

1 **ESC Working Group on e-Cardiology Position Paper: Use of Commercially Available Wearable**
 2 **Technology for Heart Rate and Activity Tracking in Primary and Secondary Cardiovascular**
 3 **Prevention -**

4 *In collaboration with the European Heart Rhythm Association, European Association of Preventive*
 5 *Cardiology, Association of Cardiovascular Nursing and Allied Professionals, Patient Forum, and the*
 6 *Digital Health Committee*

7 Magnus T. Jensen¹, Roderick W. Treskes², Enrico G. Caiani^{3,4}, Ruben Casado-Arroyo⁵, Martin R.
 8 Cowie⁶, Polychronis Dilaveris⁷, David Duncker⁸, Ines Frederix⁹, Natasja De Groot¹⁰, Philippe H Kolh¹¹,
 9 Hareld Kemps¹², Mamas Mamas¹³, Paul McGreavy¹⁴, Lis Neubeck¹⁵, Gianfranco Parati¹⁶, Pyotr G.
 10 Platonov¹⁷, Marco Di Rienzo¹⁸, Arno Schmidt-Trucksäss¹⁹, Mark J. Schuurin²⁰, Iana Simova²¹, Emma
 11 Svennberg²², Axel Verstrael¹⁴, Joost Lumens²³

12

13 1. Department of Cardiology, Copenhagen University Hospital Amager & Hvidovre, Denmark

14 2. Department of Cardiology, Leiden University Medical Center, Leiden, the Netherlands

15 3. Politecnico di Milano, Department of Electronics, Information and Biomedical Engineering, Milan,
 16 Italy

17 4. National Council of Research, Institute of Electronics, Information and Telecommunication
 18 Engineering, Milan, Italy

19 5. Department of Cardiology, Erasme Hospital, Université Libre de Bruxelles, Brussels, Belgium

20 6. Department of Cardiology, Royal Brompton Hospital, London, United Kingdom

21 7. Department of Cardiology, Hippokration Hospital, Athens, Greece

22 8. Hannover Heart Rhythm Center, Department of Cardiology and Angiology, Hannover Medical
 23 School, Hannover, Germany

24 9. Department of Cardiology, Jessa Hospital, Hasselt, Belgium; Department of Cardiology, Antwerp
 25 University Hospital, Edegm, Belgium; Faculty of Medicine & Life Sciences, Hasselt University,
 26 Hasselt, Belgium; Faculty of Medicine & Health Sciences, Antwerp University, Antwerp, Belgium

27 10. Department of Cardiology, Erasmus University Medical Center, Rotterdam, The Netherlands

- 28 11. University Heart Center, Freiburg, Germany
- 29 12. Department of Cardiology, Maxima Medical Centre, Eindhoven, The Netherlands; Department of
30 Industrial Design, Eindhoven University of Technology, The Netherlands
- 31 13. Academic Department of Cardiology, Royal Stoke Hospital, University Hospital North Midlands,
32 Stoke-on-Trent, UK.
- 33 14. ESC Patient's Platform, European Society of Cardiology, Sophia Antipolis Cedex, France
- 34 15. School of Health and Social Care, Edinburgh Napier University, Edinburgh, Scotland
- 35 16. Department of Medicine and Surgery, University of Milano-Bicocca & Istituto Auxologico Italiano,
36 IRCCS, Dept of Cardiovascular, Neural and Metabolic Sciences, San Luca Hospital, Milan, Italy
- 37 17. Department of Cardiology, Clinical Sciences, Lund University Hospital, Lund, Sweden
- 38 18. Department of Biomedical Technology, IRCCS Fondazione Don Carlo Gnocchi, Milano, Italy.
- 39 19. Department of Sport, Exercise and Health, University of Basel, Birsstrasse 320 B, 4052 Basel,
40 Switzerland
- 41 20. Department of Cardiology, Amsterdam University Medical Center, Amsterdam, the Netherlands
- 42 21. Cardiology Clinic, Heart and Brain – University Hospital, Pleven, Bulgaria
- 43 22. Department of Cardiology, Karolinska University Hospital, Dept of Clinical Sciences Danderyd
44 University Hospital, Stockholm, Sweden
- 45 23. CARIM School for Cardiovascular Diseases, Maastricht University Medical Center, Maastricht, the
46 Netherlands

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54 **Corresponding author:**

55 Magnus T. Jensen MD DMSc PhD MSc
56 Department of Cardiology
57 Copenhagen University Hospital Amager & Hvidovre
58 Kettegaard Alle 30, 2650, Hvidovre, Denmark
59 magnustjensen@dadlnet.dk
60

