

29 **Introduction**

30 Policymakers and practitioners worldwide are advocating for sustainable development. This is
31 in line with the need to abate environmental problems (i.e. greenhouse gas emissions) and to
32 improve the standard of living of all income categories through economic development and
33 social equity. Towards these sustainable development goals, one of the fundamental areas of
34 focus has been housing. Thus, sustainable housing has become a policy goal globally with
35 much emphasis on developing countries because of under development and imminent socio-
36 economic problems. The pursuit for sustainable housing is evinced in the United Nations (UN)
37 policy goal. Target 11.1 of the Sustainable Development Goal II states: ‘By 2030, ensure access
38 for all to adequate, safe and affordable housing and basic services and upgrade slums’ (UN,
39 n.d.). Ghana – a developing country – is no exception from this clarion call considering the
40 country’s housing affordability challenges, energy crisis and expected escalation of greenhouse
41 gas emissions (Arku et al., 2012; Djokoto et al. 2014; Gyamfi et al., 2018).

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43 Inadequate housing supply and housing affordability challenges are critical problems in major
44 cities in Ghana. Estimated extra dwellings of 2,755,000 are required over 2000 in 2020 to curb
45 the housing crisis in urban areas (Ghana Housing Profile, UN-Habitat, 2011). Accra, the
46 nation’s capital, suffers the most egregious housing shortage because of a continual flow of
47 migrants and current influx of non-Ghanaian residents (Luginaah et al. 2010). The inadequate
48 supply of housing has led to a high level of overcrowding, mainly in the poorest neighborhoods
49 (Arku et al., 2012). Approximately 60 per cent of the residents in Accra and other urban
50 households live in single rooms (Ghana Housing Profile, UN-Habitat, 2011). A study
51 conducted by Arku et al. (2012) revealed the crisis in Ghana’s rental market of which tenants
52 expressed profound concerns about long-term advance rents, rising rent costs, threats of
53 eviction, breaches of rental agreements and long searches for units. As such, it has been

54 pressing on current and successive governments to embark on innovative measures of housing
55 supply to meet the increasing Ghanaian population in most cities especially in Accra.

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57 Compounding the housing affordability challenge is energy crisis. For instance, about 25%
58 shortage of peak power was reported in 2014 - 2015. Besides, though the annual energy demand
59 growth is estimated to be 10%, the installed capacity of the country has grown by only 7%
60 (Gyamfi et al., 2018). Partly responsible for this energy supply-demand hiccup is increasing
61 burden on the national grid with inefficient electrical appliances by households (Gyamfi et al.,
62 2018). Consequently, there is an imbalance between demand and supply of electric power. This
63 is evinced in the frequent interruptions in electric power supply (load shedding) and total
64 blackout in some occasions (Diawuo et al., 2019). Moreover, rapid economic development in
65 Ghana towards middle-income status has led to increase per capital income (Gyamfi et al.,
66 2018). Therefore, the number of households who can afford major appliances is expected to
67 increase (Diawuo et al., 2019). Speculatively, the energy gap could even be wider due to the
68 economic development and population growth (Sakah et al., 2019).

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70 Considering the housing affordability and residential energy crises, governments' strides to
71 provide sustainable housing could have immense benefits. Sustainable housing refers to
72 housing that is reasonably adequate in standard and location for a whole range of households
73 and does not cost so much that a household is unlikely to meet other basic living costs on a
74 sustainable basis (National Summit on Housing Affordable, 2006). In addition to alleviating
75 the negative effects of the country's housing price / rent affordability challenges, energy crisis
76 and greenhouse gas emissions, sustainable housing could improve the quality of life and
77 enhance residents' health. It could also lead to cost saving to households over the lifecycle of
78 the housing facility (Birkeland, 2012; Ansah et al., 2020). However, attaining these potential

79 benefits of sustainable housing has been marred by barriers. Successive governments in the
80 past decades made commitments for aiding parastatal organizations such as State Housing
81 Cooperation (SHC), Tema Development Cooperation (TDC) and Social Security and National
82 Insurance Trust (SSNIT) to improve supply in public housing (i.e. a form of housing tenure in
83 which the facility is fully owned by a government authority or assigned organization). Some
84 of these houses are often tagged by varied forms of names such as ‘public housing’, ‘state
85 housing’, ‘affordable housing’ or ‘low-cost housing’. Notwithstanding the essence of such
86 governments’ role, Arku et al. (2012) acknowledged that such commitments faltered since the
87 early 1990s. Although most of these institutions now operate as private institutions following
88 neoliberalization in the 1990s, the state mostly provides an enabling environment. One of the
89 enablers provided by governments is the financing of infrastructure development to motivate
90 housing supply. Besides, some of the institutions that assist the private sector in housing
91 delivery are relatively strengthened. Moreover, various incentive schemes have been provided
92 by the state; some of which are available to private developers such as the Ghana Real Estate
93 Developers Association (GREDA) and suppliers of locally produced building materials. An
94 example is tax enticement (i.e. reduction of corporate tax from 55 per cent to 45 per cent, a
95 five-year tax holiday) (Arku, 2009). Despite the state’s largess, housing supply among most of
96 these formal institutions have only remained at most 10%. On energy efficient housing,
97 retrofitting incentives from successive governments have also not been adequate to curb the
98 energy crisis of households. Therefore, assessing the impact of barriers is important to better
99 developing policies for sustainable housing in the Ghanaian construction industry (Adabre et
100 al., 2020).

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102 This study seeks to develop a sustainable housing model by establishing a relationship between
103 barriers and indicators of sustainable housing. The study findings could inform the government

104 and other decision makers on the potential barriers and the possible strategies for sustainable
105 housing. Besides, findings of the study seek to apprise policy-makers of the indicators that are
106 relevant for defining the scope of sustainable housing in the Ghanaian housing sector. This
107 study is organized as follows: It begins with an elaboration on the housing affordability and
108 energy crises in Ghana. Then, indicators of sustainable housing and barriers to sustainable
109 housing are identified from a comprehensive literature review. Next, through a questionnaire
110 survey, data are collected on the potential indicators and barriers. Subsequently, the data are
111 analyzed. This is followed by a discussion on the results and drawing conclusion and
112 recommendations to policymakers and practitioners for sustainable housing development
113 especially in urban areas.

114

115 **Literature Review**

116 Studies have espoused the triple-bottom-line (TBL) approach to explain the concept of
117 sustainability. The TBL principle includes the environment, economic and social facets of
118 sustainable development (Yang & Yang, 2015). Thus, sustainable housing seeks to optimize
119 the environmental, economic and social goals. Additionally, contemporary studies have
120 advocated for an institutional or governance element as the fourth dimension to facilitate the
121 execution of sustainable housing (Adabre et al., 2020). Various concepts such as ‘low-carbon’,
122 ‘zero-energy’, ‘green building’ and ‘high performance’ have been used to describe sustainable
123 housing. A general definition according to the National Summit on Housing Affordable (2006)
124 indicates that sustainable housing is housing that meets the needs and demands of the present
125 generation without compromising the ability of future generations to meet their housing needs
126 and demands.

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128 Subsequently, the UN-Habitat (2012 p. 9) cited in Smets & van Linder (2016) provided a
129 comprehensive definition of sustainable housing. Sustainable housing includes: ‘houses that
130 are designed, constructed and managed as quality and safe facilities; price or rental affordable
131 for the whole range of income levels, using environmental-friendly and affordable building
132 materials and technology; connected to decent, safe and affordable water, energy, sanitation
133 and recycling facilities; energy and water efficient and equipped with certain on-site renewable
134 facilities; suitably located with regard to jobs, shops, health-care, education and other services;
135 properly integrated into and enriching the cultural, social and economic fabric of the local
136 community and the wider urban areas and adequately operated, maintained and timely
137 refurbished and retrofitted’. While maintaining most of the indicators of sustainable housing
138 as stated in UN-Habitat (2012), Adabre & Chan (2018) expatiated further on sustainable
139 housing indicators at the project phases of housing. Accordingly, sustainable housing project
140 should be timely completed as budgeted (cost performance) at the required quality without
141 project-related disputes and litigation and guaranteeing stakeholders’ satisfaction. Moreover,
142 ‘end-user satisfaction’, ‘take-up rate of housing facility’ and ‘waiting time of potential
143 household before being allocated a facility’ were suggested as essential indicators after the
144 project management phase. Combining the indicators from these studies (i.e. UN-Habitat,
145 2012; Adabre & Chan, 2018), Chan & Adabre (2019) established a set of 21 indicators,
146 following an international survey, as possible critical success criteria for measuring sustainable
147 housing. The 21 indicators from Chan & Adabre (2019) are adopted and adapted for this study.

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149 Attaining at least one of the sustainable development goals in housing has been a challenge in
150 Ghana notwithstanding the evolution of policies. Following the era of neoliberalization from
151 the 1990s, successive governments adopted austerity measures to reduce public housing supply
152 due to inadequate fiscal resources. Besides, these measures were recommended by

153 multinational organizations such as the World Bank. Accordingly, the state's funding for
154 housing reduced from about 6.5 per cent to 1-2 per cent. Consequently, the operations of
155 parastatal organizations (such as TDC, SHC, SSNIT, SIC etc.) that provided state housing for
156 civil servants were affected. Most of these institutions currently operate as private institutions.
157 As such some rental facilities were privatized as owner facilities, in part, due to maintenance
158 cost burden. Moreover, the tax law, which taxed 'unearned' rental income higher than 'earned
159 salaries' in addition to rent control law and planning regulations on compound houses has
160 adversely affected the availability and affordability of rental facilities and the general
161 affordability situation in urban areas. Though the state currently provides an enabling
162 environment for most of these institutions and private developers (such as GREDA), price /
163 rental affordability crisis of housing remains an intractable challenge to the majority middle-
164 and low-income earners in urban centers.

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166 On price / rental affordability of the Ghanaian housing market in Accra, Arku et al. (2012)
167 posited that the housing affordability challenges are due to 'constraints in land acquisition',
168 'income inequality', 'rising cost of building materials', 'high cost of capital and inadequate
169 financing schemes for housing'. Furthermore, through descriptive statistical analysis, Owusu-
170 Ansah et al. (2019) found that the underlying barriers that hinder housing development in urban
171 Ghana include: 'high interest rates', 'complex loan provisions', 'complex tenure arrangement
172 on land acquisition', 'difficult land registration process', 'lengthy permit approval', 'high
173 approval and registration fees', 'high cost of serviced land and construction materials',
174 'inadequate skilled labor', 'undeveloped mortgage market', 'housing price inflation' and
175 'inadequate infrastructure'. Moreover, Agyemang & Morrison (2018) highlighted 'lack of
176 central government commitment', 'weak enforcement of planning legislation on land
177 development', 'inadequate autonomy of local planning departments', and 'the dominance of

178 customary land ownership and informal housing supply system’ as the core barriers that could
179 impede effective policies for successful affordable housing projects. Twumasi-Ampofo et al.
180 (2014) averred that insufficient maintenance and policy instability (abandoned or neglected
181 public housing facilities by succeeding governments) are possible causes of the housing deficits
182 in Ghana.

