1

Global proliferation of cephalopods

2

- Zoë A. Doubleday^{1*}, Thomas A. A. Prowse^{1,10}, Alexander Arkhipkin², Graham J. Pierce³, 3 Jayson Semmens⁴, Michael Steer⁵, Stephen C. Leporati⁶, Sílvia Lourenco⁷, Antoni Ouetglas⁸, 4 Warwick Sauer⁹, Bronwyn M. Gillanders^{1*} 5 6 ¹ School of Biological Sciences and The Environment Institute, University of Adelaide, 7 8 Adelaide, 5005, Australia ² Fisheries Department, Stanley, FIOO 1ZZ, Falkland Islands 9 ³Oceanlab, School of Biological Sciences, University of Aberdeen, Main Street, Newburgh, 10 11 Aberdeenshire, AB41 6AA, UK ³CESAM & Departamento de Biologia, Universidade de Aveiro, Aveiro, 3810-193 Portugal 12 ⁴ Institute for Marine and Antarctic Studies, University of Tasmania, Hobart, 7001, Australia 13 ⁵ South Australian Research and Development Institute (Aquatic Sciences), West Beach, 14 5022, Australia 15 ⁶ formally Department of Fisheries Western Australia, North Beach, 6920, Australia 16 ⁷ Departamento do Mar, Instituto Português do Mar e Atmosfera, Avenida de Brasília, 1449-17 18 006 Lisbon, and MARE – Marine and Environmental Sciences Centre, Portugal ⁸ Instituto Español de Oceanografía, Centre Oceanogràfic de les Balears, Palma de Mallorca, 19 20 07015, Spain ⁹ Department of Ichthyology and Fisheries Science, Rhodes University, Grahamstown, 6140, 21 22 South Africa 23 ¹⁰ Co-senior author 24
- 25 *Correspondence to: zoe.doubleday@adelaide.edu.au, bronwyn.gillanders@adelaide.edu.au

26 eTOC Blurb

Doubleday et al. compiled a global dataset of cephalopod abundance and demonstrate that
squid, octopus and cuttlefish populations have increased over the last six decades. This study
suggests that these ecologically and commercially important invertebrates have increased on
a global scale and may be benefiting from a changing marine environment.

31

32 Main text

33 Human activities have substantially changed the world's oceans in recent decades, altering 34 marine food webs, habitats and biogeochemical processes [1]. Cephalopods (squid, cuttlefish 35 and octopuses) have a unique set of biological traits, including rapid growth, short lifespans and strong life-history plasticity, allowing them to adapt quickly to changing environmental 36 37 conditions [2-4]. There has been growing speculation that cephalopod populations are 38 proliferating in response to a changing environment, a perception fuelled by increasing trends 39 in cephalopod fisheries catch [4, 5]. To investigate long-term trends in cephalopod 40 abundance, we assembled global time-series of cephalopod catch rates (catch per unit of 41 fishing or sampling effort). We show that cephalopod populations have increased over the 42 last six decades, a result that was remarkably consistent across a highly diverse set of 43 cephalopod taxa. Positive trends were also evident for both fisheries-dependent and fisheries-44 independent time-series, suggesting that trends are not solely due to factors associated with 45 developing fisheries. Our results suggest that large-scale, directional processes, common to a 46 range of coastal and oceanic environments, are responsible. This study presents the first 47 evidence that cephalopod populations have increased globally, indicating that these 48 ecologically and commercially important invertebrates may have benefited from a changing 49 ocean environment.

51 Our dataset spanned the last 61 years (1953 to 2013), with all major oceanic regions 52 represented (69% northern hemisphere, 31% southern hemisphere), along with key taxa (52% 53 squid, 31% octopuses, 17% cuttlefish and sepiolids) (Figure 1, Table S1). We restricted these 54 time-series data to cephalopod catch rates, which are a more reliable proxy of abundance than 55 raw catch [6]. Our analyses revealed that cephalopod abundance has increased over the last 56 six decades, a result consistently replicated across three distinct life history groups: demersal, 57 benthopelagic, and pelagic (Figure 1, all effective degrees of freedom [edf] = 1, all p values \leq 58 0.01). This is remarkable given the enormous life-history diversity exhibited across these 59 groups, which were represented in this study by 35 species/genera and six families (Table 60 S1). Demersal species, for instance, have low dispersal capacity (tens of km) and occupy 61 shelf waters; benthopelagic species also occupy shelf waters, but have moderate dispersal 62 capacity (hundreds of km) largely facilitated by a paralarval phase; and pelagic species 63 inhabit open oceanic waters and have high dispersal capacity (thousands of km) facilitated by 64 both a paralarval phase and a mobile adult phase. Furthermore, our collated time-series 65 represented non-target, bycatch and target species, with target species being subject to 66 varying levels of fishing pressure that ranged from large-scale developed fisheries to 67 developing, artisanal and subsistence fisheries (Table S1). We also investigated trends by 68 data type, because fisheries-dependent time-series (as opposed to fisheries-independent time-69 series derived from survey data) can be influenced by factors such as increasing catch 70 efficiency and the spatial expansion of fishing grounds. Significant positive trends for time-71 series derived from both data sources were evident (all edf = 1, all p values < 0.05), which 72 suggests that the observed trends in catch rate are not an artefact of such factors (Figure 1).

