

# Reply to: Shark mortality cannot be assessed by fishery overlap alone

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Nuno Queiroz<sup>1,2</sup>, Nicolas E. Humphries<sup>2</sup>, Ana Couto<sup>1</sup>, Marisa Vedor<sup>1,3</sup>, Ivo da Costa<sup>1</sup>, Ana M. M. Sequeira<sup>4,5</sup>, Gonzalo Mucientes<sup>1</sup>, António M. Santos<sup>1,3</sup>, Francisco J. Abascal<sup>6</sup>, Debra L. Abercrombie<sup>7</sup>, Katya Abrantes<sup>8</sup>, David Acuña-Marrero<sup>9</sup>, André S. Afonso<sup>10,11</sup>, Pedro Afonso<sup>12,13,14</sup>, Darrell Anders<sup>15</sup>, Gonzalo Araujo<sup>16</sup>, Randall Arauz<sup>17,18,19</sup>, Pascal Bach<sup>20</sup>, Adam Barnett<sup>8</sup>, Diego Bernal<sup>21</sup>, Michael L. Berumen<sup>22</sup>, Sandra Bessudo Lion<sup>19,23</sup>, Natalia P. A. Bezerra<sup>10</sup>, Antonin V. Blaison<sup>20</sup>, Barbara A. Block<sup>24</sup>, Mark E. Bond<sup>25</sup>, Ramon Bonfil<sup>26</sup>, Russell W. Bradford<sup>27</sup>, Camrin D. Braun<sup>28,29</sup>, Edward J. Brooks<sup>30</sup>, Annabelle Brooks<sup>30,31</sup>, Judith Brown<sup>32</sup>, Barry D. Bruce<sup>27</sup>, Michael E. Byrne<sup>33,34</sup>, Steven E. Campana<sup>35</sup>, Aaron B. Carlisle<sup>36</sup>, Demian D. Chapman<sup>25</sup>, Taylor K. Chapple<sup>24,109</sup>, John Chisholm<sup>37</sup>, Christopher R. Clarke<sup>38</sup>, Eric G. Clua<sup>39</sup>, Jesse E. M. Cochran<sup>22</sup>, Estelle C. Crochelet<sup>40,41</sup>, Laurent Dagorn<sup>20</sup>, Ryan Daly<sup>42,43</sup>, Daniel Devia Cortés<sup>44</sup>, Thomas K. Doyle<sup>45,46</sup>, Michael Drew<sup>47</sup>, Clinton A. J. Duffy<sup>48</sup>, Thor Erikson<sup>49</sup>, Eduardo Espinoza<sup>19,50</sup>, Luciana C. Ferreira<sup>51</sup>, Francesco Ferretti<sup>52</sup>, John D. Filmlater<sup>20,43</sup>, G. Chris Fischer<sup>53</sup>, Richard Fitzpatrick<sup>8</sup>, Jorge Fontes<sup>12,13,14</sup>, Fabien Forget<sup>20</sup>, Mark Fowler<sup>54</sup>, Malcolm P. Francis<sup>55</sup>, Austin J. Gallagher<sup>56,57</sup>, Enrico Gennari<sup>143,58,59</sup>, Simon D. Goldsworthy<sup>60</sup>, Matthew J. Gollock<sup>61</sup>, Jonathan R. Green<sup>62</sup>, Johan A. Gustafson<sup>63</sup>, Tristan L. Guttridge<sup>64</sup>, Hector M. Guzman<sup>65</sup>, Neil Hammerschlag<sup>57,66</sup>, Luke Harman<sup>45</sup>, Fábio H. V. Hazin<sup>10</sup>, Matthew Heard<sup>47</sup>, Alex R. Hearn<sup>19,67,68</sup>, John C. Holdsworth<sup>69</sup>, Bonnie J. Holmes<sup>70,110</sup>, Lucy A. Howey<sup>71</sup>, Mauricio Hoyos<sup>19,72</sup>, Robert E. Hueter<sup>73</sup>, Nigel E. Hussey<sup>74</sup>, Charlie Huveneers<sup>47</sup>, Dylan T. Irion<sup>75</sup>, David M. P. Jacoby<sup>76</sup>, Oliver J. D. Jewell<sup>77,78</sup>, Ryan Johnson<sup>79</sup>, Lance K. B. Jordan<sup>71</sup>, Warren Joyce<sup>54</sup>, Clare A. Keating Daly<sup>42</sup>, James T. Ketchum<sup>19,72</sup>, A. Peter Klimley<sup>19,80</sup>, Alison A. Kock<sup>43,81,82,83</sup>, Pieter Koen<sup>84</sup>, Felipe Ladino<sup>23</sup>, Fernanda O. Lana<sup>10,85</sup>, James S. E. Lea<sup>38,86</sup>, Fiona Llewellyn<sup>61</sup>, Warrick S. Lyon<sup>55</sup>, Anna MacDonnell<sup>54</sup>, Bruno C. L. Macena<sup>10,13</sup>, Heather Marshall<sup>21,87</sup>, Jaime D. McAllister<sup>88</sup>, Michael A. Meyer<sup>15</sup>, John J. Morris<sup>73</sup>, Emily R. Nelson<sup>57</sup>, Yannis P. Papastamatiou<sup>25</sup>, Cesar Peñaherrera-Palma<sup>19,89</sup>, Simon J. Pierce<sup>90</sup>, Francois Poisson<sup>20</sup>, Lina Maria Quintero<sup>23</sup>, Andrew J. Richardson<sup>91</sup>, Paul J. Rogers<sup>60</sup>, Christoph A. Rohner<sup>90</sup>, David R. L. Rowat<sup>92</sup>, Melita Samoily<sup>93</sup>, Jayson M. Semmens<sup>88</sup>, Marcus Sheaves<sup>8</sup>, George Shillinger<sup>19,24,94</sup>, Mahmood Shivji<sup>33</sup>, Sarika Singh<sup>15</sup>, Gregory B. Skomal<sup>36</sup>, Malcolm J. Smale<sup>95</sup>, Laurence B. Snyders<sup>15</sup>, German Soler<sup>19,23,88</sup>, Marc Soria<sup>20</sup>, Kilian M. Stehfest<sup>88</sup>, Simon R. Thorrold<sup>29</sup>, Mariana T. Tolotti<sup>20</sup>, Alison Towner<sup>59,78</sup>, Paulo Travassos<sup>10</sup>, John P. Tyminski<sup>73</sup>, Frederic Vandeperre<sup>12,13,14</sup>, Jeremy J. Vaudo<sup>33</sup>, Yuuki Y. Watanabe<sup>96,97</sup>, Sam B. Weber<sup>98</sup>, Bradley M. Wetherbee<sup>33,99</sup>, Timothy D. White<sup>24</sup>, Sean Williams<sup>30</sup>, Patricia M. Zárate<sup>100</sup>, Robert Harcourt<sup>101</sup>, Graeme C. Hays<sup>102</sup>, Mark G. Meekan<sup>51</sup>, Michele Thums<sup>51</sup>, Xabier Irigoien<sup>103,104</sup>, Victor M. Eguiluz<sup>105</sup>, Carlos M. Duarte<sup>22</sup>, Lara L. Sousa<sup>2,106</sup>, Samantha J. Simpson<sup>2,107</sup>, Emily J. Southall<sup>2</sup> & David W. Sims<sup>2,107,108</sup>✉