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184 Considering that price or rental affordability is a modicum of the overall sustainable
185 development Goals, global policies are geared towards sustainable housing. Yet, attaining the
186 indicators of sustainable housing is often hindered by various barriers in developed and
187 developing countries. Using a questionnaire survey and interviews, Yang & Yang (2015)
188 identified some barriers to sustainable housing from the views of professionals in the
189 Australian housing industry. ‘High upfront cost’, ‘inadequate fiscal incentives’, ‘inadequate
190 code of policies as guidelines’, ‘slow administrative process in certifying and policy-making’
191 and ‘inadequate subsidies’ were recognized as barriers to sustainable housing. Besides, Sourani
192 & Sohail (2011) conducted a study in the UK on the overriding challenges faced by public
193 clients on sustainable development. Through an interview, 12 barriers were identified. Some
194 of the highly ranked barriers include: ‘lack of funding’, ‘restrictions on expenditure and
195 reluctance to incur higher capital cost’; ‘insufficient and inconsistent policies, regulation and
196 incentives’. Among developing countries, a study conducted by Durdyev et al. (2018) in
197 Malaysia found ‘high upfront cost of sustainable technologies’, ‘inadequate incentives’ and
198 ‘lack of codes and policies’ as key barriers to sustainable construction. In China, Shi et al.
199 (2013) stated that additional cost, time and inadequate information are critical barriers to green
200 construction. On land accessibility, Hu and Qian (2017) concluded that inadequate access to
201 land for housing supply to low-income earners was a critical concern in China. This was found
202 to be a typical case in fiscal autonomous cities that are dependent on land finance. Furthermore,

203 comparative studies among two or more countries have often revealed common barriers. For
204 example, Chan et al. (2016) conducted a comparative study among the United States of
205 America, Canada and Australia using a questionnaire survey. They found that ‘high extra cost
206 of adopting green measures’ was a common barrier to sustainable development among these
207 countries. Besides, by analyzing an unbalanced panel data of 48 developing countries from
208 1996 to 2016, Sulemana et al. (2019) found evidence of a positive correlation between
209 urbanization and income inequality in sub-Saharan African countries. It was concluded that
210 income inequality could lead to inadequate access to housing in most urban centers.

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212 Moreover, inadequate upgrading of unsustainable aged housing facilities to sustainability
213 standards is among the barriers to sustainable housing. According to Gianfrate et al. (2017),
214 cultural aspects, social aspects, user behavior / comfort and cultural values are some of the
215 social barriers that can lessen the frequency of efficient retrofit initiatives. Retrofitting of
216 housing is often compromised by cost saving objectives, low-end / inadequate guidelines or
217 standards and inadequate maintenance operation, which eventually cause performance
218 obsolescence in housing facilities. On similar study about retrofitting in Australia, Alam et al.
219 (2019) developed a comprehensive list of barriers that impede the upgrading of public stock to
220 energy efficient facilities. Through thematic analysis, some of the barriers identified include:
221 ‘inadequate political commitment’, ‘financing protocols’ and ‘misaligned incentives’. In the
222 case of Israel, Friedman et al. (2014) found that retrofit costs are higher than the expected
223 benefits. Thus, except for roof insulation, most of the retrofit strategies were not cost effective
224 to households. Even for roof insulation, its payback period is very long. Similarly, Desogus et
225 al. (2013) concluded that though thermal performance upgrades of housing facilities are
226 compulsory, they are not cost effective in a mild Mediterranean climate region (such as Italy)
227 regarding payback time. In the case of UK, Dowson et al. (2012) stated that ‘lack of appropriate

228 skills' and 'cost-effective components' are major barriers to the effective implementation of
229 the Green Deal scheme.

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231 In the Ghanaian construction industry, some of the barriers identified bear resemblance to the
232 barriers from general literature. Djokoto et al. (2014) conducted a questionnaire survey on
233 barriers to sustainable construction. The data were analyzed using relative importance index.
234 Among the top 10 ranked obstacles, three are related to inadequate policy for sustainable
235 construction (i.e. lack of building codes & regulation; inadequate strategies, lack of
236 measurement tool); while two of the obstacles are related to higher cost of sustainable
237 technologies (i.e. higher investment cost; higher final cost). Other barriers such as 'inadequate
238 local professional skill' and 'lack of government support' (i.e. inadequate public funding and
239 inadequate incentives) were identified. Similarly, using mean score analysis of questionnaire
240 data, Ametepey et al. (2015) concluded that the top five challenges to sustainable construction
241 include: 'low level of government's commitment', 'fear of incurring high cost for sustainable
242 construction', 'inadequate local professional skills' and 'lack of sustainable construction
243 regulations'.

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245 In summary, Table 1 shows the various barriers identified from the comprehensive literature
246 review. It can be concluded from the literature review that though the indicators stated by the
247 UN-Habitat (2012), Adabre & Chan (2018) and Chan & Adabre (2019) could provide a broad
248 approach for measuring the general concept of sustainable housing, the prioritization of these
249 indicators could vary from country to country based on the context and socio-economic
250 problems. Therefore, it is important to identify the indicators that are of priority for sustainable
251 housing in the Ghanaian housing market. It can also be surmised from the literature that most
252 studies on sustainable housing provide separate analysis on indicators of sustainable housing

253 on one hand and / or barriers to sustainable housing on the other hand. As such, there is dearth
254 study on the influence of the barriers on the indicators of sustainable housing. To ensure
255 effective decision making, it is essential to assess how the barriers could influence the potential
256 indicators of sustainable housing from the Ghanaian perspective. This could aid policymakers
257 and practitioners on the strategies of resource allocation vis-à-vis the influence of the barriers
258 in Ghana and other sub-Saharan African countries that face similar challenges (Adabre et al.,
259 2020; Croese et al., 2016). Therefore, this paper seeks to bridge the knowledge gap by
260 developing a model of barriers impact on sustainable housing.

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[Please, insert **Table 1. Barriers to Sustainable Housing**]

294 **Conceptual Model**

295 Based on the literature review on the indicators of sustainable housing and barriers, a
296 conceptual model was developed. The barriers are categorised into three main groups, namely,
297 ‘cost-related’, ‘incentive-related’ and ‘retrofit-related’ barriers. These three main groups are
298 developed based on the theme of their underlining barriers and based on classifications from
299 previous studies (i.e. Gianfrate et al., 2017; Adabre et al., 2020). Cost-related barriers include
300 ‘delays in permit approval’; ‘high upfront cost of materials and technologies for sustainable
301 housing’; ‘high cost of land’; ‘high interest rates’; ‘high inflation rate’; ‘high cost of permit
302 approval’ and ‘income inequality’. Though ‘delays in permit approval’ could be an incentive-
303 related barrier, it was considered as a cost-related barrier from the Ghanaian perspective. This
304 is because high interest rates as noted in the case of Ghana increases cost of capital. Therefore,
305 ‘delays in permit approval’ could further exacerbate the cost of capital and, thus, increase cost
306 of sustainable housing among developers. Regarding ‘income inequality’, as stated in Reardon
307 (2011), housing facilities are more expensive in high-income neighbourhood than in low-
308 income neighbourhood. Thus, ‘income inequality’ is a key determinant of neighbourhood
309 affordability and was, therefore, considered a ‘cost-related barrier’.

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311 Incentive-related barriers include eight underlying barriers: ‘inadequate incentives for
312 investors’; ‘inadequate access to land among developers’; ‘lack of planning control on land
313 development’; ‘inadequate subsidies on sustainable technologies’; ‘poor location of housing
314 facilities’; ‘inadequate infrastructural development’; ‘inadequate mortgage / financing
315 schemes’ and ‘tight credit conditions’ (shown in Fig. 1). The underlying barriers under
316 ‘retrofit-related’ include: ‘low level or inadequate retrofitting (maintenance operation)’;
317 ‘inadequate standards / guideline and tools for retrofitting’; ‘lack of routine maintenance / poor
318 maintenance culture of housing facilities’; ‘policy instability / abandoned public housing

319 facilities or projects’ and ‘inadequate local professional skills’ for retrofitting activities (i.e.
320 Dowson et al., 2012).

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322 **Development of Hypotheses**

323 Though the classification of the underlying barriers into the three groups is based on the themes
324 and on the literature, their categorisation will be confirmed by a confirmatory factor analysis
325 during data analysis. It is also worth noting that these categories of barriers have negative
326 impact on one another on one hand and on the three main facets of sustainable development or
327 the sustainable housing indicators on the other hand (Adabre et al., 2020). For instance,
328 ‘income inequality’ could lead to mortgage redlining by banks. This could influence ‘tight
329 credit conditions’, which is listed under ‘incentive-related barrier’. On the impact of barriers
330 on sustainable development, for example, the cost related-barriers could translate into high cost
331 of housing facilities. This could mainly affect economic sustainability (such as price or rental
332 affordability) while incentive-related barriers could mostly affect economic and social
333 sustainability. Furthermore, though retrofitting-related barriers could influence social
334 sustainability, these barriers are more likely to affect environmental sustainability due to
335 energy inefficient housing and inadequate utilization of land due to abandoned housing
336 facilities or projects. Thus, based on these epistemological assumptions on how the groups of
337 barriers interact with one another, on one hand, and among the sustainable housing indicators,
338 on the other hand, the following hypotheses were established.

339 *Hypothesis 1:* Cost-related barriers have a significant negative impact on ‘incentive-related
340 barriers’.

341 *Hypothesis 2:* Incentive-related barriers have a significant negative impact on ‘retrofit-related
342 barriers’.

343 *Hypothesis 3:* Cost-related barriers have a significant negative impact on ‘retrofit-related
344 barriers’

345 *Hypothesis 4:* Cost-related barriers have a significant negative impact on ‘sustainable housing
346 development’.

347 *Hypothesis 5:* Incentive-related barriers have a significant negative impact on ‘sustainable
348 housing development’.

349 *Hypothesis 6:* Retrofit-related barriers have a significant negative impact on ‘sustainable
350 housing development’.

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353 [Please, insert **Fig 1.** A Conceptual Model of the Impact of Barriers on Sustainable Housing]

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356 **Research Methodology**

357 The methodological assumptions of the conceptual model involve building the hypothetical
358 model (which has already been achieved as shown in Fig. 1) and assessing what it conveys
359 about the ‘real world’ on sustainable housing (Jaabreen, 2009). The latter normally entails data
360 collection. As observed in the literature review on barriers to sustainable housing, questionnaire
361 survey has widely been deployed for data collection (i.e. Yang & Yang, 2015; Chan & Adabre,
362 2019). Questionnaire survey offers expedient approach for data collection from a cross section
363 of participants, and it is cost-effective (Adabre & Chan, 2019). Therefore, it was utilized in this
364 study for data collection to model the impact of barriers on sustainable housing.

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366 The questionnaire contains five sections. Section one consists of questions that sought to collect
367 background data of potential respondents. Section two covered a list of indicators / criteria for

368 measuring sustainable housing. In Section three, respondents were asked to rate the importance
369 of success factors for attaining sustainable housing. Section four and five contained questions
370 on barriers and risks factors, respectively, that could hinder the development of sustainable
371 housing. This study reports only the findings on the indicators and barriers to sustainable
372 housing.

