

1 **A risk based approach to non-native species management and biosecurity planning**

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7 **ABSTRACT**

8 The introduction of non-native species (NNS) is becoming an increasing problem across the globe.

9 The need to identify and manage the pathways of their introduction has been identified as a priority
10 for biosecurity management. There is a clear role for marine spatial planning to provide a multi-
11 sector framework to assist in this management. A risk-based approach to identifying pathways and
12 areas of introduction has been developed for the Shetland Islands (north Scotland), as part of the
13 Shetland Islands' Marine Spatial Plan, Scotland. Working closely with local stakeholders was key to
14 this process, which incorporates local and national data sets to form a high resolution model. It has
15 been successfully used within the SIMSP and to guide the development of the Biosecurity Plan for
16 the Shetland Islands. It also highlights the requirements for national and local legislation and policy
17 to address and reduce all pathways within a region.

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19 **Keywords:** non-native species, biosecurity planning, marine management, marine spatial planning,
20 risk modelling

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22 **1. INTRODUCTION**

23 The distributions of marine taxa are limited by natural barriers to their dispersal [1], including
24 geographical distance, temperature gradients, and current regimes. Over the last 150 years, human
25 activities have increasingly been altering and bridging these barriers [2] leading to an increased and
26 unnatural distribution of many species. Species which have been intentionally or unintentionally
27 introduced outside their native range are referred to as 'non-native species' (NNS) [3].

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29 The introduction of NNS has the potential to have significant impacts on biodiversity as well as serious
30 economic and social consequence [4], with the rate of introduction increasing across Europe [5]. As a
31 result a range of legislative measures have been developed which target the vectors and pathways of
32 introduction of NNS, and their subsequent impacts [5]. Within the European Union the main policy
33 and legislative drivers to target marine NNS are the Marine Strategy Framework Directive (MSFD), the
34 Biodiversity Strategy [6,7], and EU Regulation No. 1143/2014 on Aquatic Invasive Species [8].
35 Internationally the Convention on Biological Diversity (CBD) sets a series of guiding principles to
36 address the impacts of NNS [3].

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38 The MSFD requires that all member states achieve 'Good Environmental Status' (GES) of marine
39 ecosystems by 2020, evaluated across 11 descriptors [9]. The impacts of NNS are evaluated as one of
40 these descriptors, with member states required to ensure that "non-indigenous species introduced
41 by human activities are at levels that do not adversely alter the ecosystem" [9]. Whilst the EU
42 Biodiversity Strategy aims that by 2020 "Invasive alien species (IAS) and their pathways are identified
43 and prioritised, priority species are controlled or eradicated, and pathways are managed to prevent
44 the introduction and establishment of new IAS" [7].

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The CBD proposes a hierarchical structure for tackling the spread of NNS, with prevention identified as the initial most cost-effective strategy, with eradication, containment, control and mitigation necessary if an introduction occurs. The management of the pathways of NNS introduction is therefore central to preventative management [10].

Introduction pathways may involve either accidental or intentional movement of species as a consequence of human activities [11,12]. Ballast water and hull fouling, associated with maritime activity, are responsible for the vast majority of accidental marine translocations around the world [13,14,15,16]. Non-native species have also been introduced deliberately for aquaculture purpose, which has also caused the accidental introduction of other NNS as hitchhikers [17].

The ability for a NNS to survive and become established in a new area is dependent on a number of environmental factors such as temperature, pH, salinity and pollution levels [18]. However, manmade structures can act as stepping stones for NNS in areas where they otherwise would not be able to survive, through the provision of hard substrate. These physical habitats, or habitat-islands, (e.g. piers, breakwaters, seawalls, docks and marinas, boat hulls, and ballast tanks) often support assemblages that are distinct from neighbouring communities [19]. This can make them more susceptible to the establishment of NNS.

Reducing the risk of the introduction of a NNS through pathway management of NNS is complex, especially in the marine environment [20]. However, by identifying the areas around the coastline where there are high levels of activity related to introduction pathways it is possible to obtain an indication of the likelihood of a species being introduced at that location [20]. This approach has been used to identify introduction hotspots around the UK in 70 × 70 km grid squares [20]. The purpose of an assessment will influence the level of spatial detail or resolution that will be appropriate, however the availability, accuracy, and resolution of the underlying data may also have a significant influence. For strategic national decision making it is likely that a lower resolution would be adequate to drive decision making compared to more localised planning, where a higher resolution is likely to be required.