61 **ABSTRACT**

62 Commercially available health technologies such as smartphones and smartwatches, activity trackers
63 and eHealth applications, commonly referred to as *wearables*, are increasingly available and used both
64 in the leisure and healthcare sector for pulse and fitness/ activity tracking. The aim of the Position Paper
65 is to identify specific barriers and knowledge gaps for the use of wearables, in particular for heart rate
66 and activity tracking, in clinical cardiovascular healthcare to support their implementation into clinical
67 care. The widespread use of heart rate and fitness tracking technologies provides unparalleled
68 opportunities for capturing physiological information from large populations in the community, which
69 has previously only been available in patient populations in the setting of healthcare provision. The
70 availability of low-cost and high-volume physiological data from the community also provides unique
71 challenges. While the number of patients meeting healthcare providers with data from wearables is
72 rapidly growing, there are at present no clinical guidelines on how and when to use data from wearables
73 in primary and secondary prevention. Technical aspects of heart rate tracking especially during activity
74 need to be further validated. How to analyze, translate, and interpret large datasets of information into
75 clinically applicable recommendations needs further consideration. While the current users of wearable
76 technologies tend to be young, healthy and in the higher sociodemographic strata, wearables could
77 potentially have a greater utility in the elderly and higher risk population. Wearables may also provide
78 a benefit through increased health awareness, democratization of health data and patient engagement.
79 Use of continuous monitoring may provide opportunities for detection of risk factors and disease
80 development earlier in the causal pathway, which may provide novel applications in both prevention
81 and clinical research. However, wearables may also have potential adverse consequences due to
82 unintended modification of behaviour, uncertain use and interpretation of large physiological data, a
83 possible increase in social inequality due to differential access and technological literacy, challenges
84 with regulatory bodies and privacy issues. In the present position paper, current applications as well as
85 specific barriers and gaps in knowledge are identified and discussed in order to support the
86 implementation of wearable technologies from gadget-ology into clinical cardiology.

87 **INTRODUCTION**

88 The last decade has seen a rapid increase in commercially available health technology such as
89 smartphones and smartwatches, activity trackers and eHealth applications, commonly referred to as
90 *wearables*. The worldwide wearable device sales is expected to reach 520 million units by 2025¹.
91 Additionally, use of technologies capable of collecting physiological data may become even greater with
92 widespread utilization of build-in smartphone sensors such as accelerometers, gyroscopes, video
93 camera, microphones, skin conductance, as well as of other wearable technology². These sensors have
94 the capability of providing readily accessible physiological information at a population level, which was
95 previously available only in patient populations in the setting of provision of healthcare. At present,
96 heart rate monitoring and activity tracking are the two most prevalent physiological measurements
97 generally available. Both heart rate and measures of physical fitness are known to be robustly related to
98 cardiovascular disease and longevity^{3, 4}. There is a long-standing tradition for remote monitoring in
99 cardiology spanning from ambulatory heart rate monitoring to implantable devices such as pacemakers
100 and implantable loop recorders⁵. Physicians are increasingly implementing wearables in their clinical
101 practice⁶. However, how to use and understand the data collected from commercially available
102 wearables for primary and secondary cardiovascular prevention is currently unclear, with no guidelines
103 or recommendations in this area.

104 The widespread availability of low-cost and high-volume physiological data from the community
105 provides both unique opportunities and challenges. These issues need to be addressed in order to
106 translate this data into meaningful clinical information on a user, provider, and healthcare system level.

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111 **AIMS & SCOPE**

112 Aim

113 The aim of the present Position Paper is to identify specific barriers and knowledge gaps for the use of
114 wearables, in particular for heart rate and activity tracking, in clinical cardiovascular healthcare to
115 support their implementation into clinical care.

116 Scope

117 The scope of the present Position Paper, is focused on, but not limited to, use of wearables in primary
118 and secondary prevention. In the current context, *primary prevention* is defined as prevention or delay
119 of developing cardiovascular risk factors in healthy populations. *Secondary prevention* is defined as
120 early cardiovascular disease detection and treatment in populations with known cardiovascular risk
121 factors⁷.

122 As the area of wearables is increasing exponentially in these years, the present Position Paper aims to
123 provide a framework to constructively move the field forward from consumer products to clinical utility
124 on an individual, health care provider, and healthcare system level (Figure 1).

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133 SECTION 1: TECHNICAL ASPECTS

134 Generally, current consumer devices provide heart rate (HR) estimates and heart rhythm information
135 from one-lead electrocardiogram (ECG) or from the photoplethysmogram (PPG). An ECG can be
136 obtained, for example, by chest straps wirelessly connected to a smartphone or smartwatch, or by a
137 finger contact with a smartwatch crown. Using PPG, the sensor can be integrated into the smartphone,
138 a wrist bracelet, an armband, or a smartwatch and the HR is estimated from the analysis of the pressure
139 pulse detected by measuring changes in the LED light absorbed by the blood flowing into an artery⁸.
140 Other methods are currently under development to estimate HR from precordial vibrations measured
141 with miniaturized accelerometers⁹.

142 In addition to single HR estimates, an increasing number of wearables enable continuous measurement
143 of HR¹⁰ and thereby quantification of more advanced metrics such as HR variability (HRV) indices¹¹.

144 It is challenging to assess the accuracy of HR measurement by consumer devices as published studies
145 present data of different subsets of devices tested through different protocols, applied in different
146 populations, where the accuracy varies based on the subjects' activity and the prevalence of arrhythmias.
147 Furthermore, the reported accuracy depends on which gold standard was used: for example, in some
148 studies benchmarking was performed using consumer-grade ECG chest straps rather than clinical-grade
149 ECG equipment, producing discordant results^{12, 13}. There is a need for standardized protocols and
150 measures for a robust appraisal of the accuracy of these consumer systems as well as for the definition
151 of their operational limitations.

152 The following general observations can be drawn:

- 153 - accuracy differs among devices^{14, 15}
- 154 - accuracy decreases significantly with increasing activity level^{15, 16}
- 155 - during exercise, PPG from smartwatches tends to be more sensitive to motion artifacts than
156 ECG from chest straps¹⁷.