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374 For both the indicators and barriers to sustainable housing, a five-point Likert scale was
375 employed for rating the various variables. Respondents were requested to rate the importance
376 of the indicators of sustainable housing using a 5-point Likert scale of 1=not important to
377 5=very important. Similarly, respondents ranked the criticality of the barriers using a scale of
378 1=not critical to 5=very critical. The 5-point Likert scale was applied in this study due to its
379 succinctness to enable expedient response to the questionnaire. Prior to the survey, a pilot study
380 was conducted among four experts. This is important to check the validity, clarity and response
381 time of the questionnaire; this could enhance the response rate. After the pilot survey,
382 constructive comments from the pilot survey participants were used to revise and finalize the
383 questionnaire before administering it.

384

385 **Population and Sample**

386 For this study, the population of housing experts in the Ghanaian construction industry includes
387 some registered members of GREDA, members of the Ghana Institution of Surveyors (GhIS)
388 and architects among parastatal organizations (such as SHC, TDC, SSNIT, Public Works
389 Department (PWD) and Ministry of Water Resources, Works and Housing (MWRWH),
390 Architectural and Engineering Services Limited (AESL)) and researchers and other
391 professionals with expertise on sustainable housing. Though majority of the housing supplies
392 (at least 90%) are from self-builders (informal sector), this study focused on the formal

393 institutions due to their limited supplies despite the state provides an enabling environment.
394 Besides, by focusing on these easily accessible institutions, some of the study findings could
395 be relevant to the informal sector (i.e. households). Given the challenge in defining the
396 sampling frame of the population of respondents, a random sampling technique could not be
397 deployed for the selection of respondents. In such situation, non-probability sampling
398 techniques could be used to select representative sample (Darko et al., 2018). Therefore,
399 purposive and snowball were adopted in this study. The respondents were selected based on
400 purpose of the study and their willingness to participate in the survey. The purposive sampling
401 technique enables the selection of respondents based on their expertise for achieving the
402 purpose of the study. On snowball sampling, respondents were identified through referral or
403 social networks. Per the recommendation of some members of GREDA, only developers whose
404 targets include middle-income earners in Ghana were contacted.

405

406 **Questionnaire Administration**

407 The questionnaires were administered face-to-face to the participants while other respondents
408 were first contacted on phone (phone numbers were taken from a brochure that was obtained
409 from the office of GREDA). On phone conversation, the potential respondents were briefly
410 introduced to the research topic and the purpose of the questionnaire survey before soliciting
411 for their participation in the survey. Most participants whom were contacted on phone provided
412 their email addresses through which the authors sent them emails with the questionnaire
413 attached. In the sent emails, the authors entreated the participants to forward the questionnaire
414 to their colleagues who were capable of participating in the survey. Besides, some of the
415 participants were asked to suggest potential respondents. Thus, through snowballing or referral,
416 other participants were identified and contacted. Furthermore, the questionnaire was
417 administered in person to some employees of SHC, TDC, SSNIT, PWD, and AESL while some

418 members of the GhIS were contacted at their 50th Annual General Meeting, which was held in
419 Accra at GIMPA on 2nd March 2019. A total of 110 questionnaires were personally
420 administered. That was the maximum number of questionnaires that could be administered
421 based on time constraint. Forty-seven (47) valid questionnaires were returned from both emails
422 and face-to-face retrieval, which correspond to 42.7% response rate. This response rate
423 compares approvingly with that of previous survey in the Ghanaian construction industry (i.e.
424 Darko et al., 2018). Besides, Ott & Longnecker (2010) recommended that a sample size greater
425 than 30 is sufficient to meet requirement of the central limit theorem. Therefore, the 47 valid
426 responses are deemed adequate for modelling the impact of barriers on sustainable housing.

427

428 **Data Analysis Techniques - Structural Equation Modelling (SEM)**

429 To determine the impact of one or more independent variables on a dependent variable, the
430 traditional multiple regression analysis (MRA) could be used. However, in a situation where
431 the dependent variables are more than one, the MRA is not applicable. Besides, MRA is not
432 appropriate to simultaneously examine the relationships among independent variables on one
433 hand and the relationships between independent variables and dependent variables on the other
434 hand. In this study, the dependent variables (indicators of sustainable housing) are more than
435 one. Hence, a more robust multivariate method known as structural equation model (SEM) is
436 espoused. SEM allows a concurrent evaluation of a set of relationships among constructs of
437 barriers (independent constructs) on one hand and relationships between one or more constructs
438 of barriers and the sustainable housing construct (dependent construct), on the other hand.
439 Therefore, with the use of SEM, the stated hypotheses in this study could be tested (Lee et al.,
440 2011).

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442 Prior to using SEM, it is essential to specify two main variables, namely, latent variables and
443 observable variables. Latent variables are variables that are not directly measured but are
444 inferred or measured indirectly from observable variables. However, observable variables can
445 be measured directly. Relating these two types of variables to this study, sustainable housing
446 is a latent variable that can be inferred from the set of 21 indicators (as listed in Fig. 1 under
447 *indicators of sustainable housing*). These indicators are collectively referred to as observable
448 variables (henceforth referred to as indicators). Similarly, ‘cost-related’, ‘incentive-related’,
449 and ‘retrofit-related’ barriers are all latent variables while their underlying barriers are known
450 as observable variables (hereafter referred to as indicators / items of barriers).

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452 Generally, SEM involves two forms of equation models, namely, the measurement model and
453 the structural model. The measurement model shows the relationship between a construct and
454 its indicators. For instance, a relationship between sustainable housing and its indicators or
455 cost-related barrier and its indicators is a measurement model while a relationship between
456 constructs (i.e. ‘sustainable housing’ and ‘cost-related barriers’) is a structural model. SEM
457 could be conducted using covariance-based SEM (CB-SEM) or variance-based PLS-SEM. The
458 choice between CB-SEM and PLS-SEM depends on the sample size and the nature of the data.
459 A large sample size (about 200) that is normally distributed is required to accurately assess
460 model fitness in CB-SEM (Hoelter, 1983; Lee et al., 2011). However, the PLS-SEM is suitable
461 for a relatively small number of responses that are non-normally distributed. Due to these
462 characteristics of the PLS-SEM, it is widely employed in construction management and
463 sustainable development studies (Darko et al., 2018). Hence, smart-PLS version 3.2.7 was
464 adopted for this study.

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466 PLS-SEM, like other SEM techniques, is a merger of factor analysis and path analysis (Lee et
467 al., 2011). Confirmatory factor analysis (CFA) was conducted to verify the classification of the
468 various indicators under their respective constructs. After the CFA, the measurement models
469 were specified. Next, the reliability and validity of the measurement models were examined.
470 This is fundamental for specifying the structural model to evaluate the hypotheses. The
471 reliability was assessed using composite reliability and Cronbach's alpha. Both indicate the
472 internal consistency. Gefen et al. (2000) and Nunnally (1978) recommended values greater
473 than 0.70 for both composite reliability and Cronbach's alpha. Validity of the measurement
474 model was evaluated using convergent validity and discriminant validity.

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476 Convergent validity assesses the internal consistency. It checks if the measurement items
477 expected to measure each construct actually measure it and not measuring other constructs
478 (Aibinu et al., 2010). It can be evaluated by using the factor loadings of the measurement items
479 and average variance extracted (AVE). The factor loading of a measurement item is its bivariate
480 correlation with its corresponding construct. The higher the factor loading, the stronger the
481 relationship between the measurement item and its construct (Hair et al., 2014). Factor loadings
482 above 0.50 are deemed satisfactory for convergent validity. Besides, the average variance
483 extracted (AVE) of each construct should be above 0.50, which implies that at least 50% of the
484 measurement variance is captured by the construct (Fornell & Larcker, 1981).

485

486 Discriminant validity is a prerequisite for analysing hypothetical relationships between
487 constructs (Henseler et al., 2015). It was conducted to test the level at which a construct differs
488 from other constructs. Three criteria, namely, Fornell & Lacker criterion, cross loading of the
489 measurement items (indicators) and heterotrait-monotrait (HTMT) ratio of correlation were
490 conducted to assess discriminant validity. Per the Fornell & Lacker criterion, the variance

491 between a construct and itself should be higher than the variance between a construct and any
492 other constructs. In using measurement items' cross loadings to test discriminant validity, the
493 items' cross loading on a construct should be the highest as compared to the items' loading on
494 other constructs. That is, the measurement items should have higher correlation with the
495 construct that they are assumed to measure than any other construct in the model (Fornell &
496 Larcker, 1981).

497

498 After assessing the measurement model, the structural model was developed through path
499 analysis. In path analysis, the hypotheses (*Hypothesis 1* to *Hypothesis 6*) can be evaluated. It
500 is conducted to determine the path coefficients which measure the level of associations among
501 constructs. To test the significance of path coefficient, a bootstrapping technique was further
502 employed in the path analysis. Bootstrapping is a robust technique useful for estimating the
503 distribution of any statistic for any kind of distribution. Before conducting bootstrapping
504 analysis, the normality of the data was checked. This was done using the Mardia's Multivariate
505 skewness and kurtosis. Results of the PLS-SEM are shown in subsequent sections.

506

507 **Background Data of Respondents**

508 The essence of background data analysis is for assessing data credibility and for deciding the
509 appropriate tool for further statistical analysis. On the background information of the survey
510 respondents regarding the types of institution, 35%, 48% and 17% of the respondents work in
511 academic / research institutions, public sector or department and private sector or as
512 contractors, respectively. On profession, majority of the respondents (55%) are quantity
513 surveyors followed by project / construction managers (19%), architects (13%) and researchers
514 (4%). In terms of number of housing projects handled by the respondents, 52% respondents
515 have handled more than two housing projects. Concerning the years of work experience, 36%

516 respondents indicated that they have 1-5 years of work experience, 28% respondents had 6 -10
517 years of work experience, 21% had 11-15 years of work experience and 15% had over 15 years
518 of work experience. On housing type handled by these respondents, it was found that 55% of
519 the respondents have handled public housing projects, 35% have handled social housing
520 projects while 6% have worked on cooperative housing. It is worth noting that though
521 vulnerable groups such as the youth, women, the unemployed and people who are HIV positive
522 could have been housed in social facilities, per the country's legal provisions, majority of the
523 respondents stated that no social housing exists in Ghana. However, since some of them
524 indicated that they have been involved in social housing, it is possible that these few
525 respondents have participated in such projects that are carried out beyond the scope of Ghana.
526 It is also not surprising that low number of respondents have been involved in cooperative
527 housing since it is still emerging in the Ghanaian housing sector. The outcome of the
528 respondents' background data enhances the reliability of the survey data and therefore gives
529 credence for subsequent statistical analysis.

530

531 **Descriptive Statistics**

532 Reliability analysis was conducted by evaluating the Cronbach alpha values for both the
533 indicators of sustainable housing and the barriers. In both sets of data, Cronbach alpha values
534 of 0.878 and 0.840 were obtained, respectively (shown in Table 2). These values are higher
535 than the 0.70 threshold recommended in similar sustainable housing studies (Chan & Adabre,
536 2019; Adabre & Chan, 2019). Therefore, the Cronbach alpha values indicate that the survey
537 data are adequately reliable for subsequent analysis.