In Scotland management of NNS is primarily driven by the Wildlife and Natural Environment (Scotland) Act 2011 (WANE Act) and the Wildlife and Countryside Act (1981). The WANE Act places personal responsibility directly onto all marine users (both commercial and recreational users) to prevent the spread and introduction of NNS. Whilst the overarching management and use of the marine environment is primarily driven by the Marine Scotland Act 2010 (the 'Marine Act'). The Marine Act sets out a framework for the development of both a National Marine Plan for Scotland and also a series of 11 locally managed regional marine plans. These plans can help to provide an overarching multi-sector framework for the development of biosecurity plans, which can help to identify pathways of introduction to ensure compliance with both national and international legislative and policy requirements relating to NNS.

The National Marine Plan for Scotland was formally adopted in March 2015, and is now being followed by the phased development and implementation of regional marine planning. The first areas identified to develop regional marine plans are the Shetland Islands and the Clyde. One of the

90 reasons these areas have been chosen is they initially trialled marine planning through a Scottish
91 Government funded pilot 'Scottish Sustainable Marine Environment Initiative' (SSMEI) from 2006 to
92 2010. Since the end of the pilot scheme support from Marine Scotland has allowed their continued
93 development. This has enabled both areas to integrate biosecurity planning into the marine spatial
94 planning process through the development of biosecurity plans. These biosecurity plans have
95 incorporated NNS monitoring, awareness raising, and advice on prevention and eradication of NNS.
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97 To identify the areas of the Shetland coast subject to the highest risk of the introduction of NNS an
98 assessment of pathways and stepping stones has been undertaken using 5 × 5 km grid square
99 resolution. In addition, an assessment has been undertaken to identify areas which are most
100 sensitive to the impacts from the introduction of NNS, either through their economic or ecological
101 value to enable the monitoring of these areas. The model outputs will enable targeted monitoring for
102 marine NNS. The outputs will also help the development of specific policies to reduce the risk of
103 introduction of NNS, helping to guide decision making.

104

105 2. METHOD

106 2.1 Risk mapping

107 To identify spatially varying 'risk level' for the introduction and establishment of NNS a model was
108 developed in ArcGIS® 10.2, using the spatial analysis toolbox and model builder. This was developed
109 through a five step process:

- 110 - Identification of pathways and stepping stones (see Section 2.1.1)
- 111 - Collection and mapping of spatial data (see Section 2.1.2)
- 112 - Assigning a risk score to each activity (see Section 2.1.3)
- 113 - Model creation in ArcGIS
- 114 - Mapping overall risk

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116 2.1.1 Identification of pathways and stepping stones

117 Potential pathways for the introduction of NNS were identified from the current literature. The
118 pathways identified as relevant to the Shetland marine area were:

- 119 • Vessel biofouling
- 120 • Transport within ballast water
- 121 • The movement of farmed finfish and well boat water into Shetland from other parts of the
122 UK and Europe

123

124 Other identified pathways include the import of live seafood, ornamental fish and bait. However
125 these industries do not exist in Shetland. In addition the import of shellfish for aquaculture purposes
126 can pose a biosecurity risk, however in Shetland this does not currently occur, with the shellfish
127 industry relying on natural spat settlement.

128

129 Manmade structures that can form stepping stones for the establishment and spread of NNS were
130 identified as:

- 131 • Marine access infrastructure e.g. marinas, jetties, breakwaters, piers
- 132 • Marine renewable devices
- 133 • Aquaculture equipment (finfish, shellfish, and seaweed farms)

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2.1.2 Collection and mapping of spatial data

Data on the distribution of marine activities identified as potential NNS pathways and stepping stones were compiled from publicly available data held within the Shetland Islands' Marine Spatial Plan (SMSP) [21], with the exception of shipping data which utilised Automatic Identification System (AIS) data held by the NAFC Marine Centre but is not publicly available, Table 1. Prior to inclusion in the sub-models initial data manipulation was required to allow the data to be converted to intensity levels within 5×5 km grid squares using the 'fish net' tool in ArcGIS.

(Table 1 about here)

2.1.2.1 Shipping- Hull biofouling:

Spatial and temporal variation in shipping activity was calculated using AIS data collected from a single point receiver positioned centrally in Shetland [23]. AIS is a shipboard transponder which automatically transmits vessel information in a data package termed a ping, through VHF, as a ship to ship or ship to shore signal. Each ping provides information on the position of vessels every three minutes when steaming and every ten minutes when in port. It also provides a range of information including a vessel identifier, position, time stamp, speed, course, vessel type and dimensions, destination, and last port of call [24].

Processed AIS data collected from January to December 2013 was split into 11 shipping types; recreation/pleasure, aquaculture well boats (live fish transport), oil/chemical tankers, research/survey vessels, passenger, oil related, inter island ferries, harbour, fishing vessels, cargo ships and 'other'.