157 Only few consumer-grade systems have received FDA clearance or CE mark as personal ECG monitors
158 and irregular rhythm detectors (both from ECG or PPG), but with specific operational constraints and
159 their ability to reliably identify atrial fibrillation is under evaluation^{18, 19}.
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161 In addition, smartphone applications (apps) are also commonly used for HR/rhythm assessment. These
162 apps can measure HR by turning the smartphone into a PPG detector²⁰. Although some recent phones
163 have a dedicated PPG sensor, in most cases the phone LED is exploited to illuminate the finger (to be
164 positioned on the rear part of the phone), and the phone camera is used as PPG light-receptor²¹. The
165 performance of HR measurement from a conventional ECG, a finger pulse oximeter and four PPG based
166 smartphone applications have been compared²². It has been shown that HR estimates from ECG are well
167 correlated with those from pulse oximetry, and from apps based on a PPG finger-contact measure. An
168 additional smartphone-based method relies on a non-contact PPG assessment (a video is made of the
169 subject's face by the smartphone camera and PPG is derived from the changes of the red-color band of
170 the image over time)²³. Performances of this technique are found to be significantly lower than those
171 obtained by the contact PPG^{21, 24, 25}.

172 Several consumer devices provide quantification of physical activity and posture obtained by the so-
173 called IMUs (Inertial Measurement Unit), i.e. electronic chips including a 3D accelerometer, a 3D
174 gyroscope, and sometimes a magnetometer. While the hardware technology embedded in such devices
175 is mature, the algorithms used to analyze the data are still in their infancy (i.e., distance measurements
176 accuracy depending on speed). Hence, the raw data obtained by the sensors are reliable, but how this
177 information is processed for quantification of a subject's activity and clinical utility needs more
178 research²⁶.

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183 GAPS IN KNOWLEDGE

- 184 • Standardization of gold-standard to be used in validation protocols; for validation of HR-related
185 measures, we recommend the use of clinical ECG equipment; for validation of activity
186 measures, we recommend the use of video-camera recordings.
- 187 • Exact definition of range of measures and conditions in which the accuracy has been tested
188 should be defined (i.e., posture-dependent, range of HR, range of walking speed, subject
189 population, and for PPG skin colour, external light conditions, contact pressure).
- 190 • The variability (i.e. test-retest reliability), bias and limits of agreement of the measurements
191 should be reported.

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206 **SECTION 2: HEART RATE AND ACTIVITY TRACKING FOR PRIMARY AND**
207 **SECONDARY PREVENTION**

208 Resting Heart Rate (RHR)

209 In individuals from the background population without known cardiovascular disease, elevated resting
210 heart rate (RHR) has been shown to be associated with higher blood pressure, higher body mass index,
211 impaired pulmonary function, lower levels of physical activity and with increased subclinical chronic
212 inflammation²⁷⁻²⁹. Although RHR is closely related to VO_{2max} , its association with mortality is not
213 explained by poor fitness alone³⁰. There is consistent epidemiological evidence of a significant
214 independent relationship between elevated RHR and increased risk of cardiovascular events and
215 mortality in general populations²⁹⁻³⁴. While the majority of epidemiological research is based on single
216 measurements of HR, few studies have investigated the association between temporal changes in HR
217 and risk, which could be of greater relevance to wearable technologies^{34, 35}. As a result, an increase in
218 HR over time appears to be an indicator of deterioration of health³⁶. Increased heart rate at rest has also
219 been found to be associated with adverse events in patient populations such as heart failure³⁷, chronic
220 obstructive pulmonary disease³⁸, diabetes³⁹, and rheumatoid arthritis⁴⁰. Despite the well-established
221 association between elevated HR, cardiovascular risk factors, and risk of cardiovascular disease, there
222 are currently no general recommendations to guide the general public or healthcare providers in this area
223 but also no trials in the general population to show that interventions directed at elevated HR has an
224 effect on clinical outcomes³¹.

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226 Heart Rate Variability (HRV)

227 Beat-by-beat oscillations in RR interval (HRV) reflect the neural regulation on the cardiovascular
228 system, providing a simple, non-invasive means to explore the complex and dynamic balance between
229 sympathetic and parasympathetic cardiac neural influences in health and disease.^{11, 41} Low HRV is
230 associated with a number of cardiovascular risk factors, such as diabetes and hypertension, and has been

231 shown to be associated with a 32-45% increase in the risk of development of a cardiovascular event in
232 populations without known prevalent CVD⁴².

233 The availability of wearable tools to measure HRV (and possibly also by coupling with blood pressure
234 variability)⁴¹ opens new possibilities in risk prediction in secondary prevention. In particular, HRV and
235 baroreflex sensitivity analysis may allow better characterization of cardiovascular neural modulation
236 during sleep in normal and pathological conditions such as sleep apnea or serve as a prognostic tool in
237 patients with established CV diseases. For example, low HRV has been shown to be independently
238 predictive of increased mortality in post- myocardial infarction patients and heart failure patients^{43, 44}.
239 However, HRV analysis in clinical practice has never reached a wide utilization due to its limitations in
240 acquisition protocols detecting specific diseases (i.e., a lower HRV could be associated to different
241 causes, as well as unbalanced neural influences).