538

539 Sequentially, the mean values, standard deviations and ranks based on the mean values were
540 estimated for the indicators and the barriers to sustainable housing (shown in Table 2).

541 Concerning the indicators, the mean scores of the 21 indicators range from 4.468 (for
542 ‘construction cost performance of housing facility’) to 3.468 (for ‘waiting time of potential
543 household before being allocated a housing unit’). Therefore, the respondents considered the
544 21 indicators as important for measuring the concept of sustainable housing since none of the
545 mean values was within the category of ‘less important’ (< 2). Besides, the low standard
546 deviations (< 1) of most of the indicators suggest a relatively high consistency level among the
547 different respondents who ranked the indicators.

548

549 On the barriers (shown in Table 2), mean scores of the 21 barriers range from 4.761 (for ‘high
550 interest rates’) to 3.255 (for ‘lack of / inadequate local professional skills’). Most of the highly
551 ranked barriers such as ‘high interest rates’, ‘high inflation rate’, ‘high upfront cost of materials
552 and sustainable technologies’ and ‘high cost of serviced land’ are barrier items from the ‘cost-
553 related barriers’ construct. The results show that ‘cost-related barriers’ are the most
554 impediments to sustainable housing in Ghana. Besides, among the ‘incentive-related barriers’,
555 ‘tight credit conditions’, ‘inadequate mortgage institution’, ‘lack of planning control on land
556 development’, ‘inadequate access to land’ and ‘inadequate infrastructural development’ are
557 ranked high (above 4.00). Furthermore, the barriers that ranked high (above 4.00) under
558 ‘retrofit-related barriers’ include: ‘policy instability / abandoned housing facilities or projects
559 by succeeding government’ and ‘lack of routine maintenance / poor maintenance culture of
560 housing facilities’. Therefore, in addition to ‘cost-related barriers’, sustainable housing in
561 Ghana could be hindered by ‘incentive-related’ and ‘retrofitting-related’ barriers.

562

563 The values in the columns of ‘Corrected Item-Total Correlation’ and ‘Cronbach’s Alpha if Item
564 Deleted’ were used as guide to delete items / indicators that might not be relevant for further
565 consideration in the PLS-SEM (Yuan et al., 2018). The conditions for deleting an item /

566 indicator are that if the item's 'Corrected Item-Total Correlation' is less than 0.40 and its
567 'Cronbach's Alpha if Item Deleted' is greater than overall Cronbach's Alpha for all items (i.e.
568 0.878 for sustainable housing indicators and 0.840 for barriers), then the item should be deleted.
569 Based on these conditions, the indicator 'take up rate of housing facility' (in Table 2) could be
570 deleted before further analysis. Similarly, the barrier item 'inadequate local professional skills
571 for retrofitting activities' (in Table 2) could be deleted.

[Please, insert **Table 2.** Descriptive Statistics of Constructs and Indicators of Barriers to Sustainable Housing]

1 **Results of PLS-SEM – Estimation of Measurement Model**

2 All the measurement items were specified as reflective indicators and not formative indicators.
3 Reflective indicators are interchangeable and therefore omitting an item does not essentially
4 change the nature of the underlying construct. However, for formative indicators, omitting an
5 indicator is omitting a part of the underlying construct (Hair et al., 2014; Diamantopoulos &
6 Winklhofer, 2001). Besides, reflective indicators have high correlations with one another.
7 Studies by Chan & Adabre (2019) and Adabre et al. (2020) showed that there are high
8 correlations among sustainable housing indicators and barriers. Therefore, the analysis was
9 conducted after specifying all the measurement items as reflective indicators. It is
10 recommended that factor loadings of the measurement items should be above 0.5. As suggested
11 by Nunnally (1978), items with loading below 0.5 do not contribute significantly to the
12 explanatory power of the constructs. Therefore, during the data analysis, measurement items /
13 indicators whose factor loadings were below 0.5 were deleted and the analysis was repeated
14 until a reliable and valid measurement model was obtained.

15
16 Results of the measurement model are shown in Table 3. Though, one the underlying barriers
17 ‘income inequality’ was classified as a cost-related barrier, it was successfully loaded (loading
18 ≥ 0.5) under ‘incentive-related barriers’. From Table 3, the estimated composite reliability
19 values and Cronbach’s alpha values of all constructs are above the required threshold of 0.7,
20 which indicate that internal consistent reliability is acceptable. Furthermore, the factor loadings
21 and the average variance extracted (AVE) values are above the recommended 0.5, which
22 indicate a satisfactory level of convergent validity of the indicators and constructs, respectively.

[Please, insert **Table 3.** Measurement Model Evaluation]

1 **Measurement Model Assessment: Discriminant Validity (Vertical Collinearity)**

2 **Fornell and Lacker Criterion**

3 After estimating the measurement model, the next step is to assess its vertical collinearity. This
4 was done by estimating the discriminant validity using the Fornell & Lacker criterion. The
5 criterion of assessment is that a construct should share more variance with its measures than it
6 shares with other constructs in the model. Using the AVE, Fornell & Lacker stated that the
7 AVE of constructs should be greater than the variance shared between the constructs and other
8 constructs. From the results in Table 4, the highest correlation of a construct is the correlation
9 between a construct and itself. These correlations are the diagonal values as indicated in Table
10 4. The values are the square root of the AVE of the latent variable and indicate the highest in
11 any column or row. Therefore, the discriminant validity was satisfactory using the Fornell &
12 Lacker criterion (Chin, 1998).

13

14

15 [Please, insert **Table 4.** Discriminant Validity (Fornell & Larcker Criterion)]

16

17

18 **Indicators' Cross Loading**

19 Another approach for estimating the discriminant validity of the measurement model is by
20 evaluating the measurement items' cross loadings. As shown in Table 5, each measurement
21 item had the highest factor loading on the construct it was theoretically identified to measure
22 than any other constructs in the model. Therefore, this further buttresses the fact that the
23 measurement model is valid and reliable for structural path modelling.

24

25 [Please, insert **Table 5.** Indicators' Cross Loading]

26

27 **Discriminant Validity (HTMT)**

28 The measurement model was finally judged through the HTMT (shown in Table 6). Using the
29 HTMT as a criterion to evaluate the discriminant validity entails comparing the HTMT with
30 predetermined threshold. If the HTMT value is higher than the threshold, then there is a lack
31 of discriminant validity (Henseler et al., 2015). Though the threshold for HTMT is debatable,
32 Gold et al. (2001) and Teo et al. (2008) proposed a value of 0.90 (HTMT_{0.90}), which is the
33 adopted threshold for this study. As shown in Table 6, since all the inter-construct correlations
34 are below 0.90, the discriminant validity has been further established.

35

36

37 [Please, insert **Table 6. Discriminant Validity (HTMT)**]

38

39

40 **Estimation of Structural Model / Path Analysis**

41 After the assessment of the measurement model on reliability, convergent validity and
42 discriminant validity, it was concluded that the constructs are within the satisfactory limit for
43 estimating the structural model (relationships among constructs). Therefore, path analysis was
44 conducted (shown in Fig. 2). The values between constructs are the respective path coefficients.
45 The higher the path coefficient between constructs, the stronger the influence of the
46 independent construct on the dependent construct. As stated by Murari (2015), path coefficients
47 from 0.1 to 0.3 indicate weak influence, between 0.3 to 0.5 suggest moderate influence and 0.5
48 to 1.0 show strong influence.

49

50 The results (shown in Fig. 2) indicate that the path connecting the ‘cost-related barriers’ to the
51 ‘incentive-related barriers’ shows a moderate influence (0.464). However, there is high
52 influence (0.698) from ‘incentive-related barriers’ on ‘retrofitting-related barriers’ while the

53 path linking 'cost-related barriers' to 'retrofitting-related barriers' revealed weak influence
54 (0.105). Concerning the paths linking the constructs of the barriers to the sustainable housing
55 construct, it was found that there is weak influence from 'cost-related barriers' on 'sustainable
56 housing'. In contrast, the path linking 'incentive-related barriers' to 'sustainable housing'
57 indicates high influence (-0.556). Furthermore, 'retrofitting-related barriers' have high
58 influence (0.783) on the 'sustainable housing' construct.

59

[Please, insert **Fig. 2.** Structural Model of Construct of Barriers and Sustainable Housing Construct]

1 **Assessment of the Structural Model**

2

3 Assessment of the structural model includes: evaluating collinearity issues (using the inner
4 variance inflation factor values), assessing the significance and relevance of the structural
5 model relationships, assessing the coefficient of determination (R^2); assessing the effect sizes
6 (f^2) and the predictive relevance (q^2).

7

8 **Assessing the Structural Model for Multi-Collinearity**

9 Multicollinearity in the structural equation model was judged using the inner variance inflation
10 factor (VIF) values. All the VIF values were below five which indicates that there is no
11 multicollinearity. Thus, the structural model has passed the test of multicollinearity.

12

13 **Assessing the Significance and Relevance of Structural Model (Bootstrapping)**

14 Bootstrapping was conducted to assess the significance of the relationships among constructs.
15 It estimates the spread, shape and bias of the sampling distribution of the population from
16 which the sample under study was obtained. Prior to conducting the bootstrapping, the
17 normality of the data was assessed using the Mardia's Multivariate skewness and kurtosis. The
18 skewness value obtained was 8.81 while the kurtosis value was 38.96. Comparing the outputs
19 of the skewness and the kurtosis with the cut offs (Mardia multivariate –skewness ± 1 ; kurtosis
20 ± 20), it can be concluded that the data is not normally distributed since the estimated values
21 are above the predetermined values (Chin, 1998). Hence, bootstrapping was conducted for the
22 data set. Bootstrapping analysis was used for statistical testing of the direct effects of all the
23 hypothesized relationships. If $t_{0.05} > 1.96$ (for a 2-tailed test), hypothesis is supported (Peng &
24 Lai, 2012; Hair et al., 2016).

25

26 Results of the bootstrapping are shown in Fig. 3. The t-values are indicated on the various paths
27 that link the constructs. The explanatory power of the structural model was evaluated by the
28 coefficient of determination (R^2). R^2 measures the proportion of variance in the sustainable
29 housing construct explained by all the barrier constructs linked to it (Chin, 1988). It ranges
30 between 0 and 1, with higher values indicating higher levels of predictive accuracy of the
31 overall structural model. As shown in Fig. 3, the R^2 for 'sustainable housing' is 0.433. This
32 means that about 43% of the challenges in sustainable housing development are due to the three
33 constructs of barriers. This value indicates a satisfactory level of the predictive accuracy and
34 quality of the structural model (Hair et al., 2014).