AIS data also provides information on the last port of call of each vessel, this information was used to establish the spatial distribution of shipping traffic and whether Shetland could be an initial introduction point for NNS or whether the secondary spread of already established NNS from elsewhere in Europe would be the primary pathway.

To calculate the risk of the NNS introduction from biofouling, shipping intensity was calculated from AIS data for 5×5 km grid squares for each shipping type. As shipping data was collected every three minutes, shipping intensity was converted to a daily risk level by dividing by 240.

2.1.2.2 Ballast water exchange

The volume of water released through ballast water exchange was calculated using published port statistics relating to the number and type of visiting vessel. Uniquely in the UK Sullom Voe records the volume of ballast water exchanged each year, although it will vary each year depending on the number of tanker visits [25]. For Lerwick and Scalloway harbours the size and type of the vessel can be used to estimate the volume of ballast likely to be exchanged from port statistics [26]. Only cargo vessels, tankers, passenger, oil related, and well boats were used to calculate ballast water exchange volumes as ships only need to exchange ballast when taking on board additional cargo. Ballast water exchange values were calculated for 5×5 km grid squares for Shetland's main harbours (Sullom Voe, Scalloway, and Lerwick).

179 2.1.2.3 Aquaculture species movement

180 In Shetland nearly all finfish farms bring smolts (juvenile fish) from the UK mainland every second
181 year via live fish transfer in a well boat to sea sites for on-growing. To calculate the risk associated
182 with fish import finfish farm intensity was calculated for 5 × 5 km grid squares.

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184 2.1.2.4 Stepping stones

185 To calculate the increased risk of establishment of NNS from the provision of hard substrate the
186 intensity of each type of manmade structures (marine access infrastructure, marine renewables, and
187 aquaculture production sites) was calculated in 5 × 5 km grid squares.

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189 2.1.3 Assigning risk scores

190 The risk score associated with each pathway and stepping stone was calculated using three criteria;
191 probability of introduction through the activity, frequency of the activity, and the confidence in the
192 data relating to the activity (Table 2). This approach has been adapted from the cumulative pressure
193 risk mapping undertaken within the SMSP [27]. The probability of introduction was assessed from
194 literature review including international reviews (e.g. [28, 29] and national assessments (e.g.
195 [20,30,31,32]), whilst taking account local mitigation or local industry specific practices. The
196 frequency of an activity and confidence in the data available was assessed from local data sets.
197 Higher overall scores were associated with a higher risk (Table 3), a worked example for biofouling
198 due to transportation for each vessel type is given in Table 4.

199 Risk scores were assigned within four distinct sub-models; the risk of introduction through biofouling,
200 the risk of introduction through ballast water exchange, the risk of introduction due to the
201 aquaculture species movement, and the risk of establishment through the presence of manmade
202 structures (stepping stones). Risk scores from each sub-model were combined using the ‘weighted
203 sum’ tool in ArcGIS, to produce a relative risk map for the Shetland Islands.

204 (*Table 2, 3, 4 about here*)

205

206 2.2 Sensitivity mapping

207 In order to identify spatially varying relative ‘sensitivity level’ to the introduction and establishment
208 of NNS a risk model was developed in ArcGIS 10.2, using the spatial analysis toolbox and model
209 builder. Data sources were identified and mapped in 5 × 5 km grid squares as per section 2.1.2.
210 Sensitivity was identified through literature review [e.g. 33,34], with relative sensitivity mapping
211 separated into two distinct sub-models, one focusing on economically sensitive areas and one
212 focusing on ecologically sensitive areas.

213

214 2.2.1 Economic sensitivity

215 Marine activities that were identified as having the potential to be directly impacted by NNS were
216 identified as finfish farms, shellfish farms, seaweed farms, and fisheries. The intensity of these
217 economically important marine activities was calculated for 5 × 5 km grid squares using the ‘fish net’
218 tool in ArcGIS. A relative sensitivity score was assigned based on the relative likelihood each activity
219 will be impacted by NNS, with a higher score associated with a higher risk (Table 5).

220

221 (*Table 5 about here*)

222

223 *2.2.2 Ecological sensitivity*

224 Areas considered of high ecological value were identified and their presence was calculated for 5 × 5
225 km grid squares. Sensitive areas were identified as those areas designated for nature conservation
226 purposes including Special Areas of Conservation (SAC), Special Protection Areas (SPAs), Marine
227 Protected Areas (MPAs), and Sites of Special Scientific Interest (SSSI). A relative score was assigned
228 based on the ecological value of each area with a higher score associated with a higher risk (Table 6).