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243 Assessment of daily exercise behavior

244 Improvement of physical activity behavior is an important treatment target in cardiovascular prevention.
245 Numerous physical activity devices are currently commercially available, but their accuracy, however,
246 is differing considerably during walking at normal speed. Moreover, accurate assessment of physical
247 activity at lower speeds than usual walking was shown to be even more challenging.¹² A recent
248 systematic review of consumer-wearable activity trackers indicated a lower validity for assessment of
249 energy expenditure as compared to step counts.⁴⁵ Focusing on the cardiac patient population, recent
250 findings also demonstrated a low accuracy and sensitivity for estimating changes in energy expenditure
251 of modern activity trackers.^{46, 47} This illustrates the need for elaboration and definition of population-
252 specific exercise measurement algorithms. In this regard, it has been shown that the combination of heart
253 rate and accelerometric data enhances device performance on energy expenditure estimation.⁴⁸

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256 GAPS IN KNOWLEDGE

- 257 • Clinical utility of heart rate and fitness tracking for monitoring or as a target for intervention
258 need to be determined.
- 259 • Recommendations on healthy levels of heart rate at rest and during continuous activity are
260 needed, as well as recommendations for when and how to intervene or refer to specialist care.
- 261 • Methods or algorithms for translating data from continuous fitness or heart rate tracking into
262 clinically meaningful information that can be used for primary and secondary prevention are
263 needed.
- 264 • Research on how to interpret data from continuous heart rate and fitness tracking is needed

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276 SECTION 3: WHO WILL BENEFIT FROM WEARABLE TECHNOLOGY?

277 Wearables, properly selected and adopted, might be useful for both high- and low-risk individuals in
278 allowing the identification of subjects needing further investigation.

279 The large and easy availability at population level make wearables the ideal technology for identification
280 of early disease or monitoring of existing disease. For example, the use of wearables to objectively
281 monitor physical activity can be of use in primary prevention, as it is well recognized that physical
282 activity is inversely related to cardiovascular risk⁴⁹. In addition, physical activity plays a dual role for
283 patients who have experienced a cardiovascular event, both as part of cardiac rehabilitation, but also as
284 a tool to monitor treatment effects. Physical activity is a dynamic parameter, and the use of wearables
285 in heart failure populations have shown a correlation between decline in physical activity and cognitive
286 decline⁵⁰ showing the potential of wearable technologies to monitor disease states and indicate the need
287 for intensified medical attention.

288 The use of wearables as telemonitoring to reduce patient contacts may be beneficial for frail, immobile
289 patients or in times of a pandemic⁵. Dedicated patient populations can use wearable devices for
290 monitoring of disease-specific parameters, e.g. activity in heart failure patients⁴³.

291 Most currently available wearable tools are not ready to be considered medical devices,^{46,51} instead they
292 offer a daily life approach to monitor well-being, such as physical activity in leisure-time or indicating
293 the presence of irregular heartbeats. This can be done over relatively long time periods in a noninvasive
294 manner, a possibility not easily allowed by conventional methods.

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296 Previously undetected arrhythmias**297 *Atrial Fibrillation***

298 In the large consumer-driven studies of wearables for detection of atrial fibrillation (AF), younger
299 individuals dominate the study population, reflecting current ownership and adoption of wearable
300 technology^{19,52}. In contrast, AF prevalence and associated risks are mainly driven by increasing age

301 ⁵³. The performance of such wearable devices will depend on the prevalence of AF in the population
302 that is studied. Younger participants (<40 years) also experience a larger number of false-positive
303 alerts compared to the elderly ¹⁹, which may unnecessarily increase healthcare costs. In clinical studies
304 focusing on high-risk individuals, much more AF has been detected⁵⁴, enabling stroke protective
305 therapy and suggesting improved cost-effectiveness⁵⁵. For wearables to have an impact on health in
306 the population, the wearers of the devices need to be at risk of an adverse outcome and likely to
307 benefit from preventative therapy. The currently recruiting Heartline study (clinicaltrials.gov
308 NCT04276441) aims to enrol 150.000 participants to evaluate if early AF diagnosis reduces the risk of
309 thromboembolic events in a real-world setting.

310 With regard to AF, risk factors for ischemic stroke, such as age or cardiovascular co-morbidities
311 included in the CHA₂DS₂-VASc score, are generally those that are also associated with increased
312 incidence of AF⁵⁶. One would therefore expect that the use of wearables in the population, which is at
313 an *a priori* greater risk for AF and its thromboembolic complications, would be associated with greater
314 diagnostic yield and impact on risk management than indiscriminatory use of the technology in the
315 population dominated by young and healthy (Figure 2).

316 Management of known arrhythmias

317 Wearable technologies have been proven useful, sometimes even beyond their indications for use as a
318 medical device, for monitoring the effects of therapeutic interventions and documenting rhythm
319 disorders underlying typical or atypical symptoms perceived to be caused by arrhythmias.⁵⁷ A recent
320 study showed that Apple Watch ECG tracings allowed adequate QT-interval measurements⁵⁸ and
321 thereby facilitated remote QT monitoring in quarantined outpatients receiving QT-prolonging
322 treatments. However, it should be considered that in de novo classification request to FDA for the ECG
323 app it is stated that “The clinical study did not quantitatively assess the quality of the ECG waveform
324 produced by the ECG App. The ECG produced by the ECG App is not intended for clinical use or as
325 the basis for diagnosis or treatment. The ECG waveform is only intended for informational use”. In the
326 context of AF management, documentation of cardiac rhythm is pivotal for decision regarding the need

327 for re-ablation procedures or self-administration of rhythm-control drugs in situations when pill-in-the-
328 pocket strategy is employed. Nearly two thirds of patients with symptoms suggestive of AF do not have
329 the arrhythmia, as shown in the studies using implantable loop recorders⁵⁹. Wearables can provide a
330 comprehensive AF management enhancing teleconsultation during and after a pandemic, like recently
331 shown in the Telecheck-AF project⁶⁰.

