient to parameterize the system (McCane 80 et al. 2009). With the standard 6×6 P300 matrix (for which 81 chance accuracy is 2.8%), accuracy of >70% is generally consid-82 ered adequate for effective communication (Sellers et al. 2006). 83

McCane et al. (2009) used interviews to identify 25 people 84 with ALS who appeared to be good candidates for use of a 85 P300-based BCI. In subsequent testing with the BCI system, 17 86 of the 25 candidates (68%) achieved the requisite accuracy of 87 >70% and were thus judged able to use the BCI. It is worth 88 noting here that there was no correlation between the subjects' BCI accuracy and their disability level as measured with the ALS functional rating scale. For the remaining eight people 91 accuracy was <40%. Seven of these people had visual problems 92 (e.g., ptosis, nystagmus, diplopia) that interfered with BCI use. 93 (Such problems are common in people with late-stage ALS 94 [Mizutani et al. 1990; Pinto and de Carvalho 2008]). These 95 data further emphasize the importance of gathering relevant 96 information prior to BCI testing. 97

The evaluation of a person's capacity to use the BCI may be 98 particularly difficult with people who lack a clearly reliable 99 means of basic communication (e.g., an eyeblink or muscle 100 twitch). If an individual does not have an obvious and rela-101 tively fast way to ask and answer questions, the only way to 102 know that he or she has understood the instructions is for the 103 person to communicate using the BCI, and this requires and 104 assumes that the BCI itself is working properly. The difficult 105 issue of BCI use by people who lack any muscle-based com-106 munication (i.e., are completely locked in) is addressed more 107 fully in chapters 11 and 19 of this volume. 108

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1 CAN THE HOME ENVIRONMENT SUPPORT 2 BCI USE, AND IS THE BCI ACTUALLY

4

3 USED?

4 ASSESSING THE ENVIRONMENT AND THE 5 CAREGIVERS

6 Successful home use of current BCI systems require a home environment that can support their use. Home environment 7 assessment can be accomplished first by appropriate questions 8 during telephone interviews and then during the initial BCI 9 evaluation sessions. Home assessment includes evaluation of 10 not only the physical environment but also the level of interest 11 and ability of the users and their caregivers. The immediate 12 environments of people with severe disabilities are often 13 14 crowded with much essential equipment, including ventilators, mechanical beds, and wheelchairs. Thus, the placing of the BCI 15 16 system and the positioning of the prospective user may be challenging, and significant sources of electrical noise and 17 intermittent artifacts may be present. These factors, the diffi-18 culties they present, and the prospects for overcoming them 19 can be initially assessed in the first home visits. These visits are 20 also an opportunity to assess, at least in an informal fashion, 21 the technical skills, learning capacities, interest, and motiva-22 tion of the caregivers who will need to support BCI use. 23 Without capable and motivated caregivers, long-term BCI 24 home usage is not possible (Wilkins et al. 2009). 25

For subjects who have an adequate home environment and 26 are able to use the BCI, the next step is to tell the subject and 27 the caregivers who will support and oversee BCI use about the 28 BCI applications available and about the time, effort, and spe-29 30 cific tasks involved in BCI use. This will allow the level of motivation of both the subject and the caregivers to be further 31 assessed. If they are motivated, a plan may then be formulated 32 33 incorporating the purposes for which the user wants to use the 34 BCI. For all users, particularly those who still retain some capacity for conventional (i.e., neuromuscular) communica-35 tion, this planning step should involve both the user and the 36 caregivers to the greatest extent possible. As described in chap-37 ters 11 and 19, the participants' involvement is a key factor in 38 the success of testing new and/or old BCI applications. If the 39 subjects and their caregivers are motivated and a good usage 40 plan has been defined, the study can then move on to deter-41 mine whether the person actually uses the BCI in daily life. 42

43 INITIATING AND EVALUATING BCI HOME USE

Initiation and evaluation of BCI home use includes five primarytasks:

46	• Configuring the BCI to satisfy the needs and
47	preferences of the user
48	• Placing the BCI in the home
10	Training the subject to use the BCI application

- Training the subject to use the BCI applications
 and the caregivers to support BCI use
- Providing ongoing technical support as needed

• Measuring the extent, nature, and success of BCI usage.