[Please, insert **Fig. 3.** Bootstrapping Results on Impact of Barriers Construct on Sustainable Housing Construct]

1 **Validation of the Hypotheses**

2 The hypotheses (hypotheses 1 to 6) were evaluated based on the structural model. Each path
3 represents a hypothesis. Tests of the hypotheses were achieved by evaluating the statistical
4 significance of the path coefficients. Table 7 is a summary of path analysis results and their
5 corresponding t-values. For all the paths, a two-tail t-test was used (Aibinu & Al-Lawati, 2010).
6 The hypotheses were considered based on the conventional significance levels of 0.01 and
7 0.05. Table 7 shows that out of the six hypotheses, four hypotheses were significant. The path
8 coefficient between ‘cost-related’ and ‘incentive-related’ barriers (hypothesis1) is significant.
9 Furthermore, the path linking ‘incentive-related barriers’ to ‘retrofitting-related barriers’ is
10 significant (hypothesis 2). Moreover, the coefficient of the path linking ‘incentive-related
11 barriers’ to ‘sustainable housing’ is statistically significant (hypothesis 5) and likewise the path
12 between ‘retrofitting-related barriers’ and ‘sustainable housing’ (hypothesis 6). Therefore,
13 hypothesis 1, hypothesis 2, hypothesis 5 and hypothesis 6 were accepted because their t-values
14 are all greater than the 1.96 ($t_{0.05} > 1.96$).

15

16 **Assessing the Effect Sizes (f^2)**

17 The structural model was also assessed by calculating the effect sizes of the constructs. Effect
18 size (f^2) measures how strongly one independent construct contributes to explaining a certain
19 dependent construct in terms of R^2 . The effect size was evaluated by investigating the changes
20 in R^2 to find out if there is a substantive impact of any of the construct of barriers on the
21 ‘sustainable housing’ construct. Then, based on the obtained R^2 value, the effect size was
22 calculated using eqn.1:

23

24 $f^2 = (R^2_{\text{included}} - R^2_{\text{excluded}}) / (1 - R^2_{\text{included}})$ eqn. (1)

25 where R^2_{included} and R^2_{excluded} are the R^2 values of the dependent construct when a selected
26 independent construct is included or excluded from the model. The change in the R^2 values is
27 calculated by estimating the PLS path model twice: Once with the independent construct
28 included (yielding R^2_{included}) and the second time with the independent construct excluded
29 (yielding R^2_{excluded}). The effect size of a construct is small if $0.02 \leq f^2 < 0.15$; medium if 0.15
30 $\leq f^2 < 0.35$ and large if $f^2 \geq 0.35$ (Cohen, 2013). Table 7 shows the results on estimates of the
31 effect size for some of the constructs that could be estimated.

32

33 From Table 7, ‘cost-related barriers’ have small effect size (0.034) on ‘retrofitted-related
34 barriers’. However, ‘incentive-related barriers’ have a high effect size (0.675) on ‘retrofitting-
35 related barriers’. Between the construct of barriers and sustainable housing construct,
36 ‘incentive-related barriers’ have a medium effect size (0.192) on ‘sustainable housing’ while
37 the effect size of ‘retrofitting-related barriers’ on ‘sustainable housing’ is large (0.430). The
38 effect size of ‘cost-related barriers’ on ‘sustainable housing’ is small (0.086).

39

40 **Assessing the Predictive Relevance (q^2)**

41 The rigorousness or how well observed values are reproduced by the structural model was
42 evaluated by calculating the predictive relevance. Predictive relevance (q^2) of exogenous
43 constructs uses blindfolding procedure where every n^{th} data point in the dependent construct’s
44 indicators is omitted to estimate the parameters with the remaining data points (Henseler et al.,
45 2009). While estimating parameters for a model under blindfolding procedure, this technique
46 omits data for a given block of indicators and then predicts the omitted part based on the
47 calculated parameters (Akter et al., 2011). Then, the predictive relevance can be estimated
48 using eqn. (2). A construct’s predictive relevance is small if $0.02 \leq q^2 < 0.15$; medium if 0.15
49 $\leq q^2 < 0.35$ and large if $q^2 \geq 0.35$ (Cohen, 2013; Hair et al., 2014). Results of the constructs

50 predictive relevance are shown in Table 7. The results indicate that the path linking ‘incentive-
 51 related barriers’ to ‘retrofit-related barriers’ has medium predictive relevance (0.210) and
 52 likewise the path linking ‘retrofitting-related barriers’ to ‘sustainable housing’ (predictive
 53 relevance 0.184). However, a small predictive relevance (0.053) was obtained for the path
 54 between ‘incentive-related barriers’ and ‘sustainable housing’ (shown in Table 7).

55

56 $q^2 = (Q^2_{\text{included}} - Q^2_{\text{excluded}}) / (1 - Q^2_{\text{included}})$ eqn. (2)

57 $Q^2 = 1 - (\sum_D SSE_D) / (\sum_D SSO_D)$

58

59 Where D is the omission distance, SSE is the sum of squares errors, and SSO represents the
 60 sum of squares total. To set D, the rule of thumb is $5 \leq D \leq 10$. Therefore, in conducting the
 61 blindfolding in smart PLS-SEM, a D value of 6 instead of 7 was selected considering that the
 62 total number of indicators is 21.

[Please, insert **Table 7.** Direct Relationships for Hypothesis Testing]

1 **Discussion of Results on Measurement Model**

2 **Sustainable Housing Construct**

3 From the results of the measurement model, sustainable housing was reflectively and
4 significantly measured by seven indicators, namely, energy efficient housing (ISH10); rental
5 cost of housing facility (ISH16); commuting cost of household (ISH17); technology transfer
6 (ISH19); safety performance (ISH04); end-user's satisfaction (ISH05) and stakeholders'
7 satisfaction (ISH06). These indicators are critical for defining the scope of sustainable housing
8 in the Ghanaian construction industry.

9

10 For sustainable housing from the perspective of Ghana, there should be an efficient supply of
11 energy. However, the energy supply situation in Ghana is unreliable, which is exacerbated by
12 increasing residential electricity demand. Gyamfi et al. (2018) stated that seven appliances and
13 one lighting technology consisting of refrigerator, air conditioner, television, freezer, fan,
14 electric iron, washing machine and CFL constituted about 93% of residential electricity
15 consumption in 2015. It is projected that electricity consumption by these appliances could be
16 reduced by 24-51% in 2050 through energy efficient technologies. Therefore, the adoption of
17 energy efficient or sustainable technologies that are environmentally friendly would ensure
18 sustainable housing development in Ghana.

19

20 Furthermore, between 'rental cost of housing' (an indicator of preference for renting) and 'price
21 of housing facility' (an indicator of preference for homeownership) (Adabre and Chan, 2020),
22 only the former was significantly loaded as an indicator for sustainable housing. However, the
23 higher ranking of 'price of housing' than 'rental cost of housing' in the descriptive statistics
24 (shown in Table 2) could be an indication that there is high preference for homeownership over
25 renting in the case of Ghana. This was also inveterate in prior study by Chan & Adabre (2019)

26 among developing countries. Generally, economic development among developing countries
27 leads to increasing preference for homeownership over renting. This is not only attributed to
28 reasons for shelter but also for investment. Besides, housing facilities serve as assets for
29 hedging against the rapid escalation of general inflation rate and high advance rent charges.
30 These could possibly be the reasons ‘price of housing facility’ (indicator of ownership) was
31 rated higher than ‘rental cost of housing facilities’ (an indicator of renting) in the descriptive
32 statistics (in Table 2).

33

34 Consequently, in the past decades, successive governments in Ghana built and sold out some
35 housing facilities to civil servants. Besides, some rental facilities were privatised as owner
36 facilities for some of the citizenry. Though this practice is good to meet the desire for home
37 ownership among the citizenry, it may not be a laudable policy for sustainable housing
38 development as indicated in the measurement model of the sustainable housing construct. For
39 instance, a study by Owusu et al. (2019) highlighted challenges of transparency in the
40 distribution of public resources in the Ghanaian construction industry. Thus, most of the public
41 houses that are sold out are often bought by the rich or political party members and rented or
42 sold out at exorbitant charges to the general public. This increases the housing affordability
43 crisis and income inequality in cities (Sulemana et al., 2019). Moreover, maintenance of such
44 public housing facilities could be problematic if various apartments are sold out to different
45 households. Inadequate maintenance of such housing facilities, which is mostly the situation
46 in major cities in Ghana such as Accra and Kumasi, affects the quality of life in these cities
47 (Węziak-Białowolska, 2016). Hence, for sustainable housing from the Ghanaian perspective,
48 ensuring affordability of ‘rental cost of housing facilities’ is more sustainable than ensuring
49 affordability of ‘price of housing facilities’. The availability of public rental facilities in major

50 cities in Ghana (i.e. Accra) will ensure access to housing facilities among the 40.9% of all
51 urban households that depend on rental facilities.

52

53 Furthermore, technology transfer or innovation was significantly loaded as an indicator for
54 sustainable housing. Prior studies identified technology transfer as one key indicator for
55 housing in Ghana (Ahadzie et al., 2008; Adinyira et al., 2012). Technology transfer entails the
56 use of new technologies that are cost effective to improve energy and housing supply.
57 Improved technologies on the use of alternative materials for construction could advance
58 sustainable housing development in Ghana. Currently, the Ghanaian construction industry
59 relies so much on cement and its products for the construction of most housing facilities. Yet,
60 aside being expensive, cement contributes to the emission of greenhouse gases. Approximately
61 a ton of CO₂ is emitted into the environment for each ton of cement produced. Besides, concrete
62 production is one of the construction processes that emit the highest amount of CO₂ (Djokoto
63 et al., 2014). Through innovative measures, environmental-friendly materials such as burnt
64 bricks and hydraform bricks could be used together with cement for constructing housing
65 facilities. This will reduce the number of bags of cement used for constructing housing
66 facilities. Consequently, the rent of such housing facilities could be affordable to low-income
67 household, and this could have ripple effects on the market equilibrium rent of housing
68 facilities charged by developers or property owners. Besides, the amount of CO₂ emission
69 could be mitigated since the quantity of cement used for constructing housing facilities will be
70 reduced.

71

72 Moreover, for sustainable housing, end-user's satisfaction and stakeholders' satisfaction are
73 crucial indicators. Ensuring security provision is important for end-user's satisfaction. In
74 addition, housing design features (i.e. separate bedrooms for parents and children), availability

75 of public facilities (i.e. kindergarten and other basic level educational facilities) and social
76 design features (i.e. leisure facilities) within the neighbourhood are critical for households'
77 satisfaction and stakeholders' satisfaction (Chan and Adabre, 2019).

78

79 Though the measurement model for the sustainable housing constructs revealed the critical
80 indicators for sustainable housing, the attainment of these indicators is often hindered by key
81 barriers. Besides, some of the strategies that are stated within the various indicators may not
82 be attainable because of barriers to sustainable housing. These barriers that pertain to the
83 Ghanaian housing market are discussed in subsequent sections. Although the data were
84 collected from a limited number of participants in formal institutions, the findings are broadly
85 discussed to enhance the relevance of the study's outcome to the state, self-builders and
86 developers.