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333 GAPS IN KNOWLEDGE

- 334 • Clinically relevant populations who would particularly benefit from use of wearables devices
335 for heart rate and fitness monitoring should be defined.
- 336 • Barriers, such as cost or technology literacy, should be identified and addressed in order to
337 facilitate the use of wearables in at-risk populations.
- 338 • While the wearable device ideally should be medically approved for clinical use, non-medically
339 approved devices could contain clinically useful information. A therapeutic decision based on
340 non-medical devices or off-label use of medical devices should therefore carefully weigh the
341 source of data, validity of the information as well as clinical context before a clinical decision
342 is made.

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353 SECTION 4: WEARABLES - A MEANS TO PATIENT EMPOWERMENT?

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355 Wearables are opening new avenues for patient engagement in self-management of cardiovascular
356 health and in supporting shared decision making and goal setting. The European Society of Cardiology
357 defines patient engagement as a set of behaviours by which patients take more responsibility for their
358 own health care, and health care professionals take more account of patients' health needs.⁶¹ Wearable
359 technologies may facilitate this process by enabling patients to self-monitor a range of aspects of health,
360 including activity, body weight, heart rate and rhythm, blood pressure, blood glucose, and fatigue.⁶² This
361 may also promote dynamic exchange of data with health professionals through visualization.

362 Visualization of health data has been mainly associated with electronic health records (EHR), gaining
363 widespread adoption in the last two decades. A more recent approach aims to integrate data between
364 EHR and medical devices, wearables and fitness tracking devices (a large number of existing wearables
365 are EHR-compatible and this number is expected to increase exponentially). Mobile integration
366 platforms, such as Google Fit and Apple HealthKit, pool data from multiple health apps and have the
367 potential to integrate it with EHR, promoting visualization.⁶³ However, there are concerns on data
368 privacy and third-party utilization that would require further clarification.

369 One of the most advanced applications of health visualization is building an avatar using health
370 information from a wide range of sources, including wearables. This enables a level of personalization
371 of health that is key in facilitation of behaviour change. Personalization or tailoring is defined as any of
372 a number of methods for creating communications individualized for their receivers.⁶⁴ Personalization
373 techniques, such as gamification, rewarding, goal setting, feedback and inter-human interaction
374 maximize the opportunity for personal engagement.⁶⁵ Personally controlled data alters power dynamics
375 in health care, improving democratization of health.

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378 GAPS IN KNOWLEDGE

379 - Value-based initiatives to increase patient activation and engagement using wearables are needed.

380 - Studies exploring the ability of a technology to maintain engagement over time (>3 or 6 months).

381 - Tools and methods to characterize patient preference, increase personalization and improve
382 engagement are needed.

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397 **SECTION 5: WHAT ARE RELEVANT CLINICAL EVENTS OF INTEREST FOR**
398 **PREVENTION USING WEARABLES?**

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400 The use of continuous data using wearables is likely to challenge and expand our traditional way of
401 thinking on clinical events of interest. Wearables have the potential to detect early markers of disease in
402 “real-time” or with a close temporal relationship to physiological changes and are therefore particularly
403 suited for prevention. The conventional endpoints used for preventive measures and clinical
404 epidemiology typically include all-cause mortality, cause-specific mortality or single or aggregate
405 comorbid endpoints based on administrative registers or other means of sampling information. Other
406 cause-specific endpoints can be used, for instance incident atrial fibrillation or detection of other
407 arrhythmias. Ideally, a marker of risk should be detected before a traditional endpoint/ clinical event (e.g.
408 manifest hypertension, atrial fibrillation, myocardial infarction, sudden death) occurs. More transient
409 endpoints may be relevant– for instance, markers of physiological stress, and may potentially detect the
410 very early markers of clinical events such as myocardial infarction or stroke. Heart rate monitors would
411 be able to detect increase in heart rate at rest, increase in heart rate during night-time, or other
412 physiological markers. With the introduction of other wearable sensors (e.g. blood glucose), the
413 potential for early detection of disease and risk would increase. Increased resting heart rate has been
414 shown to predict future hypertension⁶⁶, which in turn is associated with increased risk of manifest
415 cardiovascular disease. There is currently no recommendations, knowledge or consensus on how to
416 advice individuals or the public in terms of very early markers of risk using wearable technology
417 including heart rate or fitness trackers.

418 Information from wearables may be particularly useful in nudging or educating patients or caregivers
419 about the effects of patient activities, underlying medical conditions and treatments. Ideally, these
420 devices also help to support diagnosis and to tailor treatment strategy. The potential value of this
421 technology is that the feedback loop can be shortened by offering automated input for immediate
422 modification of therapy and behaviour. In this context, the data generated should be diagnostically
423 meaningful, informative regarding the treatment effect and of prognostic value. Wearables may

424 therefore allow a move towards “value-based pricing” (programs/drugs/interventions paid for if they
425 lead to results) as well as allowing a more holistic assessment of the value of any intervention to that
426 individual.