73

Our results suggest that the proliferation of cephalopod populations has been driven by large-scale processes that are common across a broad range of marine environments and facilitated

76 by biological characteristics common to all cephalopods. Numerous studies demonstrate that 77 cephalopod populations are highly responsive to environmental change, with anthropogenic 78 climate change, especially ocean warming, a plausible driver of the observed increase [4, 7]. 79 Elevated temperatures, for instance, are thought to accelerate the life cycles of cephalopods, 80 provided the optimal thermal range of the species is not exceeded and food is not limited. 81 Further, it has been hypothesised that the global depletion of fish stocks, together with the 82 potential release of cephalopods from predation and competition pressure, could be driving 83 the growth in cephalopod populations [5]. It is relatively well documented that many fish 84 species have declined in abundance due to overfishing [e.g. 8], and several regional studies 85 have suggested that cephalopod populations have increased where local fish populations have 86 declined (albeit casual mechanisms have not been identified) [e.g. 5, 9, and S5, S11 in Table 87 S1]. However, a range of other environmental factors, such as changing current systems and 88 climatic cycles, increases in extreme weather events, eutrophication and habitat modification 89 [1], could also potentially confer a competitive advantage to cephalopods over longer-lived, 90 slower-growing marine taxa.

91

92 The ecological and socio-economic ramifications associated with an increase in cephalopod 93 biomass are likely to be complex. Cephalopods are voracious and adaptable predators and 94 increased predation by cephalopods could impact many prev species, including commercially 95 valuable fish and invertebrates. Conversely, increases in cephalopod populations could 96 benefit marine predators which are reliant on them for food, as well as human communities 97 reliant on them as a fisheries resource. However, cephalopod population dynamics are 98 notoriously difficult to predict and human activities may have a deleterious effect on 99 cephalopod populations in the future. For example, early evidence suggests that ocean 100 acidification, due to increased CO₂ emissions, may impact cephalopod survival [4]. Further,

as fish stocks have declined, cephalopods have become an ever more important component of
global fisheries [10], with cephalopod fisheries catch peaking in recent years [4] and some
cephalopod fisheries showing signs of overexploitation (e.g. see S7, S22 in Table S1).
Therefore, as fisheries continue to refocus their efforts towards invertebrates [10], it will be
critical to manage cephalopod stocks appropriately so they do not face the same fate as many
of their longer-lived counterparts.

107

108 Acknowledgments

We thank Nancy Barahona (IFOP), Rosemary Hurst (NIWA), Timothy Emery, Felipe Briceño and Jeremy Lyle (UTAS), Patricia Hobsbawn (ABARES), John Bower (HU), Mitsuo Sakai (TNFRI), Blue Ventures, SHOALS (Rodrigues), and the Fisheries Research and Training Unit (Rodrigues) for their assistance in sourcing time-series and providing catch and effort data, as well as Felipe Briceño and Eriko Hoshino (UTAS) for Spanish- and Japaneseto-English translation, respectively. This paper resulted from a workshop funded by The Environment Institute, University of Adelaide.

116

117 Supplemental Information

118 Supplemental Information includes one table, experimental procedures and associated

119 references.

120

121 References

- Halpern, B.S., Walbridge, S., Selkoe, K.A., Kappel, C.V., Micheli, F., D'Agrosa, C., Bruno, J.F., Casey, K.S., Ebert, C., and Fox, H.E. (2008). A global map of human impact on marine ecosystems. Science *319*, 948-952.
- 125 2. Jackson, G.D., and O'Dor, R.K. (2001). Time, space and the ecophysiology of squid growth, life in the fast lane. Vie Milieu *51*, 205-215.
- 127 3. O'Dor, R.K., and Webber, D.M. (1986). The constraints on cephalopods: why squid aren't fish. Can J Zool 64, 1591-1605.