229
230 *(Table 6 about here)*

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232 *2.2.3 Sensitivity mapping*

233 Relative sensitivity of areas to NNS was calculated by overlaying the economic and ecological
234 sensitivity model outputs. Prior to overlaying fuzzy logic, a tool used in GIS to compare disparate
235 features, was used to rescale the sensitivities range from 0 to 1 (with one being the highest
236 sensitivity). This ensured that economic and ecological sensitivity were given equal weight.

237
238 **2.3 Model testing**

239 Model resilience was assessed for both risk and sensitivity mapping by doubling the weighting of
240 each model component and comparing the results to the equal weighting model output. For the risk
241 model, each of the potential pathways and stepping stones for NNS were doubled in the final
242 summation step of the model. For the sensitivity model, the economic and ecological components
243 were doubled in the final summation step of the model, and each model output re-scaled.

244
245 **3. Results**

246 **3.1 Risk model**

247 *3.1.1 Model data*

248 *3.1.1.1 Shipping- ballast water exchange*

249 Estimates of yearly ballast water exchange volumes indicated the highest volumes occurred in
250 Sullom Voe, followed by Lerwick and Scalloway port areas (19.47 MMT, 5.0 MMT, 1 MMT), Figure 1.

251
252 *(Figure 1 about here)*

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254 *3.1.1.2 Shipping- biofouling*

255 Processed monthly AIS data from 2013 recorded 731 614 vessel pings, which related to over 200
256 vessels, 84% of these were recorded within the 12 nm limit. AIS data indicated that the last port of
257 call showed a large geographical spread, including north and central America, Europe, north Africa,
258 Scandinavia, Russia, and the Middle East (Figure 2). Shipping intensity mapping showed highest
259 densities around the Shetland coast are associated with the Lerwick and Scalloway port areas, Figure
260 1.

261
262 *(Figure 2 about here)*

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264 *3.1.1.3 Stock movement*

265 There were 144 finfish farms located around the Shetland Islands in 2014. Geographic spread of
266 farm sites covered the majority of the coast with the exception of the southeast of Shetland. High

267 intensity areas included the larger sheltered sounds e.g. between Yell and Unst, voes e.g. Swarbacks
268 Minn, and between islands e.g. Burra Isles, Figure 1.

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270 3.1.1.4 Manmade structures

271 There were 342 marine access infrastructure points (including piers, jetties, marinas, and quays), 144
272 fish farms, 163 shellfish farms, 3 seaweed farms and 2 licensed renewable sites. The highest
273 intensity of marine structures was focused on harbour areas (Lerwick, Scalloway, Sullom Voe) and to
274 a lesser extent sheltered sounds and voes, Figure 1.

275

276 3.1.2 Model results

277 Model outputs were mapped for overall risk (Figure 3). Relative risk was grouped into five 'levels'
278 using natural breaks (also known as natural jenks) broken down by: low (total risk score <5), low-
279 medium (5 ≤ total risk score <20), medium (20 ≤ total risk score <50), high (50 ≤ total risk score <166),
280 and very high (total risk score ≥166). Two grid squares were classified as 'very high' risk (Lerwick
281 harbour), four as 'high' risk (Sullom Voe harbour, Scalloway harbour, and outer Lerwick harbour) and
282 four 'medium' risk (outer Scalloway harbour, Swarbacks Minn, Vaila Sound, and Symbister harbour)
283 a further 30 areas were classified as 'low-medium' risk. Visual assessment by stakeholders of the
284 final model output confirmed the results were realistic, e.g. areas of high activity were areas of high
285 risk.

286

287 (Figure 3)

288

289 3.2 Sensitivity model

290 3.2.1 Model data

291 3.2.1.1 Economic sensitive areas

292 The economic sensitivity sub-model indicated the highest economic sensitivity occurred in
293 Scalloway, Burra Isle, Collafirth Ness, Vementry Sound, Swarbacks Minn, and Collievoe (Yell), Figure
294 4.

295

296 3.2.1.2 Ecologically sensitive areas

297 There were 53 areas in Shetland designated for their ecological importance (13 SAC, 13 SPAs, 25
298 SSSI, and two MPAs). Ecologically important areas were found all around the Shetland coast, with
299 Fetlar, north Yell Sound, and Mousa showing the highest density of ecologically important areas,
300 Figure 4.