CONFIGURING THE BCI FOR THE USER 54 Before home use begins, the BCI should be configured for the 55 individual user. For example, in the standard P300-based BCI, 56 the numbers and sizes of the matrix items, as well as their 57 brightness and flash-rate, can generally be adjusted according 58 to the abilities and preferences of the user. Careful attention to 59 each user's abilities and preferences is essential. Although 60 speed is generally considered important in communication, it 61 may or may not be of paramount importance to a user who has 62 little or no remaining useful motor function (Millán et al. 63 2010). For these individuals, the restoration of some measure 64 of independent communication may be more important than 65 speed. They may prefer slower but more accurate output to 66 faster but less accurate output. Indeed, one person severely 67 disabled by ALS who uses a P300-based BCI in his daily life 68 chooses to have a 9-sec pause inserted after each selection and 69 thus communicates at a rate considerably slower than the max- 70 imum rate the BCI could provide (Sellers et al. 2010). When 71 they become available for home use, BCI systems that use audi-72 tory stimuli or combined visual/auditory stimuli may be most 73 appropriate for people who lack sufficient visual function 74 (Farquhar et al. 2008; Hill 2005; Guo et al. 2010; Hinterberger 75 et al. 2004; Klobassa et al. 2009; Sellers and Donchin 2006; 76 Nijboer et al. 2008; Furdea et al. 2009; Kanoh et al. 2008; 77 Schreuder et al. 2010). 78

BCI applications must also match their users' preferences. 79 Carefully tailoring the application to the individual while 80 working within the constraints of the system design will 81 improve use acceptance and general satisfaction with the BCI. 82 Since motivation is critical in ensuring subject participation, 83 the choice of application is extremely important. For example, 84 people with high spinal-cord injuries who are still able to 85 speak, may not be interested in a BCI application that controls 86 a speech-generating device, but may be very interested in an 87 application that controls a computer mouse. 88

The BCI applications that have been tested thus far in home 89 use are based mainly on selection of icons presented on a com- 90 puter screen, and they often include sequential menu formats. 91 They can provide a number of simple functions, including 92 word processing, e-mail, environmental control, and Internet 93 access (e.g., Sellers et al. 2010). Menu formats and sequences 94 can be configured to match the capacities, needs, and prefer- 95 ences of each user. They can support important functions such 96 as: requests for medical or other care; room temperature and 97 other environmental controls; answering simple questions (in 98 print or with a speech synthesizer); interactions with family 99 members or friends; requests for food or drink; e-mail; word- 100 processing; entertainment; Internet access; and others. Figure 101 20-3 shows an e-mail application that several users of the 102 Wadsworth P300-based BCI home system are now employing 103 to communicate with family and friends. 104

As discussed in detail in chapter 11, guidelines, standards, 105 and examples abound in the field of AT, and BCI researchers 106

CHAPTER 20. CLINICAL EVALUATION OF BCIs | 329



Figure 20.3 The e-mail application for the P300-based Wadsworth BCI home system. (A) On the right is the standard 8 × 9 matrix capable of controlling any Windows-based program that can be operated with a keyboard. On the left is an e-mail that the BCI user has just composed and sent. The green "Send" confirms to the user that the "Send" command has been recognized and executed. The small window below the message is an optional predictive speller feature that can increase writing speed. (B) On the left is the Help Menu, which can be accessed by selecting the word "Help" from the bottom row-fourth column of the matrix (right). This menu lists commands that can be executed through other matrix selections. (See chapter 12 in this volume for full explication of the P300-based BCI methodology used here.)

should avail themselves of the extensive technology, experi-1 ence, and expertise available in that field. Indeed, BCI home 2 systems are best viewed as technology that extends the spec-3 4 trum of conventional (i.e., muscle-based) AT technology, and BCIs will often be most effective when used as new control 5 interfaces for existing AT devices (chapter 11). BCI clinical 6 research can benefit from innovations in AT and in other areas 7 of human-computer interface (HCI) research and develop-8 ment (e.g., Cook and Hussey 2002; Cremers et al. 1999). These 9 can be as straightforward as language-prediction programs 10 (Ryan et al. 2011) or as novel as the Hex-o-spell (Blankertz 11 et al. 2007; Williamson et al. 2009). 12