REPLYING TO H. Murua et al. *Nature* <https://doi.org/10.1038/s41586-021-03396-4> (2021)

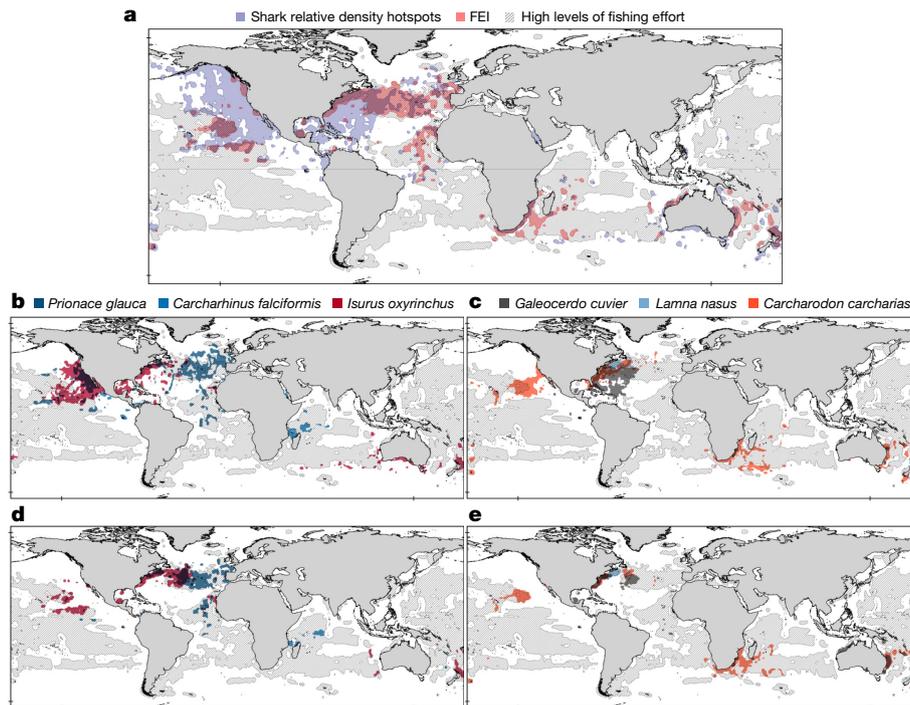
Our previously published paper<sup>1</sup> provided global fine-scale spatiotemporal estimates ( $1^\circ \times 1^\circ$ ; monthly) of overlap and fishing exposure risk (FEI) between satellite-tracked shark space use and automatic identification system (AIS) longline fishing effort. We did not assess shark mortality directly, but in addition to replying to the Comment by Murua et al.<sup>2</sup>, we confirm—using regression analysis of spatially matched data—that fishing-induced pelagic shark mortality (catch per unit effort (CPUE)) is greater where FEI is higher.

We focused on assessing shark horizontal spatiotemporal overlap and exposure risk with fisheries because spatial overlap is a major driver of fishing capture susceptibility and previous shark ecological risk assessments (ERAs) assumed a homogenous shark density within species-range distributions<sup>3–5</sup> or used coarse-scale modelled

occurrence data, rather than more ecologically realistic risk estimates in heterogeneous habitats that were selected by sharks over time. Furthermore, our shark spatial exposure risk implicitly accounts for other susceptibility factors with equal or similar probabilities to those commonly used in shark ERAs<sup>3,5</sup>.

First, actual depth distributions are seldom incorporated in shark ERAs and full vertical overlap with an encounterability probability of one is often applied<sup>3,5</sup>. This is an implicit assumption in our FEI as the pelagic species that we tracked exhibit vertical movements that overlap with depths of pelagic longlines (for example, 18–267 m)<sup>6</sup> during both the day and night<sup>7</sup>. Second, we account for selectivity by focusing our fisheries-independent spatial estimates directly on individuals that were actually caught by the focal fisheries.

A list of affiliations appears at the end of the paper.



**Fig. 1 | Spatial distributions and overlap of sharks and longline fishing vessels.** **a**, Shark relative density hotspots (>75th percentile) and FEI hotspots (>75th percentile) overlaid on high longline fishing effort (higher than average; >50th percentile) at the  $1^\circ \times 1^\circ$  grid size to illustrate the degree of overlap between the different drivers of FEI hotspots. Higher than average fishing

effort is used here to reflect a major driver of FEI hotspots as FEI hotspots do not arise solely as a result of shark density hotspots overlapping with fishing effort hotspots (>75th percentile), the metric used by Murua et al.<sup>2</sup>. **b–e**, Relative density hotspots (**b, c**) and FEI hotspots (**d, e**) for six shark species overlaid on high longline fishing effort. Data are from our original paper<sup>1</sup>.