301

302 (Figure 4 about here)

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304 3.2.2 Model results

305 Model outputs were mapped for overall sensitivity to the introduction of NNS (Figure 5). Relative
306 sensitivity was grouped into five 'levels' using natural breaks (Figures 5): low (total risk score <0.2),
307 low-medium (0.2 ≤ total risk score <0.5), medium (0.5 ≤ total risk score <0.7), high (0.7 ≤ total risk
308 score <1.0), and very high (total risk score ≥1.0). Three grid squares were classified as 'very high'
309 sensitivity (south Unst, Hascosay sound, and Swarbacks Minn), seven as 'high' risk (north and west
310 Fetlar, Ronas Voe, Vementry, Burra Isle, and Collafirth Ness) and 28 as 'medium' risk, with a further

311 38 areas classified as 'low-medium' risk. Visual assessment by stakeholders of the final model output
312 confirmed the results were realistic, e.g. areas of high value were identified as areas of highest risk.

313
314 (*Figure 5 about here*)

315
316 3.3 Model resilience

317 The doubled weighting model outputs (Figures 6 and 7) were compared to the equal weighting
318 model output (Figures 3 and 5) to assess model output resilience. Testing of the 'risk' model
319 indicated that the areas associated with high risk or above did not alter when weighting of the
320 ballast water exchange or aquaculture stock movement model was doubled (Table 7). However, a
321 small increase in the number of areas of high risk and above was seen by doubling the weighting of
322 the 'biofouling' sub-model, creating one additional grid square in the fishing harbour Symbister.
323 Increasing the weighting of marine structures had the greatest impact (+2, Table 7), with outer
324 Scalloway harbour and Vaila Sound (aquaculture production areas) also becoming classified as 'high'
325 risk. Model iterations were visually compared to the equal weight model and whilst the change in
326 model outputs were small it was felt the additional areas classified as 'high' did not accurately reflect
327 additional risk, with the equal weighting model providing a better reflection of the relative risk
328 levels.

329
330 (*Table 7 about here*)

331
332 Testing of the 'sensitivity' model indicated that the areas associated with high risk or above reduced
333 when economic and ecological sensitivity was doubled, and then re-classified using natural break
334 Table 7). The overall number of areas classified as relatively 'high' or 'very high' sensitivity decreased
335 when model components were doubled. Model iterations were visually compared to the equal
336 weight model and it was considered that the double weighted models under-represented sensitivity.

337
338 (*Table 7 about here*)

339
340 (*Figure 6 and 7 about here*)

341 342 **4. Discussion**

343 The modelled outputs indicate that the Shetland coastline has a spatially varying risk level and
344 sensitivity to the introduction and establishment of non-native species (NNS). This spatial variation is
345 not homogenous or random, with highest risk levels centred on the main ports, and inshore areas
346 associated with highest levels of marine developments and activities (e.g. shipping, shore access
347 points, and marine aquaculture). Economic, social, and cultural use of the marine environment are
348 often focused in the near-shore environment, due to ease of access, costs and technical constraints
349 associated with accessing resources further offshore [35]. It is therefore not surprising that these
350 inshore areas are associated with the highest risk of introduction and establishment of NNS.

351
352 Areas of high economic sensitivity are not identical to areas of highest risk, this is because
353 economically important activities are dispersed around the Shetland coast, whilst highest risk areas
354 are associated with the main ports which act as hubs for transportation and as access points to
355 activities which take place elsewhere (e.g. aquaculture or fisheries). In contrast, ecological sensitivity

356 is widespread around the Shetland coast; however few ecologically sensitive areas were identified
357 offshore. This may reflect that the majority of evidence on the presence of ecologically important
358 features is often concentrated close to land, in part due to the technical and monetary constraints of
359 surveying further offshore [35]. This bias may be particularly pertinent when considering the
360 potential ecological impacts of offshore developments (e.g. marine renewables, oil and gas), both
361 through their potential to introduce NNS and to provide a suitable habitat for their establishment.
362 Thus, areas with low ecological sensitivity are not necessarily without ecologically important
363 features.

364

365 The identification of areas of high risk of introduction and establishment of NNS, and areas of high
366 sensitivity allows a targeted, evidence based approach to NNS monitoring, enabling resources to be
367 directed where they will be most effective. Whilst for this study a relative threshold score of 'high'
368 was chosen as a level at which monitoring should be initiated, it could be altered if surveying
369 indicated the threshold for monitoring was too high or if resources to undertake monitoring became
370 more constrained. However, this does not preclude initial introduction occurring in areas classified
371 as lower risk. To help reduce the chance that an introduction goes undetected, guidance leaflets
372 have been developed to raise awareness amongst marine users and businesses to allow for public
373 detection of NNS outside of monitored areas.