13 PLACING THE BCI IN THE HOME

14 In the transition from the laboratory to the home, many new factors that can interfere with BCI use come into play (Sellers 15 et al. 2003; Sellers and Donchin 2006; Neumann and Kubler 16 2003). Although the nature of their vulnerabilities varies 17 with their methodology, all BCIs systems are likely to encoun-18 ter a variety of difficulties in making the transition from the 19 simple, highly controlled laboratory environment to much 20 21 more variable, uncontrolled, and demanding home environments. This is likely to be the case for both noninvasive and 22 invasive BCIs and for BCIs that use electrical or metabolic sig-23 nals. Because most BCI types remain largely confined to the 24 25 laboratory, the discussion here necessarily focuses on the problems encountered by the EEG-based BCIs now being tested in 26 home use. 27

Figure 20-2A shows a person with ALS using a P300-based 28 BCI. It is clear from the figure that, in addition to the BCI 29 equipment, several other electronic and medical devices 30 including a ventilator are in very close proximity. The clutter 31 typical of the immediate home environment of severely dis- 32 abled people (who are usually in a wheelchair or a bed with 33 various medical equipment close by) requires that the BCI 34 system be portable and sufficiently small to fit into this com-35 plex environment. The typical home also has other distractions 36 (e.g., people entering and exiting the room, telephones ringing, 37 dogs barking, etc.) that may interfere with the attention needed 38 for BCI usage and that should also be considered in deciding 39 where to place the BCI. Working together, the user, caregiver, 40 and investigators should consider the setting(s) in which the 41 BCI will be used, and decide how the user and the system com- 42 ponents will best be situated. 43

The typical home has multiple sources of electromagnetic 44 noise that can degrade the quality of EEG recording. In addi- 45 tion to generating ongoing 60-Hz (or 50-Hz) line noise, heat- 46 ing/cooling appliances (e.g., refrigerators) that cycle on and off 47 and other appliances such as electric garage-door openers can 48 produce severe transient artifacts. The ventilators essential to 49 the survival of many prospective BCI users often cause high- 50 frequency electromagnetic artifacts as well as low-frequency 51 mechanical (i.e., movement) artifacts (Young and Campbell 52 1999). Such electromagnetic noise can be reduced by proper 53 grounding and secure connection of the ground and reference 54 electrodes and by such maneuvers as suspending the electrode 55 cables or simply moving them away from the ventilator. Low- 56 frequency mechanical artifacts caused by head movement with 57 respiration may be reduced by simple solutions such as putting 58 additional padding or pillows behind the user's head or dis- 59 pensing with the sponge pads sometimes placed under EEG 60 electrodes. Caregivers and others should be instructed to take 61 care not to disturb system components or cables once they are 62 properly placed. Finally, it may be necessary to eliminate 63 remaining artifacts (e.g., 60-Hz line noise) with filtering meth-64 ods (see chapter 7). Furthermore, in addition to addressing 65 sources of artifacts, it is important to ensure that the electrical 66 power in the home is sufficiently stable. In some situations, use 67 of an uninterruptible power supply (UPS) may be necessary. 68

As each home environment is different, the various sources 69 of interference must be addressed on a case-by-case basis 70 (Sellers and Donchin 2006). To be suitable for home use, a BCI 71 system must be robust enough to avoid or accommodate these 72 problems. Determination of the extent to which a given system 73 meets this requirement is one of the key goals of a home 74 study. 75

Another important part of situating the BCI in the home is 76 resolving how the daily data on system operation and other 77 important data (e.g., periodic copy-spelling sessions for adjusting system parameters and/or measuring accuracy) can be 79 transferred to the investigators remotely. Ideally, this can be 80 accomplished in an automated fashion through an internet 81 link. For example, this transfer may use remote desktop control (Cohen 2004). GoToMyPC* (Citrix Systems) is a service 83 that provides secure access to remote sites and was used for 84 transferring BCI data by Sellers et al. (2010). It supports data

330 | BRAIN-COMPUTER INTERFACES

transfer as well as real-time interaction. A separate license is
 required for each site.