129 130 131 132	4.	Rodhouse, P.G., Pierce, G.J., Nichols, O.C., Sauer, W.H., Arkhipkin, A.I., Laptikhovsky, V.V., Lipinski, M., Ramos, J., Gras, M., and Kidokoro, H. (2014). Environmental effects on cephalopod population dynamics: implications for management of fisheries. Adv Mar Biol 67, 99-233.					
133 134	5.	Caddy, J.F., and Rodhouse, P.G. (1998). Cephalopod and groundfish landings: evidence for ecological change in global fisheries? Rev Fish Biol Fish 8, 431-444.					
135 136	6.	Pauly, D., Hilborn, R., and Branch, T.A. (2013). Fisheries: Does catch reflect abundance? Nature 494, 303-306.					
137 138	7.	Pecl, G.T., and Jackson, G.D. (2008). The potential impacts of climate change on inshore squid: biology, ecology and fisheries. Rev Fish Biol Fish 18, 373-385.					
139 140	8.	FAO Fisheries and Aquaculture Department (2012). The state of world fisheries and aquaculture 2012. (Rome: Food and Agriculture Organisation of the United Nations).					
141 142 143 144	9.	Vecchione, M., Allcock, L., Piatkowski, U., Jorgensen, E., and Barratt, I. (2009). Persistent elevated abundance of octopods in an overfished Antarctic area. In Smithsonian at the Poles: Contributions to International Polar Year Science. (Washington, DC: Smithsonian Institution Scholarly Press), pp. 197-203.					
145 146	10.	Anderson, S.C., Flemming, J.M., Watson, R., and Lotze, H.K. (2011). Rapid global expansion of invertebrate fisheries: trends, drivers, and ecosystem effects. PLOS one <i>6</i> , e14735.					
147 148							
149	Figure	e Legend					
150							
151	Figure	e 1. Trends in cephalopod abundance					
152	Trends in abundance from 1953 to 2013 for demersal (i), benthopelagic (ii) and pelagic (iii)						
153	cephalopods (all edf = 1, all p values ≤ 0.01), with number of time-series by life-history						
154	group (iv; total $n = 67$). Illustrations depict key taxa associated with each group. Demersal =						

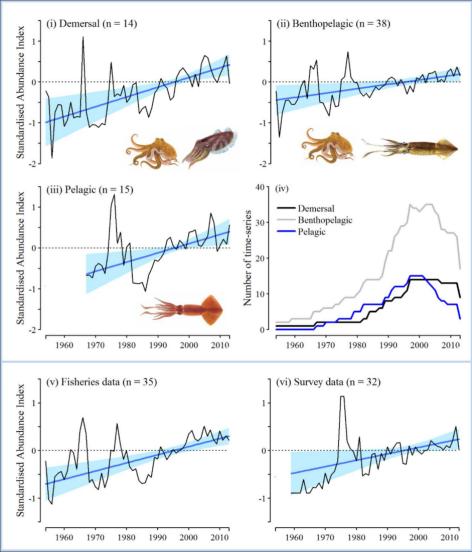
155 species with no planktic paralarval stage, benthic eggs and benthic/demersal hatchlings and

adults; benthopelagic = species with benthic eggs, planktic paralarvae and demersal adults;

157 pelagic = planktic eggs and paralarvae and pelagic adults. Trends in abundance for time-

158 series derived from fisheries data (v) and survey data (vi) (all edf = 1, all p values < 0.05).

- 159 For all abundance plots, dark blue lines represent fitted values derived from generalised
- 160 additive mixed models (\pm 95% CI) and black lines represent mean standardized time-series
- 161 (z-scores). See Supplemental Experimental Procedures and Table S1 for categorisation of
- 162 each time-series.



Supplemental Information: Global proliferation of cephalopods

Zoë A. Doubleday, Thomas A. A. Prowse, Alexander Arkhipkin, Graham J. Pierce, Jayson Semmens, Michael Steer, Stephen C. Leporati, Sílvia Lourenço, Antoni Quetglas, Warwick Sauer, Bronwyn M. Gillanders

Table S1 (related to Figure 1 and Supplemental Experimental Procedures). Metadata for each time-series of cephalopod abundance (n = 67). All series are in units of catch or proportional catch per unit effort (catch rate) or lobster 'kills' per unit effort (predation rate). LH (life history group) = demersal (D), benthopelagic (B), pelagic (P); Data type = fisheries-independent survey data (S); fisheries data (F). * = series with 1 or 2 missing years, # = predation-based time series.