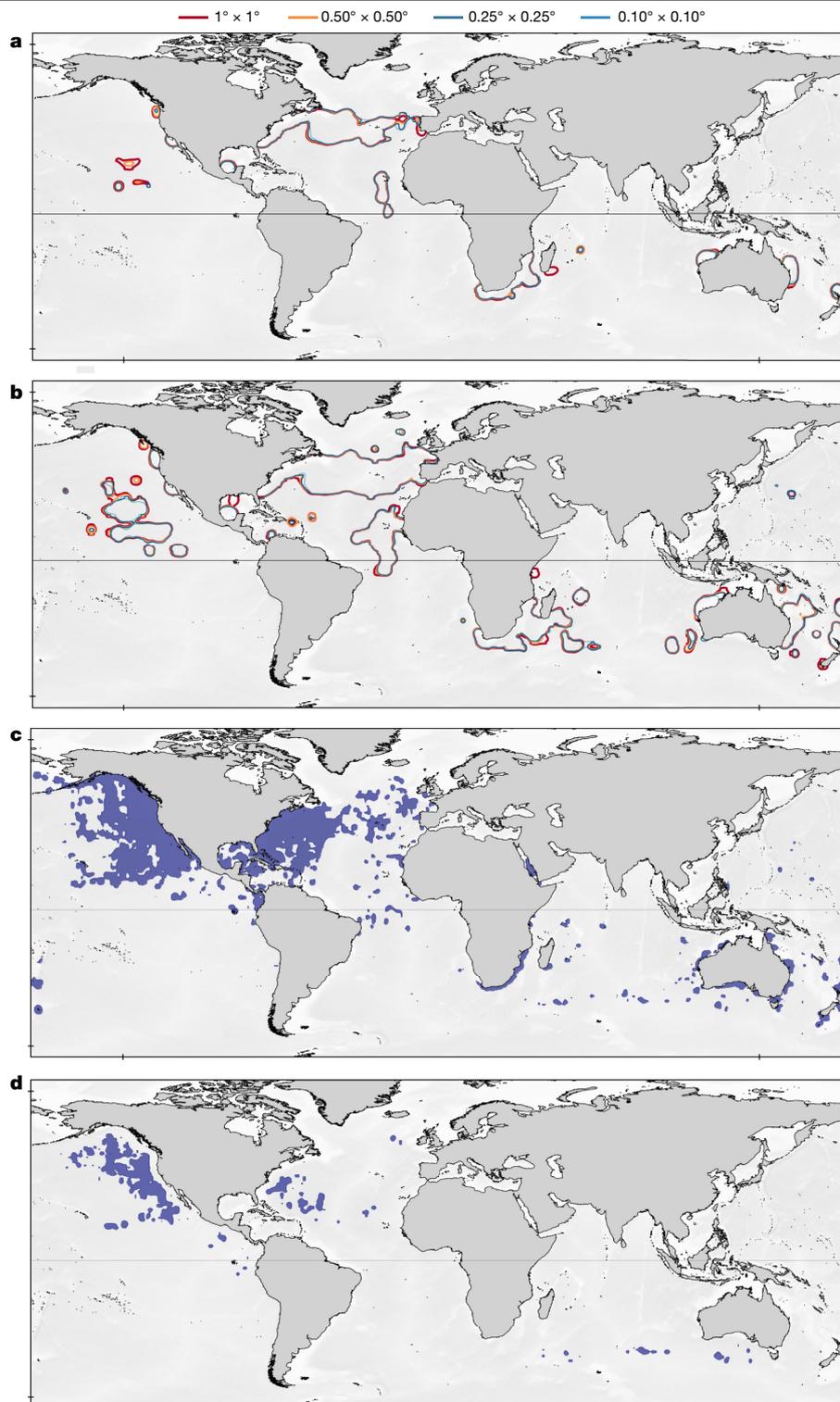
The majority of the 1,804 sharks tagged were caught on commercial-type longline hooks before release. This is equivalent to a selectivity probability of around one as used in shark ERAs<sup>5</sup>. Third, the commercially valuable sharks that we tracked are seldom discarded by major high-seas longlining fleets<sup>8</sup>, indicating that an implicit assumption of a fishing mortality probability of one does not substantially overestimate the mortality that occurs. Murua et al.<sup>2</sup> overlook that fact that although some species with fishing prohibitions (such as silky and great hammerhead sharks) may be released alive, reported hooking mortalities are high (for example, 56% for silky sharks and 96% for great hammerhead sharks)<sup>9,10</sup> in addition to at least around 50% post-release mortality<sup>11,12</sup>. Collectively, this indicates 78–98% total mortality even of prohibited species. The similar assumptions between our analyses and previous assessments result in comparable susceptibility estimates that will not alter our FEI. For example, we estimated that shortfin mako, blue and porbeagle sharks as the highest exposure risk species in the North Atlantic, which were also the shark species with the highest estimated susceptibilities to longline fishing in a recent Atlantic shark ERA<sup>4</sup>.