3 ENSURING SAFETY AND COMFORT

4 User safety and comfort and caregiver convenience are extremely important and require close and comprehensive 5 attention. Many years of research and use in intensive care 6 units, operating rooms, and emergency rooms show that long-7 term EEG use is compatible with ventilator technology 8 (Friedman et al. 2009; Phillips et al. 2010; Tantum 2001). BCI 9 clinical researchers must ensure that BCI presence and use 10 does not affect the functioning of other important medical 11 devices. Prior to home installation, each BCI home system, like 12 all medical equipment, should undergo a formal safety evalua-13 tion by a hospital electronics support group or similar body. 14

Furthermore, users and caregivers need to understand that 15 BCIs do not substitute for standard monitoring of the BCI user 16 who has compromised pulmonary functions and thus that 17 ventilator alarms and other safeguards must remain in place 18 19 (Fludger and Klein 2008). In designing a BCI system and its clinical study, it is also important to eliminate to the greatest 20 extent possible the chance that BCI (or user) malfunctions 21 might compromise safety (see chapter 24). For example, stud-22 ies that enable independent use of environmental controls 23 should ensure that the BCI cannot produce outputs that could 24 25 endanger the user (e.g., by setting the room temperature too high). All the tasks that the BCI enables should be structured 26 to prevent their creation of safety hazards. 27

For EEG-based studies, there is an extremely small chance 28 of skin abrasion. This risk depends on the particular sensor cap 29 and gel. The Wadsworth Center BCI research group has used 30 the Electro-Cap InternationalTM cap system for 5000+ hours in 31 the lab, has monitored 1000+ hours of its independent home 32 33 use, and has not encountered a single incident of such abra-34 sion. Despite this reassuring experience, researchers and caregivers must remain alert to the possibility, and caregivers 35 should make regular scalp inspection part of their normal BCI 36 routine. 37

38 TRAINING THE USER AND THE CAREGIVERS

In the course of the initial BCI evaluations and demonstrations 39 of the available applications, the user typically becomes famil-40 iar with the basic features of BCI use. Nevertheless, to ensure 41 that difficulties do not arise from simple misunderstandings or 42 inadequate orientation, researchers should provide guided 43 practice and well-documented help menus. The more chal-44 lenging and complex requirement is training the caregiver to 45 support BCI system use. It is essential to have a logical and 46 47 complete caregiver training protocol. Caregivers must know how to initiate and oversee effective BCI operation. Since fully 48 asynchronous BCIs are not yet available for home use (see 49 50 chapter 10), the initiation of BCI usage requires substantial 51 neuromuscular function, and thus it involves a caregiver.

The caregiver must learn how to: place the electrode cap on the user so that it is comfortable and properly positioned; add electrode gel; turn the BCI system on; check that all electrodes are recording good EEG signals and fix any that are not; initiate system use; monitor BCI operation; turn the system off; remove the cap and maintain the cap and electrodes in good working57order; recognize technical problems or poor performance and58request technical support as needed; ensure that data transfer59to the research lab occurs as required; and ensure that periodic60brief copy-spelling sessions for checking system parameters61and/or measuring performance take place.62

Typically, the caregiver's training will occupy two or three 63 separate 1-hour sessions and will culminate with the investiga- 64 tor simply watching the caregiver go through the entire BCI 65 usage process (i.e., placing the cap and starting the system, 66 overseeing operation, removing and cleaning the cap), as well 67 as the ancillary processes (e.g., data transfer, copy-spelling 68 session). 69

Neither caregivers, users, nor other clinical personnel are 70 likely to be trained researchers. Therefore, all information, 71 even for routine tasks, should be carefully scripted. Each train-72 ing objective (e.g., cap placement, skin preparation, gel appli-73 cation, electrode check, etc.) should be demonstrated and then 74 practiced, with training objectives clearly described and profi-75 ciency for each task tested separately (Gursky and Ryser 2007). 76 For the caregiver, the required objectives may include some 77 that are seemingly obvious but nonetheless crucial (e.g., con-78 tinuing to devote his or her attention to the user while follow-79 ing the instructions on the screen). In addition to initiating 80 and stopping the BCI, the caregiver should also be able to 81 pause and resume BCI operation for essential activities (e.g., 82 tracheal suction for a user who is on a ventilator [C. Wolf, per-83 sonal communication, 2011]). 84