Family & species	LH	Country of origin	Latitude	Longitude	Time period	No. of Years	Data type	Source ¹
Loliginidae								
Alloteuthis sp	В	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Doryteuthis gahi	В	Falkland Is	-51.700	-57.943	1989-2013	25	F	FD
Loligo bleekeri	В	Japan	39.929	134.176	1975-2006	32	F	[S2]
Loligo forbesii	В	UK	57.158	-1.921	1980-2012	33	S	MSS
Loligo forbesii	В	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Loligo opalescens	В	USA	36.519	-121.884	1969-2006	38	F	[S3]
Loligo pealeii	В	USA	40.820	-70.952	1973-2001	29	S	[S4]
Loligo pealeii	В	USA	41.444	-71.420	1959-2005	47	S	[85]
Loligo vulgaris	В	Morocco	23.887	-16.056	1990-2006*	17	S	[S6]
Loligo vulgaris	В	Portugal	39.764	-9.414	1953-2013*	61	F	IPMA
Loligo vulgaris	В	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Loligo vulgaris	В	Spain	39.431	1.912	1966-2012	47	F	[S7] updates IEO
Loligo sp, Alloteuthis sp	В	UK	49.676	-9.065	1982-2004	23	S	Cefas
Loligo sp, Alloteuthis sp	В	UK	51.111	1.569	1989-2013	25	S	Cefas
Loligo sp, Alloteuthis sp	В	UK	53.723	-4.997	1988-2013	26	S	Cefas
Loligo sp, Alloteuthis sp	В	UK	55.783	0.965	1992-2013	22	S	Cefas
Loligo sp, Uroteuthis sp	В	Indonesia	-8.596	119.256	1976-2003	28	F	[S8]
Sepioteuthis australis	D	Australia	-34.843	138.209	1984-2013	30	F	SARDI
Sepioteuthis australis	D	Australia	-42.182	148.168	1996-2013	18	F	DPIPWE
Uroteuthis sp	В	Australia	-20.730	149.706	1990-2011	22	F	[S9]
Ommastrephidae								
Dosidicus gigas	Р	Peru	-12.110	-77.385	1991-2002	12	F	[S10]
Dosidicus gigas	Р	USA	45.988	-126.493	1991-2006	16	F	[S11]
Illex argentinus	Р	Falkland Is	-51.700	-57.943	1989-2012	25	F	FD
Illex coindetii	Р	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Illex illecebrosus	Р	USA	40.820	-70.952	1967-2005	39	S	[S12]

Nototodarus gouldi	Р	Australia	-38.873	141.693	1996-2013	18	F	[813]
Nototodarus sloanii	Р	NZ	-48.070	166.424	1982-2008	27	F	[S14]
Ommastrephes bartramii	Р	Japan	25.580	146.794	1974-2001	28	F	[S15]
Todarodes pacificus	Р	Korea	39.929	134.176	1970-2005	36	F	[S16]
Todarodes pacificus	Р	Japan	35.028	141.894	1979-2012	34	F	[S17]
Todarodes pacificus	Р	Japan	39.929	134.176	1979-2012	34	F	[S18]
Todaropsis eblanae	Р	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Todarodes sp, Illex sp, Todaropsis sp	Р	UK	49.676	-9.065	1982-2004	23	S	Cefas
Todarodes sp, Illex sp, Todaropsis sp	Р	UK	55.783	0.965	1992-2013	22	S	Cefas
Thysanoteuthidae								
Thysanoteuthis rhombus	Р	Japan	39.929	134.176	1989-2003	15	F	[S19]
Octopodidae								
Eledone cirrhosa	В	UK	55.783	0.965	1992-2013	22	S	Cefas
Eledone cirrhosa	В	UK	53.723	-4.997	1988-2013	26	S	Cefas
Eledone cirrhosa	В	UK	49.676	-9.065	1982-2004	23	S	Cefas
Eledone cirrhosa	В	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Eledone moschata	D	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Enteroctopus dofleini	В	Canada	49.274	-123.194	1983-1997	15	F	[S20]
Enteroctopus megalocyathus	В	Chile	-45.266	-72.820	2002-2013	12	F	IFOP
Macroctopus maorum	В	Australia	-34.843	138.209	1994-2013	20	F	SARDI
Macroctopus maorum	В	Australia	-42.182	148.168	1992-2013	22	F#	DPIPWE
Macroctopus maorum	В	Australia	-42.257	144.991	1992-2013	22	F#	DPIPWE
Macroctopus maorum	В	Australia	-43.017	147.921	1996-2013	18	F	DPIPWE
Octopus (cf.) tetricus	В	Australia	-30.319	114.911	1981-2012	32	F#	[S21]
Octopus cynea	В	Madagascar	-22.380	42.493	2004-2013	10	F	Blue Ventures
Octopus cynea	В	Mauritius	-19.610	63.377	1994-2006*	13	F	[S22]
Octopus mimus	В	Chile	-22.079	-70.288	2002-2013	12	F	IFOP
Octopus pallidus	D	Australia	-34.843	138.209	1987-2013	27	F	SARDI
Octopus pallidus	D	Australia	-40.513	145.297	1995-2013	19	F	DPIPWE
Octopus vulgaris	В	Morocco	20.969	-17.243	1990-2008	19	S	[S6]
Octopus vulgaris	В	Portugal	39.764	-9.414	1953-2013*	61	F	IPMA
Octopus vulgaris	В	Spain	36.990	-7.103	1997-2012	16	S	[S1]