427 GAPS IN KNOWLEDGE

- 428 • Clinical endpoints and relevant events of interest need to be defined in the area of continuous
429 monitoring in cardiovascular prevention.
- 430 • Exploration of relevant immediate, intermediate or clinical endpoints are needed.
- 431 • Research in the area of continuous heart rate and fitness tracking needs to be explored
432 particularly for non-classical clinical endpoints such as quality of life and psychosocial factors.
- 433 • Early markers of disease should be explored in the area of continuous monitoring.

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445 SECTION 6: ARE THERE POTENTIAL ADVERSE CONSEQUENCES OF WEARABLES?

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447 There are several areas where wearable technology may have adverse consequences, including
448 unintended modification of behavior, unintended creation of big datasets and its misuse, privacy and
449 security issues, challenges facing regulatory bodies regarding safety and data interpretation, and lack of
450 validation when used for health promotion.⁶⁷

451 Wearables provide feedback on physiological and exercise parameters, giving users an opportunity to
452 modify health behaviours. In a minority of individuals, this may lead to increasing anxiety about health,
453 to device addiction, or to self-diagnosis or even to self-medication or self-management of clinical
454 conditions.^{68, 69} Patients could also suffer from negative consequences of excessive self-monitoring by
455 finding it uncomfortable, intrusive, and unpleasant. Wearables may provide false assurances to the
456 patient, with inaccuracy of activity trackers leading individuals to overestimate their level of physical
457 activity, limiting the effectiveness for lifestyle interventions.⁷⁰

458 Users who buy wearable devices today do not necessarily “own” their data. Instead, the individual’s
459 data is usually collected and stored on cloud servers by the manufacturer. This can create a paradox for
460 the user in that they own the device, but not the captured data. The creation of such big datasets derived
461 from an individual’s physiological data will have privacy and data storage / security implications, with
462 the potential to expose patients to safety and cybersecurity risks, as has been the case in cardiac
463 electronic implanted devices⁷¹, having their technology infected with malware and vulnerability to
464 unauthorized access through hacking.

465 Regulatory bodies do not regulate wearable sensors/ devices designed purely for lifestyle purposes, such
466 as smartwatches that generally promote health and fitness.⁷² In contrast, apps with medical purposes
467 (diagnosis, prevention, monitoring, treatment or alleviation of disease) are currently classified as
468 “medical devices” by both the FDA⁷³ and the European Union, where the new Medical Device
469 Regulation (entering in force starting May 22 2021) will strengthen the rules for obtaining certification.

470 Also, wearable devices are marketed as a means to improve general health and fitness, but manufacturers
471 are not required to provide data to support the accuracy and effectiveness of their products. Furthermore,
472 the use of wearables for cardiovascular health screening may medicalize healthy individuals, resulting
473 in unnecessary medical investigations with possible patient harm and increased cost. False negatives
474 can cause a potentially fatal condition to be missed while false positives can lead to overtreatment and/or
475 anxiety.⁷⁴

476 Furthermore, wearables may contribute to increasing the health inequalities and inequities in society,
477 where those without access to these technologies (because of economic considerations or digital literacy
478 issues) may become more disadvantaged. However, with decrease in cost of wearables devices and
479 higher penetration of digital literacy this challenge may be attenuated in the near future.

480 Lastly, increased downstream testing and overtreatment with potential increase in cost and patient harm
481 is a concern, especially when no clear definitions on indications for treatment or referral are established.

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483 GAPS IN KNOWLEDGE

- 484 • Data to show efficacy of wearable devices in improvement of meaningful clinical outcomes
485 in asymptomatic patients without clinically manifest cardiovascular diseases
- 486 • The occurrence of unintended behavioural changes due to the use of devices and the
487 resulting adverse clinical events in the population.
- 488 • The health economic consequences of wearables should be determined, including benefits
489 of early detection and risk of unnecessary downstream testing and overtreatment

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493 **SECTION 7: DATA SECURITY AND PRIVACY OF HEART RATE AND ACTIVITY**
494 **TRACKERS IN THE LIGHT OF NEW EUROPEAN LEGISLATION**

495 When dealing with wearable technology in the context of cardiovascular health promotion, knowledge
496 of the current legislation at EU level is needed.

497 The presence of a privacy policy is often lacking in most current commercially available heart rate and
498 activity tracking technologies. In a review of the most downloaded health and fitness apps, the majority
499 of apps did not have a privacy policy, while 74% of them gathered information classified as “sensitive”,
500 sharing the collected data with a third party⁷⁵.

501 The EU General Data Protection Regulation (GDPR) 2016/679, effective since May 25 2018, has
502 extended the concept of personal data to any information (a name, a photo, an email address, bank
503 details, posts on social networking websites, medical information, or a computer IP, or also genetic,
504 mental, cultural, economic and social data) related to a natural person or ‘Data Subject’ that can be used
505 to directly or indirectly identify the person. Also, it has widened its jurisdiction, as it applies to all
506 companies processing the personal data of data subjects residing in the EU, regardless of the company’s
507 location. In addition, GDPR extends liability from Data controller to all parties that get in touch with
508 the personal data, together with the principle to hold and process only the data absolutely necessary for
509 the completion of its duties (data minimization principle), as well as not to change the use of the data
510 from the purpose for which it was originally collected. These changes should be reflected in the consent
511 form that is provided with any tracker or activity app that require the subject to be enrolled in order to
512 access the service.