Figure 20–2B displays a tool used to train the caregiver and 85 to serve as a reminder that electrode impedances must be 86 below an acceptable level prior to starting the BCI system. 87 Eight circles representing the electrodes can be red, yellow, or 88 green. Green indicates acceptable impedance. Yellow or red 89 indicates that the electrode needs further attention (e.g., skin 90 preparation, gel). Other screens provide guidance in placing 91 the cap, and testing the connections between the computer and 92 the amplifier and monitor. As a general rule, caregiver training 93 is most likely to be successful when the complexity of the 94 hardware and software are minimized to the greatest extent 95 possible. 96

PROVIDING ONGOING TECHNICAL SUPPORT 97 AS NEEDED 98

Once the BCI is placed in the home, and the user and 99 caregiver(s) are adequately trained, independent daily use can 100 begin. Throughout this use, and particularly in the initial weeks 101 and months, the investigators should closely monitor operation remotely and be readily available to resolve any difficulties 103 that arise. This oversight is essential for gathering the basic 104 data of the study and also for maximizing the likelihood that 105 the BCI will come to serve important purposes in the user's 106 daily life. The system will be used only if it works reliably and 107 with minimal difficulty. Thus, it is crucial, particularly in the 108 early days, for the investigators to respond quickly to any 109 problems that arise, and to be prepared to correct them 110 immediately. 111

Many problems may be resolved remotely, through e-mail 112 or phone discussions with the caregiver, analyses of data sent 113

CHAPTER 20. CLINICAL EVALUATION OF BCIs | 331

over the Internet, or real-time audiovisual interactions over 1 the Internet. Others may require home visits, and (rarely) 2 replacement of a system component. It is worthwhile, and 3 might be considered a key aspect of a BCI home-use study, to 4 5 employ a formal system for documenting problems and the time and effort involved in their solution. Such data are impor-6 tant in assessing the clinical (and ultimately the financial) 7 practicality of the BCI system. 8

To a significant degree, problems may be reduced by care-9 ful selection of system components and prophylactic measures 10 aimed at ensuring that they function satisfactorily as long as 11 possible. For example, one of the most widely used EEG caps 12 (ElectroCap, Inc.) has been estimated to have an average life 13 span of 450 hours. This corresponds to 450 diagnostic sessions 14 in a clinical EEG laboratory. However, a home BCI system 15 might be used 5 hr/day, 7 days/week, which is 1820 hr/year 16 (Sellers et al. 2010). Thus, several caps are likely to be needed 17 by an individual home user each year. Careful cleaning and 18 regular cap rotation may extend cap and electrode life span 19 20 and reduce the incidence of poor BCI performance caused by cap or electrode malfunction. Nevertheless, for a person who 21 uses the BCI many hours per day, caps should be routinely 22 replaced or refurbished every few months, rather than simply 23 changed when they fail. 24

As time passes, and the skills and sophistication of the user 25 and caregiver increase, problems are likely to arise less fre-26 quently. Nevertheless, it is prudent to continue periodic regu-27 lar home visits, even if at relatively long intervals. During such 28 visits, the user's physical state and environment may be reas-29 sessed, applications may be added or upgraded as appropriate, 30 and adjustments may be made in the BCI hardware and 31 32 configuration.

33 MEASURING THE EXTENT, NATURE, AND 34 SUCCESS OF BCI USE

The automated transfer of complete data on BCI system opera-35 tion should allow full quantification of the extent (i.e., days 36 used, hours/day) and nature (i.e., specific applications) of 37 daily BCI use. The measurement of performance, specifically 38 accuracy, is more problematic because, for most routine usage, 39 the actual intention of the user (i.e., the correct BCI output) 40 is not known with certainty. Periodic brief copy-spelling ses-41 sions in which the system specifies the correct output are the 42 most straightforward solution. Alternatively, or in addition, 43 appropriate analysis programs (designed with appropriate 44 attention to user privacy concerns (see chapter 24) may detect 45 errors (e.g., spelling mistakes in written text) and calculate 46 47 accuracies.