Regarding FEI being related to fishing-induced shark mortality, we stated<sup>1</sup> that the significant positive relationship between Food and Agriculture Organization (FAO) fishery landings data and individual-species mean FEI “implies that the index reflects fishing-induced shark mortality”. Our conclusion was appropriately cautious because we recognized that FAO landings data were limited in quality, aggregated at regional scales and subject to high levels of unreported or underreported data<sup>13</sup>, and are potentially unrelated to shark relative abundances. Murua et al.<sup>2</sup> confirm the result presented in our paper and also show nine further data combinations that we did not test resulting in eight non-significant positive relationships. However, having few data points ( $n = 8$  species per test) when comparing the spatial complexity of FEI ( $1^\circ \times 1^\circ$  grid) to non-spatially explicit FAO datasets—given the high variability in the quality of landings data—biases results towards non-significance. To address this, we tested linear-regression models for spatially matched

data, including longline CPUE (a relative measure of abundance) of pelagic sharks as the response variable and FEI, fishing effort and number of longline sets as explanatory variables, including interactions with year or month (Supplementary Information). The best model when testing interactions with month was for fishing effort (Akaike information criterion weights (wAIC) = 1), but the deviance explained was similar between this model (46%) and those models that included FEI (42%) or the number of sets (43%). When testing interactions with year, the best model was FEI (wAIC = 0.89), showing a significant and positive relationship with CPUE ( $n = 523$ ,  $r^2 = 0.11$ ,  $F_{9,513} = 7.17$ ,  $P < 0.0001$ ). Bootstrapping tests randomly by removing 1–25% of data confirmed that the best model alternates between fishing effort and FEI as an explanatory variable of shark CPUE. For spatially matched data, therefore, pelagic shark CPUE is significantly greater in areas in which FEI is higher and is as good an explanatory variable of CPUE as fishing effort itself, corroborating our previously published result<sup>1</sup> that FEI reflects fishing-induced shark mortality.

Using spatial exposure risk plots between overlap and FEI to indicate higher or lower than average exposure risk (that is, potential capture susceptibility) is not misleading because the categorization relates specifically to areas in which shark species were tracked and overlap with fishing effort occurred. We previously showed<sup>1</sup> the FEI maps alongside the exposure risk plots to make this point clear. Higher exposure risk can be driven by high FEI when it occurs in specific space-use areas, even if spatial overlap appears relatively low in a region (for example, for white sharks in Oceania). Correct interpretation of our exposure risk estimates requires reference to the areas over which shark hotspots and fishing effort occurred.

FEI hotspots driven by shark hotspots in large-scale ocean ecosystems (for example, the Gulf Stream) led us to conclude that high levels of fishing effort are focused on extensive hotspots of shark space use<sup>1</sup>. Murua et al.<sup>2</sup> generate a new metric (fishing effort hotspots, >75th percentile) to conclude that shark hotspots are not related to main fishing



**Fig. 2 | Effect of scale on the position and extent of FEI hotspots and areas free from AIS longline fishing effort.** **a, b**, The position and extent of FEI hotspots at the >90th percentile (**a**) and >75th percentile (**b**) of the mean FEI do not substantially change across four grid cell sizes from  $1^\circ \times 1^\circ$  to  $0.1^\circ \times 0.1^\circ$ . **c, d**, Global distribution of the shark relative density hotspots estimated from

satellite locations (**c**) and the shark hotspots where there was no recorded AIS longline fishing effort (2012–2016) in ABNJs, the high seas (**d**). **d**, Data from Global Fishing Watch (<https://globalfishingwatch.org/>). This supports our original conclusion that pelagic sharks have limited spatial refuge from the current levels of fishing effort in ABNJs.

effort areas. However, we did not calculate fishing effort hotspots nor relate them to shark density hotspots or FEI hotspots because this approach ignores key drivers of FEI hotspots (see below) and is selective of available data. We did not equate high levels of fishing effort solely to fishing effort hotspots because sharks are often caught and retained by

fishing vessels that did not specifically target sharks, so shark relative density or FEI hotspots should not be expected to correctly predict fishing effort hotspots in the majority of cases. Rather, we showed that FEI hotspots arise from shark relative density hotspots, high fishing effort levels (not only the highest fishing effort levels considered by

Murua et al.<sup>2</sup>), a combination of both, and some (<2%) are driven by lower shark densities or fishing intensities (Extended Data Table 1).

Consistent with our conclusion, vast areas with higher-than-average fishing effort extend across major shark density and FEI hotspots (Fig. 1). For example, FEI hotspots overlap with shark density hotspots in 56% of grid cells globally, and overlap with higher-than-average fishing effort in 81% of grid cells (Fig. 1). That shark density hotspots and higher-than-average fishing effort together drive 39% of FEI hotspots supports our original conclusion. This is even more clearly seen for individual species (Fig. 1b–e and Extended Data Table 2). For example, globally, blue shark hotspots and high fishing effort together drive 50% of blue shark FEI hotspots (Fig. 1b, d) and, regionally, white shark hotspots and high fishing effort in the northeast Pacific together drive 67% of FEI hotspots (Fig. 1c, e). The claim by Murua et al.<sup>2</sup> that shark hotspots are not related to main fishing effort areas is not supported when all drivers of FEI hotspots are considered.

Furthermore, large reductions in grid cell size do not affect FEI hotspots. We previously provided results showing, as expected, that reductions from  $2 \times 2^\circ$  to  $0.1 \times 0.1^\circ$  lowers absolute overlap and FEI values but relative exposure–risk plots remain unchanged (extended data figure 4 and supplementary figure 4 of ref.<sup>1</sup>). It is possible that our results and conclusions could be affected if the spatial positions and extent of FEI hotspots—indicating potential changes in relative drivers that affect overlap and FEI estimates (see above)—were substantially altered as the size of the grid cells decreases. However, the position and extent of FEI hotspots remain largely unchanged as grid size decreases (Fig. 2a, b), indicating that the results and conclusions concerning FEI hotspots are highly unlikely to be affected.

Lastly, we disagree that our analyses do not support our conclusion of limited spatial refuge for pelagic sharks from current levels of fishing effort in Areas Beyond National Jurisdictions (ABNJs). Globally, only about one third of ABNJ shark hotspot grid cells were free from AIS-tracked longline fishing effort, indicating that fishing effort overlapped with the majority of shark hotspots (Fig. 2c, d and Extended Data Table 3). Some heavily fished regions showed even lower levels of spatial refuge, only 13% and 20% of Indian Ocean and North Atlantic shark hotspot grid cells, respectively, were free from fishing effort. Hotspots are areas of preferred habitat where sharks spent most time<sup>1</sup>, thus it was justified to conclude that for the results presented there was limited spatial refuge in ABNJs. The percentage of spatial refuge for sharks in ABNJs decreases to <25% of shark relative density hotspots when additional AIS data that were not previously available are included (Extended Data Table 4), indicating that our original spatial refuges were actually overestimated.