87

88 **'Cost-Related Barriers' Construct**

89 'Cost-related barriers' were significantly measured by four-indicator items, namely, 'delays in
90 government approval process' (CRB1); 'high upfront cost of building materials and
91 technologies' (CRB2); 'high cost of serviced land' (CRB3) and 'high inflation rate' (CRB4).
92 From the structural equation model (shown in Fig. 3), the construct for 'cost-related barriers'
93 was not significant related to the constructs for 'sustainable housing' and 'retrofit-related
94 barriers'. However, there was a significant relationship between 'cost-related barriers' and
95 'incentive related barriers'. Thus, although it has been stated that 'cost-related barriers' are
96 critical barriers to sustainable development (Yang & Yang, 2015; Chan et al., 2016),
97 surprisingly, 'cost-related barriers' do not have a direct significant impact on 'sustainable
98 housing' from the Ghanaian perspective. Similarly, a study conducted by Darko et al. (2018)
99 revealed that 'cost and risk-related barriers' did not have significant impact on green building

100 adoption from the Ghanaian perspective. In Darko et al. (2018), ‘incentive-related barriers’
101 were significant as found in this study. Since ‘cost-related barriers’ rather have a direct
102 significant influence on ‘incentive-related barriers’ (as shown in Fig.3 & Table 7), this implies
103 that the ‘cost-related barriers’ are as a result of inadequate incentives in the Ghanaian housing
104 sector. Similarly, Kaygusuz (2012) asserted that ‘cost-related barriers’ are secondary to other
105 barriers such as lack of financing, education or proper incentives among most developing
106 countries.

107

108 Accordingly, ‘cost-related barriers’ affect ‘incentive-related barriers’ which could then
109 significantly influence one or more of the sustainable housing indicators. For example, ‘delays
110 in permit approval or government approval process’ was significantly loaded as a ‘cost-related
111 barrier’. Such delays in the Ghanaian construction industry is evinced in prior study. Gough &
112 Yankson (2000) found that only 40% of land acquirers / developers were able to register their
113 plots of land. Further analysis showed that among the 40%, some were able to register their
114 plots of land in 12 months while some did so in five years. Bureaucracy on land registration
115 delays sources of funding or prevents lands from being used as a collateral since most banks
116 will usually require statutory approval as one of the requirements for granting loans. Besides,
117 ‘delays in permit approval’ increases the cost of capital / interest payment on borrowed funds
118 since it interrupts development on land. Consequently, this increases the cost of housing
119 construction, making such construction economically unsustainable. This does not incentivize
120 or motivate developers to provide affordable housing since developers or landlords may
121 increase the price / rent to expedite payment on borrowed capital for constructing the housing
122 facilities (Owusu-Ansah et al., 2019).

123

124 Concerning construction materials, cement is the main building material in most construction
125 projects in Ghana. Within the past years, price of cement has increased exorbitantly. This has
126 partly contributed to the high cost of housing construction which in turn acts as a disincentive
127 or incentive-related barrier to sustainable housing (i.e. rental affordability) among property
128 owners. Even if the houses were built in the past when costs of building materials were
129 comparatively low, the current high cost of building materials and sustainable technologies
130 could increase the sinking fund that private landlords have to deposit for the construction of
131 similar facility after its lifespan or for maintenance of the facility. High sinking fund
132 requirement implies higher rental charges as evinced in the current Ghanaian rental housing
133 market (Arku et al., 2012).

134

135 Moreover, high interest rate among financial institutions is a cost-related barrier that affects
136 most developers and households. Lending rate as high as 30 per cent per annum prevents the
137 many middle- and low-income households from assessing credit. It is not surprising that many
138 households in Ghana are averse to housing loans or mortgages for fear that they might not be
139 able to amortise such loans (Ghana Housing Profile, UN-Habitat, 2011). The Banks and other
140 financial institutions, therefore, deal with the richest few including developers. To be able to
141 repay loans used for real estate, developers mostly target expatriates or high-income earners.
142 Only the high-income categories can afford the exorbitant charges of such housing facilities
143 provided by the developers. Thus, the high cost of finance has knock-on effects on ‘inadequate
144 incentives’ for developers to provide housing facilities to most middle-income earners.

145

146 **‘Incentive-Related Barriers’ Construct**

147 The construct for ‘incentive-related barriers’ was significantly measured by ‘inadequate
148 incentive for private investors’ (IRB1); ‘inadequate access to secured land’ (IRB2); ‘income

149 inequality' (CRB7) and 'lack of planning control on land development' (IRB3). From the
150 structural equation model (as shown in Fig. 3), the construct for 'incentive-related barriers' had
151 direct significant impact on the construct for 'sustainable housing'. It also has direct significant
152 impact on 'retrofitting-related barriers'. These relationships mean that 'incentive-related
153 barriers' could directly influence sustainable housing and indirectly by instigating 'retrofit-
154 related barriers'.

155

156 A major incentive-related barrier to sustainable development is split incentive (Alam et al.,
157 2019). In most tender documents for construction projects, tenderers are requested to provide
158 tender security, advance payment security, tax payment certificates and other documents as
159 prequalification requirements. However, project sustainability measures or policies are often
160 not requested. Thus, though the tenderers may have the required expertise for sustainable
161 housing they may be reluctant to integrate sustainable technologies / measures into such
162 development. This is because if such technologies are integrated into housing projects, the
163 beneficiaries of the technologies are the potential residents or households while the contractor
164 may incur higher cost for sustainable development. The cost may not be reimbursed if borne
165 out of contractual agreement. Besides, contractors are not incentivized (i.e. no certificate of
166 recognition for sustainable development) to provide them a competitive advantage in
167 subsequent tendering for public / private projects.

168

169 Another incentive-related barrier to sustainable housing is 'inadequate access to secured land'.
170 This is attributable to the customary land tenure system in Ghana, which often results in
171 litigations over land with ripple effects of delays in court proceedings. Inadequate plot lay-
172 outs, time-consuming boundary disputes and conflicts are some of the problems associated
173 with customary land tenure system in the Ghanaian construction industry (Gough & Yankson,

174 2000). Moreover, the customary land tenure is bedevilled with problems of multiple land sales
175 and boundary disputes due to the state of land transaction, inefficient data storage and
176 unscrupulous land sales (Crook, 2004). For instance, land disputes pending in Ghanaian courts
177 due to family disputes were 52.7% while 17.7% were boundary disputes and 12.8% were
178 disputes due to unauthorized sales of land by chief or stranger and 4.9% were unauthorized
179 sales by a family member (Crook, 2004).

180

181 Furthermore, income inequality is a major barrier to sustainable housing development in most
182 urban centres in Ghana. Sulemana et al. (2019) found a positive correlation between income
183 inequality and corruption. Similarly, Owusu et al. (2019) revealed that most procurement
184 activities in Ghana are susceptible to corrupt practices. Thus, public housing facilities which
185 could be economically sustainable in perpetuity through renting of such facilities are mostly
186 bought by public officials or party members for investment purpose. This practice often leads
187 to increasing income inequality between low-income earners and high-income earners in most
188 developing countries. Moreover, income inequality could be exacerbated by weak enforcement
189 of planning control on land development (Agyemang & Morrison, 2018). According to David
190 Ricardo, as more and more land is brought into production, landowners capture a share of the
191 total value accruing to land, which leads to general decline in economic growth (Obeng-
192 Odoom, 2010). Explaining this further in the context of cities, Stilwell (2011) stated that
193 increasing urbanization leads to widespread use of land for roads and housing. Consequently,
194 the value of land appreciates which is captured by landowners. Therefore, there is an incentive
195 for high-income earners (the rich) to buy and hold land till it accumulates values resulting from
196 road and other infrastructure development provided by the government or public. Without
197 planning control on land (i.e. time-limited holding on vacant land and taxes that capture values
198 on land attributed to public infrastructure supply), speculations could increase prices of land

199 and, consequently, the prices / rent of housing facilities. Thus, housing facilities could be
200 unaffordable to low- and middle-income earners. This could lead to high income disparity,
201 income segregation, slum development in cities and urban sprawl.

202

203 The key challenge of lack of planning control on land is the conflict between the traditional
204 and institutional levels of government in the delivery of land. Because land is customarily
205 owned, it is allocated by the various traditional leaders or family heads. However, planning for
206 land use is institutionally controlled by the Town and Country Planning Department (TCPD),
207 which is a governmental institution. Aside conflicts between land allocation and land use, the
208 TCPDs lack adequate human and fiscal resources to effectively carry out their duties.
209 Therefore, by ensuring that the TCPDs are adequately resourced, the government could control
210 development on land for sustainable housing. This control will enable the government to
211 introduce redistributive policies (i.e. taxation to capture increase in land values due to public
212 roads etc.) for additional infrastructure supply.

213

214 Based on the significant direct impact of ‘incentive-related barriers’ on sustainable housing,
215 the provision of adequate incentive schemes to various stakeholders could motivate sustainable
216 housing. For instance, in addition to the usual required documents (i.e. bid security, VAT &
217 SSNIT Clearance Certificate), tenderers of a housing project should be assessed based on their
218 sustainability attainment strategies on the project. Thus, evaluation of tenderers on
219 sustainability strategies / performance should be conducted and the outcome of their
220 sustainability strategies should form part of the prequalification and selection criteria (Sourani
221 & Sohail, 2011). This approach could be a remedy for the problem of split-incentive. Besides,
222 financial incentives such as interest free loans and non-financial incentives such as expedited
223 permit approval could be offered to contractors or developers. This could reduce the cost of

224 capital on borrowed funds incurred due to delays in land registration. In return for expedited
225 permitting or low-interest loans, contractors or developers may be required to integrate some
226 sustainable strategies or technologies into the housing facility.

227

228 Since ‘incentive-related barriers’ indirectly affect sustainable housing through ‘retrofit-related
229 barriers’, policies on incentives could be developed to enhance retrofitting activities. An
230 innovative financing incentive such as revolving fund could be established to incentivize
231 sustainable housing development among developers and energy efficient retrofit among
232 households. Though upfront investment for the revolving fund could be high, it is suitable for
233 developing countries with frequently constrained public fund and financial austerity. This
234 scheme could be cost-neutral in the long term (Gouldson et al., 2015). With revolving fund,
235 initial deposits could be provided by the government and other financial institutions. Then, the
236 fund can be offered as low-interest loans to low-income and middle-income households (i.e.
237 civil servants) for energy efficient retrofitting. For instance, since the adoption of solar panels
238 is at an incipient stage in Ghana, the fund could enable households to purchase tin film solar
239 photovoltaic (PV) polymer for alternative source of energy for lighting and other minor
240 domestic uses. Consequently, the savings in energy cost, attributed to the PV panels, after
241 accounting for rebound effects and performance gaps, are used for the amortisation of the loan
242 for subsequent funding of retrofitting activities. Arguably, most Ghanaian could be averse to
243 loans that are linked to housing facilities. Therefore, to encourage households’ participation
244 and to reduce rebound effects on energy savings, a percentage of the savings could be given as
245 ‘cash-back’ to households who participate in the scheme.

246

247 Moreover, with regard to low-income households, effective cooperative housing could be an
248 efficient strategy for housing supply and for upgrading some of the slum communities in major

249 urban areas such as Accra and Kumasi. A typical example of this is the Amui Dzor cooperative
250 housing in Ashaiman. Yet, sustaining and replicating this form of housing supply in other slum
251 communities is hindered by inadequate access to finance. Therefore, to ensure sustainable
252 housing, adequate incentives such as expedited permit approval and interest-free loans or a
253 revolving fund could be established to promote cooperative housing in slum areas. The success
254 of cooperative housing will involve coordination among members of the cooperative, financial
255 institutions / banks (i.e. Republic Bank Ghana Limited) for loans or revolving fund
256 management, owners of lands (i.e. chiefs and family heads) for land supply and parastatal
257 institutions for accelerating permit approval and utilities supply.