374

375 An effective monitoring programme can allow early detection and potential eradication if a
376 potentially harmful NNS is detected, helping to ensure compliance with the MSFD and EU
377 Biodiversity Strategy requirements. However, it is recognised that prevention is the most cost
378 effective strategy for NNS management [3]. Understanding the pathways of the spread of NNS can
379 allow the development of regulation, policies, and guidance targeted at identified risks and an
380 assessment of their effects. It can also be used to assess the impacts of these management
381 measures. Effective targeting of pathways is a key aim of the EU Biodiversity Strategy.

382

383 In Shetland shipping and ballast water exchange were identified as the most significant pathway for
384 the introduction of NNS, with AIS data identifying direct shipping routes from a range of
385 international locations; with ballast water exchange levels in Sullom Voe, one of the highest in the
386 UK. Whilst the Biosecurity Plan for the Shetland Islands provides advice to marine users on measures
387 to reduce the risk of spreading NNS, it is more challenging to reduce risks associated with vessels
388 travelling to Shetland from elsewhere. Control of national and international shipping pathways will
389 need to be addressed through national and international policy and legislation. Once enacted the
390 International Convention for Control and Management of Ships' Ballast Water and Sediment [36] will
391 seek to reduce the spread of NNS through ballast water management and control, but it is yet to be
392 adopted as at least 30 states that represent 35% of the World's shipping must first ratify the
393 convention. However, once implemented, this convention has the potential to reduce the risks
394 associated with ballast water exchange.

395

396 Establishment through stepping stones and reducing secondary spread are more easily targeted at a
397 local level. The use of both local datasets and locally verified national datasets within this model has
398 meant that it contains a more exhaustive list of features and activities within the Shetland region
399 than could be replicated nationally. Within Shetland the use of AIS data to assess shipping
400 movement proved to be particularly valuable. Whilst shipping statistics are available for larger ports,

401 potentially detailing the number and type of visiting vessels, they are not normally available for
402 smaller ports, marinas or private jetties. Subsequently for more remote or rural locations limited
403 data may be available, and shipping levels are more accurately calculated using AIS rather than port
404 statistics only.

405

406 Whilst AIS provided a useful resource for this study there are some limitations in its use. In some
407 parts of Shetland the AIS data showed distinct shadows due to land elevation interfering with the AIS
408 signal [23], potentially reducing the accuracy of the subsequent risk assessment. This could be easily
409 overcome by installing a network of AIS receiver aerials at appropriate positions around Shetland in
410 order to maximise coverage [23].

411

412 AIS transmitter systems are fitted by many commercial vessels as a statutory requirement, in
413 addition some vessels who fall outside these regulations have chosen to voluntarily fit AIS tracking
414 systems for safety purposes [23]. However, there will still be a number of smaller commercial and
415 recreational vessels that do not have AIS fitted, and therefore have not been included in the model.
416 For some regions this could represent a significant proportion of shipping traffic, however due to
417 Shetland's remote location and frequent inclement weather the number of vessels visiting Shetland
418 which are not fitted with AIS will be relatively small. Whilst there are a number of vessels based in
419 Shetland without AIS, these do not normally leave Shetland and therefore do not pose a significant
420 risk for the introduction of NNS from elsewhere, although they would have the potential to
421 contribute to secondary spread within Shetland.

422

423 Due to the spatial resolution of the available data the model output has a higher resolution (5×5
424 km grid squares) than has been used in a UK wide assessment (70×70 km grid squares) [20]. This
425 higher resolution allows the identification of specific areas for monitoring and more detailed local
426 and project level decision making. Whilst a higher resolution could have been used in the model, $5 \times$
427 5 km grid squares were considered appropriate as this resolution incorporated the area equivalent
428 to a harbour or cluster of marine use (e.g. aquaculture farms operated by one company). It should
429 however be noted that country wide assessments are used to drive the distribution of national
430 resources and identify risk over a large area and for this scale of assessment a lower resolution is
431 likely to be sufficient.

432

433 As the model has been developed using ArcGIS model builder and is publicly available via the NAFC
434 Marine Centre website, it can also be used by other regions to develop their own monitoring
435 programmes and biosecurity plans. However, model outputs are only as good as the input data.
436 Stakeholder engagement, data confidence assessments, and model testing are important
437 considerations when using spatial data to guide decision making [37,38].

438

439 Whilst there were no significant data gaps identified during the development of this project, relative
440 risk scores were based on information from the current literature, whilst considering local industry
441 practice. The actual and perceived risk of the introduction of NNS may change over time as new data
442 becomes available, new management measures are introduced, including the implementation of
443 local and national policies and legislation, and as new marine industries evolve. This may be
444 particularly pertinent as the model results are being pro-actively used to identify and target 'risks' to

445 help with the development of management measures. The model is however easily adapted to
446 incorporate new information and risk as new data and information becomes available.