In summary, we think that the arguments presented neither call into question our results and conclusions nor misdirect management efforts as our exposure risk estimates are spatially and temporally explicit. We do not dispute that regional fishery management organizations for tuna have put management measures in place; these were described in our paper<sup>1</sup>. Nevertheless, pelagic sharks have declined globally over many decades<sup>13–15</sup>, strongly indicating that additional measures are still required to conserve populations effectively, including more complete data reporting, catch quotas and greater enforcement<sup>13,15</sup>. The data and analyses in our paper<sup>1</sup> contribute to this goal. Indeed, regional fishery management organizations for tuna state that data on biologically important areas, spatiotemporal distributions of shark stocks and interactions with fishing fleets<sup>8</sup> are needed to aid management. We have provided a first step by making available fishery-independent data<sup>1</sup> on shark spatial density and hotspot locations to complement current assessment approaches.

## Reporting summary

Further information on experimental design is available in the Nature Research Reporting Summary linked to this paper.

## Data availability

Data used in linear-regression modelling are available on GitHub ([https://github.com/GlobalSharkMovement/GlobalSpatialRisk/tree/master/derived\\_data](https://github.com/GlobalSharkMovement/GlobalSpatialRisk/tree/master/derived_data)). Data used to prepare the maps (shark relative spatial density, longline-fishing effort and shark–longline-fishing overlap and FEI) are available on GitHub (<https://github.com/GlobalSharkMovement/GlobalSpatialRisk>).

## Code availability

Code used to prepare the maps (shark relative spatial density, longline-fishing effort and shark–longline-fishing overlap and FEI) is available on GitHub (<https://github.com/GlobalSharkMovement/GlobalSpatialRisk>).

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**Author contributions** N.Q. and D.W.S. planned the data analysis. N.Q. led the data analysis with contributions from M.V., A.M.M.S. and D.W.S. N.E.H. contributed analysis tools. A.M.M.S. undertook linear-regression modelling. D.W.S. led the manuscript writing with contributions from N.Q., N.E.H., A.M.M.S. and all authors. Six of the original authors were not included in the Reply authorship; two authors retired from science and the remaining four, although supportive of our Reply, declined to join the authorship due to potential conflicts of interest with the authors of the Comment and/or their institutions.

**Competing interests** The authors declare no competing interests.

## Additional information

**Supplementary information** The online version contains supplementary material available at <https://doi.org/10.1038/s41586-021-03397-3>.