258

259 **‘Retrofit-related barriers’ Construct**

260 The items / indicators that significantly measured ‘retrofit-related barriers’ include: ‘low-level
261 or inadequate maintenance operation / retrofitting of existing housing facilities’ (RRB1);
262 ‘inadequate policies or sustainability assessment tools for retrofitting’ (RRB2); ‘lack of routine
263 maintenance / poor maintenance culture of housing facilities’ (RRB3) and ‘policy instability /
264 abandoned public housing facilities or projects by successive governments’ (RRB4). From the
265 structural model (shown in Fig. 3), ‘retrofit-related barriers’ have a direct significant impact on
266 ‘sustainable housing’.

267

268 Retrofit is the replacement of element or components of a building. In a broader perspective,
269 the U.S. Green Building Council (USGBC) defined retrofit as “any kind of upgrade of an
270 existing building that is wholly or partially occupied to improve energy and environmental
271 performance, reduce water use and improve comfort and quality of the space in terms of natural
272 light, air quality and noise – all done in a way that it is financially beneficial to the owner.”
273 ‘Inadequate retrofitting or low-maintenance operation’ is one of the critical barriers to

274 sustainable housing in Ghana and other developing countries. Gyamfi et al. (2018) reported
275 that through the replacement of six million incandescent lamps with compact fluorescent light
276 (CFL), a saving of 200-240MW was achieved. However, without broadening this retrofitting
277 or maintenance operation to other appliances, these savings are often lost as a result of rebound
278 effects. Similar to the case of Ethiopia, a significant energy saving was achieved through CFL
279 bulb distribution program. Yet, about 20% of the initial energy savings was loss to rebound
280 effects within 18 months after the execution of the programs (Costolanski et al., 2013).
281 Rebound effects are typical in a growing economy. As noted by Gyamfi et al. (2015), “rapid
282 economic development in Ghana results in increased per capital income.” As such, changes in
283 households’ behaviour such as demands for other electrical appliances (if the appliances are
284 not energy efficient), could annul the energy savings from other energy efficient appliances.
285 Thus, though the 2007 CFL bulb distribution and supply of energy efficient refrigerators in
286 Ghana are laudable policies, there should be an extensive retrofitting regarding freezer,
287 television, electric iron, washing machine and air-conditioners or electric fan. This could
288 prevent rebound effects on the energy savings from using the CFL and the energy efficient
289 refrigerators.

290

291 Furthermore, ‘inadequate policies / standards and tools’ is a key barrier to retrofitting aged
292 housing facilities to sustainability standards. Information dissemination policies on energy
293 saving techniques and energy efficient appliances to guide household in energy consumption
294 and purchasing decisions are inadequate. Besides, directive-based policies or mandatory-based
295 policies on retrofitting of existing housing facilities are lacking. Moreover, evaluation-based
296 policies for assessing retrofitting operation on existing housing facilities and for new housing
297 projects are inadequate in Ghana and other countries (Tan et al., 2018). Finally, sustainable
298 construction and retrofitting of housing facilities are hindered by the absence of tailored

299 sustainable policies for housing facilities. For instance, Green building rating systems such as
300 leadership in energy and environmental performance (LEED), Global Sustainability
301 Assessment System (GSAS) and Green Star do not provide complete assessment criteria for
302 sustainable development (Awadh, 2017 and Hamid et al., 2014). According to Adabre and
303 Chan (2020), these rating systems are environmental-oriented tools and are not sufficient to
304 assess the social sustainability and economic sustainability development in housing facilities.
305 Yet, these tools are often adopted for assessing sustainability of projects including housing
306 facilities. Therefore, the provision of sustainable housing policies (i.e. sustainable housing
307 codes and rating systems) in Ghana will not only be relevant for retrofitting existing housing
308 facilities to sustainable standards but also for the construction of sustainable housing facilities.
309 Moreover, ‘lack of routine maintenance / poor maintenance culture of housing facilities’ and
310 ‘policy instability / abandoned public housing facilities or projects by succeeding governments’
311 are critical barriers (Twumasi-Ampofo et al., 2014) that could affect upgrading of
312 unsustainable housing facilities to energy efficient facilities. These two barriers could be
313 caused by insufficient time and financial resources to address sustainability issues. Sourani &
314 Sohail (2011) argued that in a situation where funding is available within a limited period,
315 public clients may not have enough time to address sustainability issues in retrofitting of aged
316 housing facilities. Besides, due to short tenure of office coupled with limited resources and
317 financial constraints, governments and politicians mostly favor their own interest of starting
318 new projects while initiated projected by previous governments or aged unsustainable housing
319 facilities are neglected.

320

321 Therefore, mandatory policies on passive designs of housing facilities such as cross ventilation
322 could ensure energy efficient housing. By improving the ventilation design of housing
323 facilities, households could reduce the use of fans and air conditioners and consequently reduce

324 residential energy consumption. Furthermore, households are often ill-informed on energy
325 efficiency of appliance when making purchasing-decision. As a result, most households may
326 purchase appliance based on its initial cost. However, information on energy and lifecycle cost
327 performance of appliances could enable households to make an informed decision (Ansah et
328 al., 2020). Policies on ‘*caveat emptor* - let the buyer be aware’ of energy efficiency and
329 lifecycle cost of an appliance could avert purchasing decision made solely on the initial cost of
330 appliance. This could be achieved by enforcing the placement of labels on appliance to inform
331 households on its energy performance and its long-term cost performance.

332

333 **Conclusion**

334 This study investigated the impact of barriers on sustainable housing in the Ghanaian
335 construction industry. A questionnaire survey was conducted among housing professionals in
336 the formal sector. Valid data were collected from 47 respondents and analysed using
337 descriptive statistics (i.e. mean score, standard deviation, ‘corrected item-total correlation’ and
338 ‘Cronbach’s Alpha if Item deleted’). Furthermore, partial least square structural equation
339 modelling (PLS-SEM) was employed in developing a model between sustainable housing and
340 three categories of barriers: ‘cost-related barriers’, ‘incentive-related barriers’ and ‘retrofit-
341 related barriers’.

342

343 Findings of the study revealed some significant relationships among the constructs of the
344 barriers on one hand and between constructs of the barriers and sustainable housing construct
345 on the other hand. Significant relationships were found between ‘cost-related barriers’ and
346 ‘incentive-related barriers’; between ‘incentive-related barriers’ and ‘retrofit-related barriers’.
347 However, there was no significant relationship between ‘cost-related barriers’ and ‘retrofit-
348 related barriers’. Between the constructs of barriers and the sustainable housing construct,

349 significant relationships exist between ‘incentive-related barriers’ and ‘sustainable housing’;
350 between ‘retrofit-related barriers’ and ‘sustainable housing’. However, the relationship
351 between ‘cost-related barriers’ and ‘sustainable housing’ was not significant.

352

353 Notwithstanding the relevance of the findings, the study has limitations that are worth noting.

354 One limitation is the relative small sample size used for conducting the study. The number of
355 stakeholders was restricted to include mostly respondents from the industry. Therefore, with a
356 larger sample size, future study could use covariance-based structural equation modelling (CB-
357 SEM) to corroborate the findings of this study, or otherwise. This could improve the
358 generalization of the findings. Besides, the perspective of households, on potential barriers that
359 hinder their attainment of sustainable housing, was not included. Future study on views of
360 residents concerning barriers to sustainable housing could reveal interesting findings for
361 policymaking on sustainable housing.

362

363 Albeit the limitations, the study findings have significant implication for policymakers and
364 practitioners. High cost of sustainable housing development is as a result of inadequate
365 incentives in the Ghanaian construction industry. Besides, inadequate retrofitting of public
366 housing facilities and self-built housing facilities of most low-and middle-income earners is
367 partly due to insufficient incentives. Moreover, the significant influence of ‘incentive-related
368 barriers’ and ‘retrofitting-related barriers’ on ‘sustainable housing’ implies that policymakers
369 in Ghana (i.e. Ministry of Works, Water Resources and Housing) could improve sustainable
370 housing development through efficient allocation of resources on incentive policies and
371 retrofitting schemes. More importantly, retrofitting schemes for housing facilities (including
372 low-income self-build facilities) could yield greater impact on sustainable housing considering
373 the higher effect size of ‘retrofit-related barriers’.

374 On incentive policies, prequalification requirements of potentials contractors and permit
375 approval should include sustainable development strategies suggested by contractors,
376 developers and households. This could be an incentive to expedite general sustainable
377 development. Additionally, contractors should be awarded certificates based on their
378 sustainable development track record on previous projects. These certificates could then be
379 tendered by potential contractors at the prequalification stage for tender evaluation and possible
380 award of contract based on the certificate and other required documents. Furthermore, low-
381 interest loans, subsidies, revolving fund and policies (i.e. codes and regulations) could
382 incentivize sustainable housing of subsequent facilities and could motivate retrofitting of
383 unsustainable aged housing facilities to sustainability standards. The study's findings are
384 relevant for urban development concerning the attainment of the UN Sustainable Development
385 Goals in housing. They are key in apprising policymakers of major urban areas such as Accra,
386 Kumasi, Sekondi-Takoradi and Tamale of the significant barriers that require utmost attention.
387 Effective implementation of the findings could mitigate urban sprawl, promote smart growth
388 and improve sustainable housing in Ghana and the continent at large. Theoretically, future
389 study would investigate the impact of the suggested success strategies or policies on the
390 identified indicators of sustainable housing.