It is also important to monitor other aspects of the user's 48 state and environment for changes that may greatly affect BCI 49 use. Disturbances such as intercurrent illnesses may interrupt 50 51 the user's normal routine and can greatly reduce BCI use, at least temporarily. Other problems, such as the temporary 52 absence or permanent departure of the caregiver who supports 53 BCI use, and the need to train a replacement, may also reduce 54 55 BCI use. Fluctuations or progression in the user's basic disease, particularly for users with ALS, may also affect BCI use. For 56 people with ALS, monitoring of this progression may be 57

accomplished with the revised ALS functional rating scale 58 (ALSFRS R) which provides a succinct measure of disability 59 (Cedarbaum et al. 1999). In addition to standard monitoring 60 of these specific factors that may affect BCI use, caregivers and 61 investigators should be alert to sudden changes in BCI use that 62 might be caused by changes in the user's physical or mental 63 state or in other factors. 64

Finally, periodic questionnaire-based interviews of users, 65 caregivers, and family members are useful ancillary tools for 66 identifying system or procedure modifications that might 67 improve BCI performance or usefulness and/or increase user 68 or caregiver satisfaction and convenience. 69

DOES THE BCI IMPROVE THE USER'S LIFE?

Certainly, the simplest and most obvious measure of BCI usefulness is the extent to which it is used. No matter how simple and convenient, BCI use requires significant commitment on the part of both the user and the caregiver. Thus, frequent use is probably a good indicator that the user finds it worthwhile. At the same time, for scientific evaluation, the validation of a home BCI system requires more formal and substantive assessment of its impact on the lives of its users and their caregivers, as well as on their family and friends. 71

Recent studies indicate that, despite common assumptions, 80 quality of life (QoL) can be quite good in people with severe 81 motor disabilities (e.g., Kubler et al. 2005b; Nygren and 82 Askmark 2006; Chio et al. 2004; Simmons et al. 2006). Indeed, 83 this finding provides much of the impetus for BCI development. The measures developed for these QoL studies can also be used to evaluate the impact of BCI use. 86

One of the most important considerations in choosing an 87 assessment instrument is its length. To ensure accurate and 88 complete data collection from individuals who may have diffi-89 culty communicating, any instrument should be relatively 90 brief. One such instrument is the McGill QoL questionnaire, 91 which was designed for individuals with advanced disease 92 (Cohen et al. 1995; Cohen et al. 1996). It is widely used as the 93 basis for other, more elaborate questionnaires, including the 94 Simmons scale designed specifically for ALS (Simmons et al. 95 2006). The McGill questionnaire consists of 17 questions in 96 two parts. Part A consists of one comprehensive question 97 asking the patient for an overall assessment of his/her quality 98 of life (and is itself capable of providing a basic QoL measure). 99 Part B includes 16 questions that cover physical, psychological, 100 existential, and support domains. Answers are indicated on an 101 11-point Likert scale (0-10). Depending on practicality, addi-102 tional more complex measures might be used to assess QoL in 103 BCI users with severe disabilities (e.g., Chio et al. 2004; Kubler 104 et al. 2007; Kurt 2007; Lulé et al., 2009; Mautz et al. 2010; 105 Simmons et al. 2006). 106

In addition to the impact on the BCI users, comparable 107 measures are available for evaluating BCI impact on others 108 (e.g., caregivers, family members), as well for evaluating others' 109 perceptions of how the BCI is affecting the user. These instruments (e.g., The Psychosocial Impact of Assistive Devices Scale 111 [PIADS] [Derosier and Farber 2005; Giesbrecht et al. 2009; 112 Scherer et al. 2010]) may be administered at the beginning of 113

332 | BRAIN-COMPUTER INTERFACES

the study and at intervals of some months thereafter. Positive
 changes in these measures can constitute important evidence
 for the next including of a PCL metangement of a PCL metangement.

³ for the practical clinical value of a BCI system.

BCI efficacy may also be measured in other ways, such as 4 5 by its ability to permit reductions in caregiver effort, or to increase the productivity of the user. For example, the inde-6 pendent communication enabled by present-day P300-based BCIs may free the caregiver from serving as a communication 8 9 partner (and the user from the need to have a partner), or may even help the user to continue productive employment (e.g., 10 11 Sellers et al. 2010).