**Correspondence and requests for materials** should be addressed to D.W.S.

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- <sup>1</sup>Centro de Investigação em Biodiversidade e Recursos Genéticos/Research Network in Biodiversity and Evolutionary Biology, Campus Agrário de Vairão, Universidade do Porto, Vairão, Portugal. <sup>2</sup>Marine Biological Association of the United Kingdom, Plymouth, UK.
- <sup>3</sup>Departamento de Biologia, Faculdade de Ciências da Universidade do Porto, Porto, Portugal.
- <sup>4</sup>UWA Oceans Institute, Indian Ocean Marine Research Centre, University of Western Australia, Crawley, Western Australia, Australia. <sup>5</sup>School of Biological Sciences, University of Western Australia, Crawley, Western Australia, Australia. <sup>6</sup>Spanish Institute of Oceanography, Santa Cruz de Tenerife, Spain. <sup>7</sup>Abercrombie and Fish, Port Jefferson Station, NY, USA. <sup>8</sup>Marine Biology and Aquaculture Unit, College of Science and Engineering, James Cook University, Cairns, Queensland, Australia. <sup>9</sup>Institute of Natural and Mathematical Sciences, Massey University, Palmerston North, New Zealand. <sup>10</sup>Universidade Federal Rural de Pernambuco (UFRPE), Departamento de Pesca e Aquicultura, Recife, Brazil. <sup>11</sup>MARE, Marine and Environmental Sciences Centre, Instituto Politécnico de Leiria, Peniche, Portugal. <sup>12</sup>MARE, Laboratório Marítimo da Guia, Faculdade de Ciências da Universidade de Lisboa, Cascais, Portugal. <sup>13</sup>Institute of Marine Research (IMAR), Departamento de Oceanografia e Pescas, Universidade dos Açores, Horta, Portugal. <sup>14</sup>Oceanos - Departamento de Oceanografia e Pescas, Universidade dos Açores, Horta, Portugal. <sup>15</sup>Department of Environmental Affairs, Oceans and Coasts Research, Cape Town, South Africa. <sup>16</sup>Large Marine Vertebrates Research Institute Philippines, Jagna, Philippines. <sup>17</sup>Fins Australis Marine Research and Conservation, Colorado Springs, CO, USA. <sup>18</sup>Programa Restauración de Tortugas Marinas PRETOMA, San José, Costa Rica. <sup>19</sup>MigraMar, Olema, CA, USA. <sup>20</sup>Institut de Recherche pour le Développement, UMR MARBEC (IRD, Ifremer, Univ. Montpellier, CNRS), Sète, France. <sup>21</sup>Biology Department, University of Massachusetts Dartmouth, Dartmouth, MA, USA. <sup>22</sup>Red Sea Research Center, Division of Biological and Environmental Science and Engineering, King Abdullah University of Science and Technology, Thuwal, Saudi Arabia. <sup>23</sup>Fundación Malpelo y Otros Ecosistemas Marinos, Bogota, Colombia. <sup>24</sup>Hopkins Marine Station of Stanford University, Pacific Grove, CA, USA. <sup>25</sup>Department of Biological Sciences, Florida International University, North Miami, FL, USA. <sup>26</sup>Instituto de Ciências do Mar, Universidade Federal do Ceará, Fortaleza, Brazil. <sup>27</sup>CSIRO Oceans and Atmosphere, Hobart, Tasmania, Australia. <sup>28</sup>School of Aquatic and Fishery Sciences, University of Washington, Seattle, WA, USA. <sup>29</sup>Biology Department, Woods Hole Oceanographic Institution, Woods Hole, MA, USA. <sup>30</sup>Shark Research and Conservation Program, Cape Eleuthera Institute, Eleuthera, Bahamas. <sup>31</sup>University of Exeter, Exeter, UK. <sup>32</sup>South Atlantic Environmental Research Institute, Stanley, Falkland Islands. <sup>33</sup>Department of Biological Sciences, The Guy Harvey Research Institute, Nova Southeastern University, Dania Beach, FL, USA. <sup>34</sup>School of Natural Resources, University of Missouri, Columbia, MO, USA. <sup>35</sup>Life and Environmental Sciences, University of Iceland, Reykjavik, Iceland. <sup>36</sup>School of Marine Science and Policy, University of Delaware, Lewes, DE, USA. <sup>37</sup>Massachusetts Division of Marine Fisheries, New Bedford, MA, USA. <sup>38</sup>Marine Research Facility, Jeddah, Saudi Arabia. <sup>39</sup>PSL, Labex CORAIL, CRILOBE USR3278 EPHE-CNRS-UPVD, Papetoai, French Polynesia. <sup>40</sup>Agence de Recherche pour la Biodiversité à la Réunion (ARBRE), Réunion, Marseille, France. <sup>41</sup>Institut de Recherche pour le Développement, UMR 228 ESPACE-DEV, Réunion, Marseille, France. <sup>42</sup>Save Our Seas Foundation-D'Arros Research Centre (SOSF-DRC), Geneva, Switzerland. <sup>43</sup>South African Institute for Aquatic Biodiversity (SAIAB), Grahamstown, South Africa. <sup>44</sup>Department of Fisheries Evaluation, Fisheries Research Division, Instituto de Fomento Pesquero (IFOP), Valparaíso, Chile. <sup>45</sup>School of Biological, Earth and Environmental Sciences, University College Cork, Cork, Ireland. <sup>46</sup>MaREI Centre, Environmental Research Institute, University College Cork, Cork, Ireland. <sup>47</sup>College of Science and Engineering, Flinders University, Adelaide, South Australia, Australia. <sup>48</sup>Department of Conservation, Auckland, New Zealand. <sup>49</sup>South African Institute for Aquatic Biodiversity, Geological Sciences, UKZN, Durban, South Africa. <sup>50</sup>Dirección Parque Nacional Galapagos, Puerto Ayora, Galapagos, Ecuador.
- <sup>51</sup>Australian Institute of Marine Science, Indian Ocean Marine Research Centre (UWA), Crawley, Western Australia, Australia. <sup>52</sup>Department of Fish and Wildlife Conservation, Virginia Tech, Blacksburg, VA, USA. <sup>53</sup>OCEARCH, Park City, UT, USA. <sup>54</sup>Bedford Institute of Oceanography, Dartmouth, Nova Scotia, Canada. <sup>55</sup>National Institute of Water and Atmospheric Research, Wellington, New Zealand. <sup>56</sup>Beneath the Waves, Herndon, VA, USA. <sup>57</sup>Rosenstiel School of Marine and Atmospheric Science, University of Miami, Miami, FL, USA. <sup>58</sup>Oceans Research Institute, Mossel Bay, South Africa. <sup>59</sup>Department of Ichthyology and Fisheries Science, Rhodes University, Grahamstown, South Africa. <sup>60</sup>SARDI Aquatic Sciences, Adelaide, South Australia, Australia. <sup>61</sup>Zoological Society of London, London, UK. <sup>62</sup>Galapagos Whale Shark Project, Puerto Ayora, Galapagos, Ecuador. <sup>63</sup>Griffith Centre for Coastal Management, Griffith University School of Engineering, Griffith University, Gold Coast, Queensland, Australia. <sup>64</sup>Saving the Blue, Cooper City, FL, USA. <sup>65</sup>Smithsonian Tropical Research Institute, Panama City, Panama. <sup>66</sup>Leonard and Jayne Abess Center for Ecosystem Science and Policy, University of Miami, Coral Gables, FL, USA. <sup>67</sup>Galapagos Science Center, San Cristobal, Galapagos, Ecuador. <sup>68</sup>Universidad San Francisco de Quito, Quito, Ecuador. <sup>69</sup>Blue Water Marine Research, Tutukaka, New Zealand. <sup>70</sup>University of Queensland, Brisbane, Queensland, Australia. <sup>71</sup>Microwave Telemetry, Columbia, MD, USA. <sup>72</sup>Pelagios-Kakunja, La Paz, Mexico. <sup>73</sup>Mote Marine Laboratory, Center for Shark Research, Sarasota, FL, USA. <sup>74</sup>Biological Sciences, University of Windsor, Windsor, Ontario, Canada. <sup>75</sup>Cape Research and Diver Development, Simon's Town, South Africa. <sup>76</sup>Institute of Zoology, Zoological Society of London, London, UK. <sup>77</sup>Centre for Sustainable Aquatic Ecosystems, Harry Butler Institute, Murdoch University, Perth, Western Australia, Australia. <sup>78</sup>Dyer Island Conservation Trust, Western Cape, South Africa. <sup>79</sup>Blue Wilderness Research Unit, Scottburgh, South Africa. <sup>80</sup>University of California Davis, Davis, CA, USA. <sup>81</sup>Cape Research Centre, South African National Parks, Steenberg, South Africa. <sup>82</sup>Shark Spotters, Fish Hoek, South Africa. <sup>83</sup>Institute for Communities and Wildlife in Africa, Department of Biological Sciences, University of Cape Town, Rondebosch, South Africa. <sup>84</sup>Western Cape Department of Agriculture, Veterinary Services, Elsenburg, South Africa. <sup>85</sup>Departamento de Biología Marinha, Universidade Federal Fluminense (UFF), Niterói, Brazil. <sup>86</sup>Department of Zoology, University of Cambridge, Cambridge, UK. <sup>87</sup>Atlantic White Shark Conservancy, Chatham, MA, USA. <sup>88</sup>Fisheries and Aquaculture Centre, Institute for Marine and Antarctic Studies, University of Tasmania, Hobart, Tasmania, Australia. <sup>89</sup>Pontificia Universidad Católica del Ecuador Sede Manabí, Portoviejo, Ecuador. <sup>90</sup>Marine Megafauna Foundation, Truckee, CA, USA. <sup>91</sup>Conservation and Fisheries Department, Ascension Island Government, Georgetown, Ascension Island, UK. <sup>92</sup>Marine Conservation Society Seychelles, Victoria, Seychelles. <sup>93</sup>CORDIO, East Africa, Mombasa, Kenya. <sup>94</sup>Upwell, Monterey, CA, USA. <sup>95</sup>Department of Zoology and Institute for Coastal and Marine Research, Nelson Mandela University, Port Elizabeth, South Africa. <sup>96</sup>National Institute of Polar Research, Tachikawa, Tokyo, Japan. <sup>97</sup>SOKENDAI (The Graduate University for Advanced Studies), Tachikawa, Tokyo, Japan. <sup>98</sup>Centre for Ecology and Conservation, University of Exeter, Penryn, UK. <sup>99</sup>Department of Biological Sciences, University of Rhode Island, Kingston, RI, USA. <sup>100</sup>Department of Oceanography and Environment, Fisheries Research Division, Instituto de Fomento Pesquero (IFOP), Valparaíso, Chile. <sup>101</sup>Department of Biological Sciences, Macquarie University, Sydney, New South Wales, Australia. <sup>102</sup>School of Life and Environmental Sciences, Deakin University, Geelong, Victoria, Australia. <sup>103</sup>AZTI - BRTA, Pasaia, Spain. <sup>104</sup>KERBASQUE, Basque Foundation for Science, Bilbao, Spain. <sup>105</sup>Instituto de Física Interdisciplinar y Sistemas Complejos, Consejo Superior de Investigaciones Científicas, University of the Balearic Islands, Palma de Mallorca, Spain. <sup>106</sup>Wildlife Conservation Research Unit, Department of Zoology, University of Oxford, Tubney, UK. <sup>107</sup>Ocean and Earth Science, National Oceanography Centre Southampton, University of Southampton, Southampton, UK. <sup>108</sup>Centre for Biological Sciences, University of Southampton, Southampton, UK. <sup>109</sup>Present address: Hatfield Marine Science Center, Oregon State University, Newport, OR, USA. <sup>110</sup>Present address: The University of the Sunshine Coast, Sippy Downs, Queensland, Australia. <sup>111</sup>e-mail: dws@miba.ac.uk