447

448 Whilst the model focuses on human mediated movement only, once a NNS has been introduced to a
449 new area secondary spread can also occur due to natural spread through range expansion. Natural
450 spread was not incorporated due to the relatively large distances between the Shetland Islands and
451 the nearest land masses, which makes spread through natural dispersal unviable and unlikely for
452 many species. However, on mainland Britain and Europe it is likely to be a more significant
453 consideration as the distances between suitable areas for establishment will be smaller.

454

455 It is acknowledged that other risk assessment methodologies for NNS exist [e.g.20], however the
456 approach used in this model is consistent with other assessments used within the Shetland Islands'
457 Marine Spatial Plan, for example to assess and map cumulative pressures [27]. Non-native species
458 monitoring results undertaken in 15 locations across Shetland from 2012 to 2014 appear to correlate
459 with model predictions, with the highest number of NNS found in the areas associated with highest
460 risk [39]. In addition model testing ensured confidence in the model outputs.

461

462 Decision support tools, such as GIS, are useful aids in planning future spatial and temporal uses of
463 the marine environment [40]. Whilst model limitations are recognised, models can provide useful
464 tools to understand the impacts of multi-sector marine use and its management. This is particularly
465 pertinent to understanding the potential effects of marine spatial planning, which aims to take an
466 ecosystem based approach to marine management [41]. This emerging approach has the potential
467 to provide a useful tool to achieve the requirements of a range of legislation across a multitude of
468 sectors, replacing the historical sectorial approach. In Shetland the integration of biosecurity
469 planning into an overarching management framework has helped to identify risks, target resources,
470 and ensure both licensed (e.g. aquaculture, renewables) and spatially unlicensed (e.g. recreation,
471 shipping) are considered equally and appropriately targeted. However, it has also highlighted the
472 limitations of local management and where international and national legislation is also required.

473

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477 and the stakeholders involved in this work.

478

479 Table 1: Data sets used within the of the risk assessment model

| Pathway/ stepping stone | Risk | Dataset | Year | Source | Confidence assessment score* |
|--|------------------------------------|--------------------------|-------------|------------------------------------|---|
| Pathway | Vessel biofouling | AIS data | 2013 | NAFC Marine Centre | Medium-high |
| Pathway | Ballast water | Port statistics | 2013 | NAFC Marine Centre | High |
| Pathway | Aquaculture species movement | Finfish farm location | 2014 | SMSP / Shetland Islands Council | High |

| | | | | | |
|-----------------|--|--|------|--------------------------------|------|
| Stepping stone | Marine access infrastructure | marina, jetty, breakwater, pier locations | 2014 | Various compiled by SMSP | High |
| Stepping stones | Marine renewable devices | Works licence locations | 2014 | SMSP/ Shetland Islands Council | High |
| Stepping stones | Aquaculture equipment finfish, shellfish and seaweed farms | Site consent locations (planning consent or works licence) | 2014 | SMSP/ Shetland Islands Council | High |

480 * Source: NAFC Marine Centre [22]

481

482 Table 2: Model risk assessment criteria for the probability of an introduction (A), frequency of activity
483 (B), and confidence in the data (C)

| A | Rating | Probability of introduction | Commentary |
|----------|---------------|------------------------------------|--|
| | 5 | Definite | Well documented evidence of risk of introduction of NNS occurring during normal operations |
| | 4 | Likely | Some evidence of impact risk of introduction of NNS under normal operations |
| | 3 | Possible | Unknown level of risk of introduction of NNS |
| | 2 | Unlikely | Very little evidence of risk of introduction of NNS |
| | 1 | Remote | No evidence of risk of introduction of NNS |
| B | Rating | Frequency of Activity | Commentary |
| | 5 | Continual | Occurs continually e.g. hull fouling |
| | 4 | Regular | Every week |
| | 3 | Intermittent | Approximately once a month |
| | 2 | Brief | One-off event - over several days |
| | 1 | One-off event | One-off event - up to one day duration e.g. ballast water exchange |
| C | Rating | Confidence in data | Commentary |
| | 3 | High | A fixed location where the scale / extent of activity is known |
| | 2 | Medium | A fixed location but questionable source or scale / extent of activity. |
| | 1 | Low | An estimated location and questionable source or scale / extent of activity. |