391

392 **Data Availability Statement**

393 All data, models and code generated or used during the study appear in the submitted article.

394

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402

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595 **Figure Caption List**

596 **Fig 1:** A Conceptual Model of the Impact of Barriers on Sustainable Housing

597 **Fig. 2:** Structural Model of Construct of Barriers and Sustainable Housing Construct

598 **Fig. 3:** Bootstrapping Results on Impact of Barriers Construct on Sustainable Housing

599 Construct

Table 1. Barriers to Sustainable Housing

Indicators of Barriers	References												
	Arku et al. (2012)	Alam et al. (2019)	Sulemana et al. (2019)	Agyemang & Morrison (2018)	Gianfrate et al. (2017)	Obeng-Odoom (2010)	Chan et al. (2018)	Yang & Yang (2015)	Hu and Qian (2017)	Shi et al. (2011)	Sourani & Sohail (2011)	Owusu-Ansah et al. (2019)	Twumasi-Ampofo et al. (2014)
Delays in government approval process / lengthy building permit approval	–	X	–	–	–	–	–	X	–	X	–	X	–
High upfront cost of materials and technologies	X	–	–	–	–	–	–	–	–	X	–	–	–
High cost of serviced land	X	–	–	–	–	–	–	–	–	–	–	X	–
High inflation rate	X	–	–	–	–	–	–	–	–	–	–	–	–
High interest rates	X	–	–	–	–	–	–	–	–	–	–	X	–
Inadequate local professional skills for sustainable housing	–	X	–	–	–	–	X	–	–	–	–	–	–
High cost of permit approval (high taxes and fees on developers)	–	–	–	–	–	–	–	–	–	–	–	–	–
Tight credit conditions	–	X	–	–	–	–	–	–	–	–	–	X	–
Inadequate incentive for private investors	–	–	–	–	–	–	X	–	–	–	X	–	–
Inadequate access to land	X	–	–	–	–	X	–	X	X	–	–	X	–
Income inequality	X	–	X	X	–	–	–	–	–	–	–	–	–
Lack of planning control on land development	–	–	–	X	–	–	–	–	–	–	–	–	–
Inadequate public funding / subsidies on technologies for sustainable housing	–	X	–	–	–	–	–	X	–	–	X	–	–
Inadequate infrastructure development	–	–	–	–	–	–	–	–	–	–	–	–	–
Inadequate mortgage / financing schemes (mortgages & loans)	X	X	–	–	–	–	X	X	–	–	–	X	–
Inadequate policies & tools (standard or guidelines) for retrofitting	–	X	–	–	X	–	X	X	–	–	X	–	–
Lack of routine maintenance / poor maintenance culture of housing facilities	–	–	–	–	X	–	–	–	–	–	–	X	X
Policy instability / abandoned public housing facilities / projects by succeeding governments	–	–	–	–	–	–	–	–	–	–	–	–	X
Low level / inadequate retrofitting (maintenance operation)	–	–	–	–	X	–	–	–	–	–	–	–	–
Poor housing location (in peripheral of towns and cities)	–	–	–	–	–	–	–	–	X	–	–	–	–

Table 2. Descriptive Statistics of Constructs and Indicators of Barriers to Sustainable Housing

Constructs	Code	Observable Variables	Mean Score	Standard Deviation	Rank	Corrected Item-total correlation	Cronbach's Alpha if Item Deleted	Cronbach's Alpha
Sustainable Housing (Measured by Indicators of Sustainable Housing (ISH))								
ISH	ISH01	Timely completion of project	4.340	0.815	3	0.378	0.875	0.878
	ISH02	Construction cost performance	4.468	0.584	1	0.231	0.878	
	ISH03	Quality performance	4.343	0.644	2	0.496	0.872	
	ISH04	Safety performance (crime prevention)	4.085	0.803	10	0.654	0.867	
	ISH05	End user's satisfaction	4.319	0.980	4	0.646	0.866	
	ISH06	Stakeholders' satisfaction	3.957	0.833	12	0.385	0.875	
	ISH07	Environmental-friendly (Eco-friendly)	4.085	0.803	10	0.380	0.875	
	ISH08	Reduced lifecycle cost	3.933	0.918	14	0.502	0.872	
	ISH09	Maintainability of housing facility	4.283	0.851	6	0.566	0.869	
	ISH10	Energy efficient housing	3.915	0.880	16	0.547	0.870	
	ISH11	Reduced disputes and litigation	3.660	1.027	19	0.469	0.873	
	ISH12	Reduced public expenditure on housing management	3.851	0.932	17	0.377	0.876	
	ISH13	Technical specification	4.128	0.824	9	0.563	0.870	
	ISH14	Aesthetic view of housing facility	3.913	0.717	15	0.363	0.876	
	ISH15	Price of housing facility	4.298	0.749	5	0.393	0.875	
	ISH16	Rental cost of housing facility	4.196	0.824	7	0.472	0.872	
	ISH17	Commuting cost of household to facility	3.787	0.999	18	0.582	0.869	
	ISH18	Functionality of housing facility	4.174	0.789	8	0.567	0.870	
	ISH19	Technology transfer	3.468	0.856	20	0.621	0.868	
	ISH20	Take up rate of housing facility	3.936	0.818	13	0.264	0.879	
	ISH21	Waiting time of potential households	3.468	0.881	21	0.430	0.874	
Potential Critical Barriers to Sustainable Housing								
Cost-Related Barriers (CRB)	CRB1	Delays in government approval process	3.936	0.895	16	0.391	0.837	0.840
	CRB2	High upfront cost of materials and technologies for sustainable housing both new construction and retrofitting	4.467	0.544	2	0.395	0.838	
	CRB3	High cost of serviced land	4.467	0.710	3	0.386	0.837	
	CRB4	High inflation rate	4.404	0.712	6	0.414	0.836	
	CRB5	High interest rates	4.761	0.427	1	0.443	0.837	
	CRB6	High cost of permit approval (high taxes and fees on developers)	4.170	0.637	10	0.326	0.839	

Incentive-Related Barrier (IRB)	CRB7	Income inequality	3.979	0.737	15	0.427	0.835
	IRB1	Inadequate incentive for private investors	3.872	0.924	19	0.553	0.829
	IRB2	Inadequate access to land among developers	4.043	0.908	13	0.437	0.835
	IRB3	Lack of planning control on land development	4.239	0.728	8	0.579	0.830
	IRB4	Inadequate subsidies / public funding for sustainable technologies	3.893	1.047	18	0.420	0.836
	IRB5	Poor housing location (Inadequate policies on situating housing development in cities / towns)	3.596	0.798	20	0.379	0.807
	IRB6	Inadequate infrastructural development	4.043	0.806	12	0.488	0.833
	IRB7	Inadequate mortgage / financing institutions	4.319	0.726	7	0.313	0.840
Retrofit-Related Barriers (RRB)	IRB8	Tight credit conditions	4.404	0.680	5	0.397	0.837
	RRB1	Low-level or inadequate retrofitting (maintenance operation)	3.935	0.818	14	0.527	0.831
	RRB2	Inadequate policies or sustainability assessment tools (standards or guidelines) for retrofitting housing facilities	3.894	1.047	17	0.673	0.822
	RRB3	Lack of routine maintenance / Poor maintenance culture of housing facilities	4.213	0.907	9	0.493	0.832
	RRB4	Policy instability / abandoned or neglected management of public housing facilities or projects by succeeding governments	4.404	0.648	4	0.404	0.837
RRB5	Inadequate local professional skills	3.255	1.170	21	0.134	0.855	

Table 3. Measurement Model Evaluation

Constructs	Indicators	Loadings ^a	AVE ^b	CR ^c	CA ^d
Sustainable Housing	ISH10	0.715	0.504	0.876	0.812
	ISH16	0.572	–	–	–
	ISH17	0.701	–	–	–
	ISH19	0.691	–	–	–
	ISH04	0.694	–	–	–
	ISH05	0.832	–	–	–
	ISH06	0.741	–	–	–
Cost-Related Barriers	CRB1	0.821	0.502	0.799	0.734
	CRB2	0.735	–	–	–
	CRB3	0.647	–	–	–
	CRB4	0.613	–	–	–
Incentive-Related Barriers	IRB1	0.853	0.542	0.823	0.737
	IRB2	0.742	–	–	–
	CRB 7	0.573	–	–	–
	IRB3	0.749	–	–	–
Retrofitting-Related Barriers	RRB1	0.697	0.545	0.826	0.727
	RRB2	0.841	–	–	–
	RRB3	0.722	–	–	–
	RRB4	0.682	–	–	–

Items removed: indicator items below 0.5: - ISH01, ISH02, ISH03, ISH07, ISH09, ISH11, ISH12, ISH13, ISH14, ISH15, ISH18, ISH21, CRB5, CRB6; IRB5, IRB6, IRB7, IRB8, IRB9:

- a. All indicator loadings > 0.5 means indicator reliability (Hulland, 1999).
- b. All Average Variance Extracted (AVE) > 0.5 indicates Convergent Reliability (Fornell and Larcker, 1981).
- c. All Composite Reliability (CR) > 0.7 indicates Internal Consistency (Gefen et al., 2001).
- d. All Cronbach's Alpha (CA) > 0.7 indicates Indicator Reliability (Nunnally, 1978).

Table 4. Discriminant Validity (Fornell & Larcker Criterion)

Constructs	Sustainable Housing	Cost-Related barrier	Incentive-Related barrier	Retrofitting-Related barrier
Sustainable Housing	0.710	–	–	–
Cost-Related barrier	0.348	0.709	–	–
Incentive-Related barrier	0.126	0.464	0.736	–
Retrofitting-Related barrier	0.513	0.402	0.698	0.738

Table 5. Indicators' Cross Loading

Indicators	Sustainable Housing	Cost-Related Barriers	Incentive-Related Barriers	Retrofitting-Related Barriers
ISH10	0.715	0.430	0.162	0.296
ISH16	0.572	0.275	0.089	0.292
ISH17	0.701	0.145	0.001	0.333
ISH19	0.691	0.100	0.147	0.383
ISH04	0.694	0.029	0.091	0.387
ISH05	0.832	0.412	0.126	0.467
ISH06	0.741	0.262	0.030	0.365
CRB1	0.344	0.821	0.540	0.425
CRB2	0.268	0.735	0.175	0.189
CRB3	0.187	0.647	0.134	0.198
CRB4	0.052	0.613	0.210	0.172
IRB1	0.125	0.291	0.853	0.599
IRB2	0.034	0.373	0.742	0.490
CRB7	-0.131	0.092	0.573	0.383
IRB3	0.219	0.498	0.749	0.550
RRB1	0.568	0.349	0.391	0.697
RRB2	0.315	0.498	0.793	0.841
RRB3	0.264	0.138	0.470	0.722
RRB4	0.383	0.062	0.276	0.682

Table 6. Discriminant Validity (HTMT)

Constructs	Sustainable Housing	Cost-Related Barrier	Incentive-Related Barrier	Retrofitting-Related Barrier
Sustainable Housing	–	–	–	–
Cost-Related Barrier	0.403	–	–	–
Incentive-Related Barrier	0.281	0.495	–	–
Retrofitting-Related Barrier	0.663	0.412	0.883	–

Table 7. Direct Relationships for Hypothesis Testing

Hypothesis Relationships	Std. Beta	Std. Error	t-value [^]	Decision	f ²	q ²	95% CILL	95%CIUL
H1 Cost-Related Barriers -> Incentive-Related Barriers	0.500	0.125	3.673**	Supported	–	–	0.297	0.681
H2 Incentive-Related Barriers -> Retrofitting-Related Barriers	0.651	0.122	5.316**	Supported	0.675	0.210	0.420	0.818
H3 Cost-Related Barriers -> Retrofitting-Related Barriers	0.118	0.165	0.637	Not supported	0.034	0.001	-0.150	0.366
H4 Cost-Related Barriers -> Sustainable Housing	0.273	0.186	1.507	Not supported	0.086	0.014	-0.058	0.557
H5 Incentive-Related Barriers -> Sustainable Housing	-0.574	0.161	3.443**	Supported	0.192	0.053	-0.830	-0.327
H6 Retrofitting-Related Barriers -> Sustainable Housing	0.824	0.155	5.087**	Supported	0.430	0.184	0.563	1.062

**p < 0.01, *p < 0.05

R² (Sustainable affordable housing = 0.433)

Effect Size (f²) are according to Cohen (1988), f² values: 0.35 (large), 0.15 (medium), and 0.02 (small)

Predictive Relevance (q²) of predictor independent construct as according to Henseler et al (2009), q² values: 0.35 (large), 0.15 (medium), and 0.02 (small).