513 The EU Medical Device Regulation (MDR) 2017/745, which will become effective starting May 26
514 2021 extends the definition of medical device (any instrument intended by the manufacturer to be used
515 for human beings for the purpose of diagnosis, prevention, monitoring, treatment or alleviation of
516 disease) to prediction and prognosis, thus including all digital health apps that have an intrinsic tendency
517 to collect and evaluate physiological data, including wellness technologies, as well as predictive models,

518 risk calculators, artificial intelligence. This could lead to the qualification as medical device for tools
519 and software that are nowadays not under this category, as well as to the classification in higher classes
520 of current class I medical devices, taking into account the intended purpose and the inherent risks⁷⁶.

521 In particular, software intended to monitor vital physiological parameters (heart rate, blood pressure,
522 respiration) could be classified as Class IIb, if the nature of variations of those parameters could result
523 in immediate danger to the patient (depending on patient disease and associated risk).

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525 GAPS IN KNOWLEDGE

526 Current legislation is not specific for novel technologies, such as wearables, that need different criteria
527 to be tested, verified, and updated. It is important that professional medical associations such as the ESC
528 follow the process of creation of new legislation in this field and to inform lawmakers on specific needs
529 and risks related to healthcare in general and wearable technology in particular.

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- 531 • It should be established to what extent healthcare professionals should be informed about data
532 security and privacy of a device / health and fitness app.
- 533 • It should be established in what way patients are informed about data storage and transfer to
534 third parties when using a heart rate and activity tracker.
- 535 • Data safety and integration with other health platforms should be addressed.
- 536 • The ability of patients to opt out should be verified.
- 537 • Standards for accreditation processes should be established to avoid relying on developer self-
538 certification to ensure adherence to data protection principles.

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543 SECTION 8: Wearables and the COVID-19 Pandemic

544 The pandemic of coronavirus disease (COVID-19), a disease caused by severe acute respiratory
545 syndrome coronavirus 2 (SARS-CoV-2), has impacted clinical cardiology practice and the use of digital
546 health. Patients with chronic cardiac diseases such as heart failure, arrhythmia, coronary artery disease,
547 and congenital heart defects are traditionally followed including face-to-face contacts during outpatient
548 visits⁷⁷⁻⁷⁹. Due to the COVID-19 pandemic, outpatient visits of chronic patients have been replaced by
549 virtual visits to limit disease transmission⁸⁰. Chronic cardiac patients need regular care and are at
550 increased risk of infection with COVID-19 with worse outcome⁸¹. Wearables should be considered in
551 these vulnerable patients to continue regular care⁸², to reduce risk of transmission, and to diagnose
552 COVID-19 infection early⁸³. Wearables can also supplement conventional diagnostic testing for public
553 health surveillance to track (asymptomatic) persons who can transmit SARS-CoV-2 to others⁸⁴.
554 Wearables certified as medical devices have been shown able to track healthcare workers health status
555 or to measure QT intervals⁸⁵. Zhuo et al. demonstrated that medical and nursing staff with insomnia
556 showed clear signs of comorbid sleep apnea attributable to stress⁸⁶. Wearables can be used to perform
557 monitoring of vital signs such as oxygen saturation, respiratory rate, blood pressure, body temperature,
558 but also pulmonary auscultation, electrocardiograms, and cough monitoring⁸⁷. SpO2 measurement is
559 available as both stand-alone finger oximeters and as smart phone systems, although the accuracy of the
560 latter has been questioned⁸⁸. There are, however, also important challenges on wearables and COVID-
561 19. Whereas only a few COVID-19 wearables studies are expected to generate high-quality evidence,
562 the majority of recently initiated studies are expected to have a concerning low level of evidence⁸⁹. A
563 joint decision with the patient (shared decision making) to switch to remote care with wearables is
564 recommended. The many political, economic, and time-consuming barriers could be considered
565 discouraging for a quick introduction of wearables to monitor cardiac diseases in the COVID-19 era.
566 However, the COVID era without a doubt has been of enormous importance for the general adoption
567 and clinical implementation of digital health and wearable devices. The rapid initiation could possibly
568 lead to the much needed will and decisiveness to create sustainable tools, to arrange for financial
569 compensation, and to perform high-quality clinical outcome studies.

570 GAPS IN KNOWLEDGE

- 571 • Large-scale evidence of the efficacy of wearables to diagnose and manage COVID-19 in cardiac
572 patients is lacking
- 573 • The ideal physiological marker available for wearable technology to monitor, diagnose and
574 manage COVID-19 with cardiac diseases need to be determined.
- 575 • How to implement these findings from the individual user to a population level relevant for a
576 pandemic needs further consideration.

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591 **CONCLUSION**

592 The introduction of wearables represents an unprecedented situation in primary and secondary
593 prevention of cardiovascular disease in relation to availability of low-cost physiological data,
594 “democratization” of health information, and possibility for early detection of disease or risk factors for
595 disease. There are, however, significant issues and barriers that need to be addressed before wearables
596 can be translated from nice-to-have consumer gadgets to clinical utility in the context of primary and
597 secondary prevention. Health care providers are being presented with information from commercially
598 available wearables with increasing frequency. However, there are presently no concrete guidelines for
599 primary care physician or cardiologist on how to use, interpret or act on information from wearables.
600 Even with the present absence of clinical evidence, the need for guidance is increasing to support the
601 clinician faced with the daily challenges in the management of information from wearables. We
602 encourage the professional associations of the European Society of Cardiology to develop clinical
603 recommendations to guide the cardiologist in their respective fields. The present Position Paper
604 represents a constructive framework for directing future research and policy issues in relation to use of
605 wearables for cardiovascular prevention and the implementation into clinical care.