**Extended Data Table 1 | Global and regional drivers of FEI hotspots**

| <b>Ocean</b> | <b>Shark hotspots in FEI hotspots (%)</b> | <b>High fishing effort in FEI hotspots (%)</b> | <b>Shark hotspots &amp; High fishing effort in FEI hotspots (%)</b> | <b>Neither shark hotspots nor high fishing effort in FEI hotspots (%)</b> | <b>FEI hotspots overlap shark hotspots (%)</b> | <b>FEI hotspots overlap high fishing effort (%)</b> |
|--------------|---|--|---|---|--|---|
| Global       | 17.2                                      | 42.1   | 38.8  | 1.9   | 56.0   | 80.9  |
| N Atlantic   | 16.7                                      | 43.9   | 37.6  | 1.8   | 54.3   | 81.5  |
| Oceania      | 8.8                                       | 52.7   | 37.4  | 1.1   | 46.2   | 90.1  |
| SW Indian    | 11.7                                      | 53.2   | 34.2  | 0.9   | 45.9   | 87.4  |
| NE Pacific   | 31.0                                      | 18.6   | 46.5  | 3.9   | 77.5   | 65.1  |

Values given in the first four columns are the percentages of grid cells of shark hotspots (>75th percentile of relative density) and/or high fishing effort (>50th percentile of mean fishing days) that contribute to FEI hotspots (>75th percentile of mean monthly FEI). The last two columns show the percentage of FEI hotspots that overlap shark hotspots and high fishing effort hotspots.

## Matters arising

Extended Data Table 2 | Examples of global and regional drivers of FEI hotspots for individual shark species

| Species | Ocean      | Shark hotspots in FEI hotspots (%) | High fishing effort in FEI hotspots (%) | Shark hotspots & high fishing effort in FEI hotspots (%) | Neither shark hotspots nor high fishing effort in FEI hotspots (%) | FEI hotspots overlap shark hotspots (%) | FEI hotspots overlap high fishing effort (%) |
|---------|------------|------------------------------------|---|--|--|---|--|
| Blue    | Global     | 8.6                                | 38.8                                    | 50.2   | 2.4  | 58.7                                    | 89.0   |
|         | N Atlantic | 7.6                                | 40.4                                    | 49.7   | 2.3  | 57.3                                    | 90.1   |
|         | Oceania    | 0.0                                | 66.7                                    | 33.3   | 0.0  | 33.3                                    | 100.0  |
|         | SW Indian  | -                                  | -                                       | -  | -  | -                                       | -  |
|         | NE Pacific | 33.3                               | 6.7                                     | 53.3   | 6.7  | 86.7                                    | 60.0   |
| White   | Global     | 17.0                               | 28.6                                    | 53.3   | 1.2  | 70.3                                    | 81.9   |
|         | N Atlantic | 31.8                               | 20.5                                    | 47.7   | 0.0  | 79.5                                    | 68.2   |
|         | Oceania    | 6.3                                | 34.4                                    | 56.3   | 3.1  | 62.5                                    | 90.6   |
|         | SW Indian  | 11.8                               | 41.8                                    | 45.5   | 0.9  | 57.3                                    | 87.3   |
|         | NE Pacific | 20.5                               | 11.0                                    | 67.1   | 1.4  | 87.7                                    | 78.1   |

Values given in the first four columns are the percentages of grid cells of shark hotspots (>75th percentile of relative density) and/or high fishing effort (>50th percentile of mean fishing days) that contribute to FEI hotspots (>75th percentile of mean monthly FEI). The last two columns show the percentage of FEI hotspots that overlap shark hotspots and high fishing effort hotspots. Blue, blue shark (*Prionace glauca*); white, white shark (*Carcharodon carcharias*). No blue sharks were tracked in the southwest Indian Ocean.