12 DIFFICULT CHALLENGES IN BCI13 TRANSLATIONAL STUDIES

BCI translational studies confront five difficult challenges that 14 arise from the nature of the user population. First, the users are 15 typically extremely disabled and may have progressive diseases. 16 17 Their highly compromised physical states, medication regimens, frequent intercurrent illnesses, and dependence on often 18 transient caregivers mean that many factors unrelated to the 19 BCI system itself may greatly affect its day-to-day usage and 20 distort the data that quantify that use. Furthermore, for people 21 with progressive disease (e.g., ALS, multiple sclerosis), their 22 23 overall level of function and their need for and ability to use the BCI may change markedly over the course of the study. 24 This may further complicate the task of assessing BCI impact. 25 In the case of ALS particularly, a substantial number of users 26 may die in the course of a long-term study (Murray 2006). 27

The second issue is that it is extremely difficult or even 28 wholly impractical to conduct large-scale fully controlled stud-29 ies that compare BCIs to conventional assistive technology. 30 31 The number of appropriate subjects is limited and the partici-32 pation of each one requires prolonged effort on the part of the investigators. Thus, studies implemented by a single laboratory 33 will generally have small numbers of subjects. Although coor-34 dinated multicentered studies are a possible method for study-35 ing many subjects, they require an expensive and demanding 36 37 second level of organization and oversight to ensure uniformity of subject selection, investigator training, and study exe-38 cution across the multiple sites involved. Furthermore, 39 controlled studies comparing BCI systems with other assistive 40 technology (e.g., eye-gaze systems) introduce further complex-41 ity in terms of standardization of methods and uniformity of 42 procedures. One potential response to this problem is a study 43 design in which each subject serves as his or her own control 44 (i.e., uses the BCI for 6 months, then an eye-gaze system or 45 nothing for 6 months, etc.) However, such designs are likely to 46 be difficult to justify ethically (much less implement) in 47 extremely disabled users, and they may be essentially impos-48 49 sible in users with progressive disorders such as ALS.

The third issue concerns study duration and long-term commitment to the user. In general, formal studies usually specify a time period over which each subject is studied (e.g., 1 or 2 years in the case of home BCI use). However, if the BCI is successful, that is, if it substantially improves the user's life, s/he may very understandably want to continue to use it. Indeed, this is particularly probable for the extremely disabled 56 subjects who are the users of BCI systems now ready for clinical testing. Since these BCI systems are relatively inexpensive, 58 simply allowing the user to keep the hardware past the end of 59 the study may not be a major problem. However, the continuing need for technical support and supplies (e.g., electrode 61 caps) requires continued funding as well as expertise that may 62 be available only from the laboratory that conducted the study, 63 which means that the laboratory personnel need to be available 64 and able to provide the support. Although this problem will 65 presumably be resolved when BCI systems ultimately become 66 reimbursable medical devices, studies with nonreimbursable 67 systems are currently needed to provide the data that will justify such reimbursement. 69

The issue of commitment is even more complex for subjects who have progressive disorders. The BCI may serve them 71 well initially, but as their disease progresses it may become 72 ineffective. The subject, caregivers, or family members may 73 then ask or expect the investigators to modify the system so 74 that it can continue to function effectively. Although the investigators may indeed want to do this, they may lack the requisite 76 resources or expertise. At this point no general solution 77 is apparent for these very difficult situations, and acceptable 78 courses of action must be developed on a case-by-case basis. It behooves the investigators to anticipate these situations as they 80 design BCI studies and to consider how they might respond 81 most effectively (see chapter 24 for further discussion). 82

The fourth issue concerns subjects who may well need a 83 BCI, but who do not qualify for the study or cannot use the 84 BCI system under study. The ad hoc development of new mod- 85 ifications to accommodate a single prospective user (beyond 86 those possible in the existing system or readily implemented, 87 such as covering one eye to prevent diplopia) is likely to divert 88 investigator efforts and resources from the study itself and 89 unlikely to be successful. Furthermore, such modifications 90 may well constitute entirely new research endeavors that 91 require their own IRB reviews and approvals. In general, if a 92 clinical study is to be carried forward to completion and to 93 yield substantive results, the range of possible subject-specific 94 adjustments (e.g., matrix brightness, stimulus rate, etc.) should 95 be defined from the start. Subjects who cannot achieve ade-96 quate accuracy within this range of adjustments should not be 97 included in the study, painful though it may be to all involved 98 including the investigators. (At the same time, the investigators 99 might still offer substantive help to such individuals as 100 described in chapter 24.) 101