484

485 Table 3: Risk assessment score assigned to each marine activity or structure

| Activity/structure | Risk | Risk Score |
|---------------------------|-------------|-------------------|
| Ballast water exchange: | pathway | |
| - Cargo | | 0.18 |
| - Tankers | | 0.31 |
| - Passenger | | 0.18 |
| - Oil related | | 0.18 |
| - Well boat | | 0.18 |
| Biofouling: | pathway | |

| | | |
|------------------------------|----------------|------|
| - Cargo | | 0.43 |
| - Fishing | | 0.08 |
| - Harbour | | 0.08 |
| - Oil related | | 0.37 |
| - Other | | 0.37 |
| - Passenger | | 0.37 |
| - Internal Ferry | | 0.08 |
| - Pleasure | | 0.54 |
| - Research | | 0.28 |
| - Tankers | | 0.43 |
| - Well boat | | 0.37 |
| Stock movement | pathway | 0.18 |
| Manmade structures: | stepping stone | |
| Marine access infrastructure | | 0.77 |
| Aquaculture equipment: | | |
| - finfish | | 0.62 |
| -shellfish | | 0.62 |
| -algae cultivation | | 0.62 |
| Marine renewable device | | 0.62 |

486

487 Table 4: Risk assessment scores for NNS introduction through shipping biofouling, based on criteria
488 A-C (detailed in Table 2).

| vessel type | A | B | C | Total (B-C) | A* | Score |
|--------------------|----------|----------|----------|--------------------|-----------|--------------|
| Cargo | 4.00 | 5.00 | 2.00 | 7.00 | 28.00 | 0.70 |
| Fishing | 1.00 | 5.00 | 2.00 | 7.00 | 7.00 | 0.18 |
| Harbour | 1.00 | 5.00 | 2.00 | 7.00 | 7.00 | 0.18 |
| Oil related | 4.00 | 5.00 | 2.00 | 7.00 | 28.00 | 0.70 |
| Other | 4.00 | 5.00 | 2.00 | 7.00 | 28.00 | 0.70 |
| Passenger | 3.00 | 5.00 | 2.00 | 7.00 | 21.00 | 0.53 |
| Internal Ferry | 1.00 | 5.00 | 2.00 | 7.00 | 7.00 | 0.18 |
| Pleasure | 5.00 | 5.00 | 2.00 | 7.00 | 35.00 | 0.88 |
| Research | 3.00 | 5.00 | 2.00 | 7.00 | 21.00 | 0.53 |
| Tankers | 4.00 | 5.00 | 2.00 | 7.00 | 28.00 | 0.70 |
| well boat | 3.00 | 5.00 | 2.00 | 7.00 | 21.00 | 0.53 |

489

490 Table 5: Relative economic activity score for economically important activities.

| Activity | Relative sensitivity score (0-1) |
|-----------------------|---|
| Finfish aquaculture | 0.75 |
| Shellfish aquaculture | 1.00 |
| Seaweed aquaculture | 0.75 |
| Fisheries | 0.25 |

491

492 Table 6: Relative economic activity score for ecologically important activities.

| Activity | Relative sensitivity score (0-1) |
|-------------------------------------|---|
| Special Areas of Conservation (SAC) | 1.0 |

| | |
|---|------|
| Special Protection Areas (SPAs) | 0.75 |
| Marine Protected Areas (MPAs) | 0.5 |
| Sites of Special Scientific Interest (SSSI) | 0.5 |

493

494

495 Table 7: Testing model resilience, 'risk' sub-models were doubled in weighting within the final model
 496 summation. The number of grid squares at each risk level and the change in number of grid squares
 497 rated as 'high' or 'very high' are displayed.

| Model weighting | Medium | High | Very high | Increase in high or very high |
|------------------------|--------|------|-----------|-------------------------------|
| Equal weight | 4 | 4 | 2 | N/A |
| Ballast water exchange | 4 | 1 | 5 | 0 |
| Biofouling | 5 | 4 | 3 | +1 |
| Stock movement | 5 | 4 | 2 | 0 |
| Marine structures | 13 | 6 | 2 | +2 |

498

499 Table 8: Testing resilience, 'sensitivity' sub-models were doubled in weighting within the final model
 500 summation. The number of grid squares (5x5 km) at each risk level and the change in number of grid
 501 squares rated as 'high' or 'very high' are shown.

| Model weighting | Medium | High | Very high | Increase in high or very high |
|-----------------|--------|------|-----------|-------------------------------|
| Equal weight | 30 | 9 | 4 | N/A |
| Economic x2 | 11 | 4 | 4 | -5 |
| Ecological x2 | 30 | 7 | 3 | -3 |

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601 Figure captions

602 Fig. 1 Relative risk levels for each activity of structure; (a) ballast water exchange, (b) biofouling, (c)
603 stock movement, (d) manmade structures. *Contains Ordnance Survey data © Crown copyright and*
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