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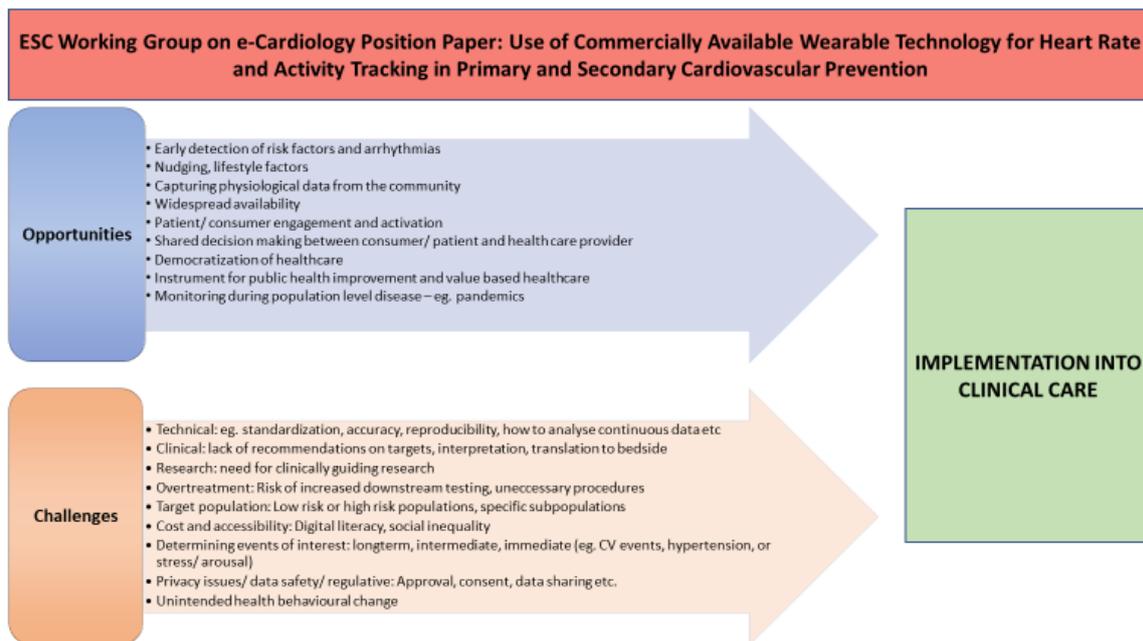
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888 Figure 1: Overview of Opportunities and Challenges in the use of Commercially Available Wearables
 889 for the implementation into clinical care

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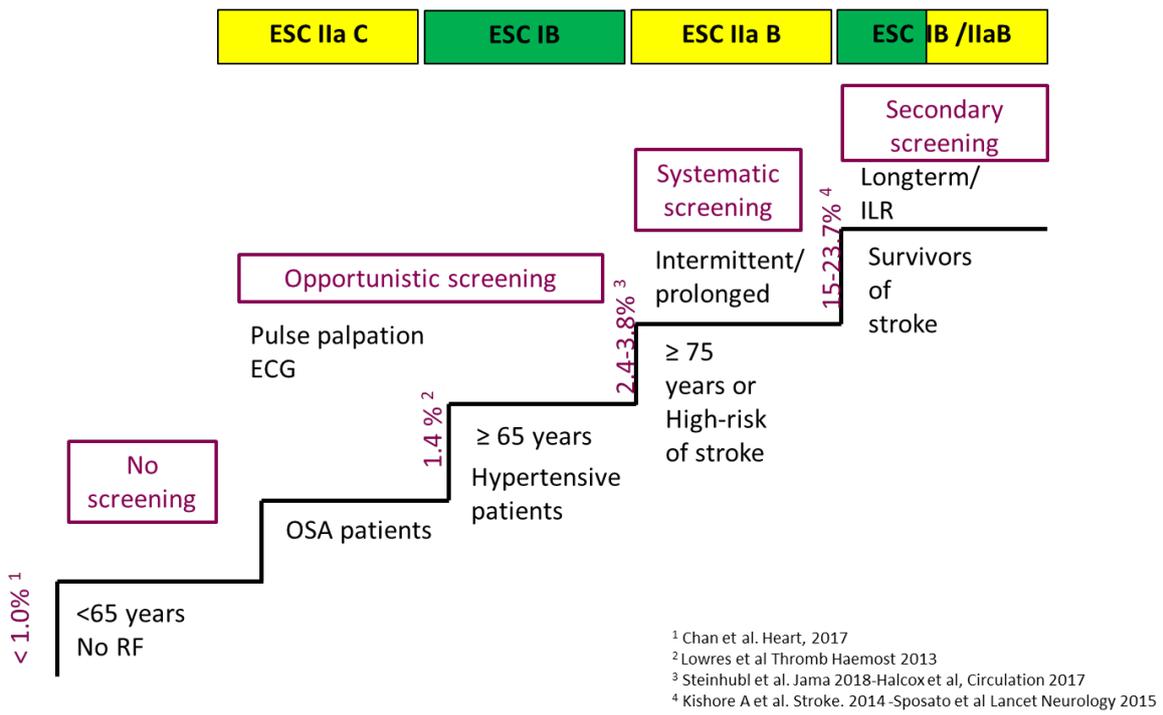
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906 Figure 2: recommendations for screening of atrial fibrillation

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