Finally, the need for initial and ongoing technical expertise 102 often prevents the undertaking of BCI clinical studies altogether, or limits them to individuals or institutions with substantial resources and very strong commitments to the 105 endeavor. The development of effective translational partnerships like that undertaken between the BCI research group at 107 the Wadsworth Center and clinicians at the Helen Hayes 108 Rehabilitation Hospital can enable BCI clinical studies. Such 109 partnerships between researchers and clinicians may facilitate 110 and accelerate the translation of BCI systems from the laboratory to successful long-term home use by those who need 112 them. 113

CHAPTER 20. CLINICAL EVALUATION OF BCIs | 333

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FUTURE IMPROVEMENTS THAT WILL PROMOTE BCI CLINICAL TRANSLATION

The practicality and appeal of EEG-based BCI systems for 3 4 home use should be greatly augmented by the continuing development both of more streamlined hardware and software 5 and of applications that are useful to people with severe dis-6 abilities (e.g., Cincotti et al. 2008; Münßinger et al. 2010; Sellers 7 et al. 2010). In addition, convenience and comfort can be 8 increased by the development of dry or active electrode sys-9 tems (e.g., Gargiulo et al. 2010; Popescu et al. 2007; Sellers et al. 10 2009; see also chapter 6). Cosmesis can be improved with more 11 12 attractive and/or inconspicuous electrode mountings (i.e., 13 electrode caps that look like ordinary hats or helmets). 14 Although the standard electrode cap with gel application func-15 tions adequately, gel-free electrodes and more comfortable caps are clearly important to many prospective users. Smaller 16 more robust amplifiers and computers and replacement of 17 wired connections with telemetry should further increase the 18 convenience, cosmesis, portability, and durability of these 19 20 systems. Decreases in the complexity of the system hardware (e.g., number of electrodes) and software, and increase in 21 reliability, speed, and range of useful applications will also 22 encourage BCI home use. 23

24 SUMMARY

BCIs are fast becoming effective communication and control 25 devices. However, they are still confined almost entirely to the 26 protected environments of a multitude of laboratories through-27 out the world. This focus leaves a major research gap that must 28 be addressed if BCIs are to fulfill their primary purpose and jus-29 tify the considerable support their development receives from 30 governments and other funding entities. The BCIs that work well 31 in the laboratory need to be shown to work well in real life and to 32 provide to people with disabilities new communication and 33 capabilities that improve their daily lives. To meet these require-34 ments, they must be simple to operate, need minimal expert 35 oversight, be usable by people who are extremely disabled, and 36 provide reliable, long-term performance in complex home envi-37 38 ronments. Their capacity to satisfy these demanding criteria can only be determined through studies of their long-term perfor-39 mance in independent daily home use by the people with severe 40

41 disabilities who constitute their target user population.

42 Once a BCI has proven itself in the laboratory, the transla43 tional research that seeks to establish its clinical usefulness
44 must address four questions:

- 45 Can the BCI be implemented in a form suitable46 for long-term home use?
- Who needs and can use the BCI?
- 48 Can her/his home environment support the
 49 BCI usage and does she/he actually use it?
- 50 . Does the BCI improve his/her life?

334 | BRAIN-COMPUTER INTERFACES

This chapter reviews the multiple complex issues involved 51 in addressing each of these questions. These include: BCI 52 system robustness, convenience, and portability; subject inclu-53 sion criteria; informed consent; the suitability of the home 54 environment; user and caregiver education and training; user-55 specific system configuration and applications; ongoing tech-56 nical support; collection of data on amount, type, and success 57 of BCI usage; complications by intercurrent illness and care-58 giver changes; and evaluation of impact on user quality of life. 59 The chapter also addresses difficult issues particularly relevant 60 to BCI studies, including disease progression, the practical 61 limitations on controls and on the size of study populations, 62 and the issues that may arise when time-limited studies end. 63

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336 | BRAIN-COMPUTER INTERFACES