**Extended Data Table 3 | Spatial refuge of pelagic sharks in ABNJs**

| <b>Areas Beyond National Jurisdiction (ABNJ)</b> | <b>No. of grid cells</b>              |   | <b>Potential refuge</b>   |
|--|---------------------------------------|---|---|
|  | <b>Shark relative density hotspot</b> | <b>Shark relative density hotspot with no AIS longline fishing effort</b> | <b>Percentage of shark hotspots with no AIS longline fishing effort</b> |
| Global   | 1187                                  | 437   | 36.8  |
| N Atlantic                                       | 400                                   | 79  | 19.8  |
| Oceania  | 57                                    | 24  | 42.1  |
| SW Indian  | 61                                    | 8   | 13.1  |
| NE Pacific                                       | 651                                   | 324   | 49.8  |

## Matters arising

Extended Data Table 4 | Comparison of spatial refuge estimated with AIS data 2012–2016 and 2012–2018

| Areas Beyond National Jurisdiction (ABNJ) | Refuge estimated with GFW 2012-16 AIS data                       | Refuge estimated with GFW 2012-18 AIS data                       | Difference (percentage refuge in 2012-18 minus 2012-16) |
|---|--|--|---|
|   | Percentage of shark hotspots with no AIS longline fishing effort | Percentage of shark hotspots with no AIS longline fishing effort |   |
| Global                                    | 36.8   | 23.1   | -13.7   |
| N Atlantic                                | 19.8   | 5.8  | -14.0   |
| Oceania                                   | 42.1   | 37.5   | -4.6  |
| SW Indian                                 | 13.1   | 8.2  | -4.9  |
| NE Pacific                                | 49.8   | 34.3   | -15.5   |

The Global Fishing Watch 2012–2016 AIS longline fishing effort data we used in our paper<sup>1</sup> have been further developed to include additional years (2017 and 2018) with a higher number of AIS satellites operating and vessels reporting, resulting in substantially more vessel locations for analysis (<https://globalfishingwatch.org/>). The percentage spatial refuge for sharks in ABNJs decreased to less than a quarter of shark relative density hotspots when more recent fishing effort data were included.

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Data used in linear regression modelling are available on GitHub ([https://github.com/GlobalSharkMovement/GlobalSpatialRisk/derived\\_data/](https://github.com/GlobalSharkMovement/GlobalSpatialRisk/derived_data/)). Data and source code used for preparing figure maps (shark relative spatial density, longline-fishing effort and shark-longline-fishing overlap and FEI) are available on GitHub (<https://github.com/GlobalSharkMovement/GlobalSpatialRisk>).

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## Ecological, evolutionary & environmental sciences study design

All studies must disclose on these points even when the disclosure is negative.

|                                   |  |
|-----------------------------------|--|
| Study description                 | This study is a Reply to a Matters Arising comment on our original paper. To answer the points raised we re-plotted some of the original data from our paper which are fully described in figure and table legends and in our original paper. We carried out new analyses using general linear regression modelling to examine relationships between shark catch per unit effort and fishing exposure risk (FEI), number of longline sets and fishing effort.  |
| Research sample                   | In this Reply, pelagic shark catch in biomass (kg) retained (recorded in skipper's logbooks) by the Spanish pelagic longline fleet in the North Atlantic was used. Catch data were available and were included for the following tracked sharks: blue shark ( <i>Prionace glauca</i> ), shortfin mako ( <i>Isurus oxyrinchus</i> ), longfin mako ( <i>I. paucus</i> ), tiger shark ( <i>Galeocerdo cuvier</i> ), white shark ( <i>Carcharodon carcharias</i> ), porbeagle shark ( <i>Lamna nasus</i> ), silky shark ( <i>Carcharhinus falciformis</i> ), smooth hammerhead shark ( <i>Sphyrna zygaena</i> ), bigeye thresher shark ( <i>Alopias superciliosus</i> ), copper shark ( <i>Carcharhinus brachyurus</i> ) and the sandbar shark ( <i>C. plumbeus</i> ). |
| Sampling strategy                 | Shark catch data recorded by the Spanish longline fleet in the North Atlantic were made available by the Spanish authorities after data collection so we had no control over the sampling strategy.  |
| Data collection                   | Shark catch data recorded by the Spanish longline fishing fleet in the North Atlantic were made available by the Spanish authorities.  |
| Timing and spatial scale          | Shark catch data were available from the Spanish longline fishing fleet in the North Atlantic between January 2013 and November 2017.  |
| Data exclusions                   | In this Reply, no data were excluded except when running sensitivity analysis for linear regression modelling. Here, models were compared using the Akaike and Bayesian information criterion (AIC) and the models strength of evidence assessed using the AIC weights (wAIC). We then used $r^2$ to quantify the models goodness of fit, and repeated the same procedure when randomly removing 1, 5, 10 and 25 % of the data.  |
| Reproducibility                   | No experiments as such were conducted, rather our data are based on satellite tracked movements of individual pelagic sharks and fishing vessels, and shark catch data from fisheries.   |
| Randomization                     | Randomization procedures were used when removing 1, 5, 10 and 25 % of the data for sensitivity analysis using linear regression modelling. Methods are fully described in the Reply and Supplementary Information files.   |
| Blinding                          | Blinding is not relevant to this type of study because our original data were based on movements of wild animals and fishing vessels.  |
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