Octopus vulgaris	В	Spain	39.431	1.912	1966-2012	47	F	[S7] updates IEO
Sepiidae								
Sepia apama	D	Australia	-34.843	138.209	1984-2013	30	F	SARDI
Sepia elegans	D	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Sepia officinalis	D	UK	51.111	1.569	1989-2013	25	S	Cefas
Sepia officinalis	D	Portugal	39.764	-9.414	1953-2013*	61	F	IPMA
Sepia officinalis	D	Spain	36.990	-7.103	1997-2012	16	S	[S1]
Sepia officinalis	D	Spain	39.431	1.912	1966-2012	47	F	[S7] updates IEO
Sepia sp.	D	UK	53.723	-4.997	1988-2013	26	S	Cefas
Sepia sp.	D	UK	55.783	0.965	1992-2013	22	S	Cefas
Sepia sp.	D	Morocco	20.969	-17.243	1982-2006	25	S	[S6]
Sepiolidae								
Unknown	В	UK	53.723	-4.997	1988-2013	26	S	Cefas
Unknown	В	UK	55.783	0.965	1992-2013	22	S	Cefas

¹ Source acronyms: MSS = Marine Scotland Science (Scotland); Cefas = Centre for Environment, Fisheries & Aquaculture Science (England); IPMA = Instituto Português do Mar e Atmosfera (Portugal); IFOP = Instituto de Fomento Pesquero (Chile); SARDI = South Australian Research and Development Institute, Aquatic Sciences (South Australia); IEO = Instituto Español de Oceanografía (Mallorca); DPIPWE = Department of Primary Industries, Parks, Water and Environment (Tasmania); FD = Fisheries Department (Falkland Islands). Numbers in square brackets refer to published sources (see Supplemental References).

Supplemental References

- S1. International Council for the Exploration of the Sea (2013). Report of the Working Group on Cephalopod Fisheries and Life History (WGCEPH), 11-14 June 2013, Caen, France. Volume ICES CM 2013/SSGEF:13. (Copenhagen), p. 183.
- S2. Tian, Y. (2009). Interannual-interdecadal variations of spear squid *Loligo bleekeri* abundance in the southwestern Japan Sea during 1975–2006: impact of the trawl fishing and recommendations for management under the different climate regimes. Fish Res 100, 78-85.
- S3. Brady, B.C. (2008). Long-term changes in biological characteristics and fishery of *Loligo opalescens*. (San Jose State University).
- S4. Dawe, E., Hendrickson, L., Colbourne, E., Drinkwater, K., and Showell, M. (2007). Ocean climate effects on the relative abundance of short-finned (*Illex illecebrosus*) and long-finned (*Loligo pealeii*) squid in the northwest Atlantic Ocean. Fish Oceanogr 16, 303-316.
- S5. Collie, J.S., Wood, A.D., and Jeffries, H.P. (2008). Long-term shifts in the species composition of a coastal fish community. Can J Fish Aquat Sci 65, 1352-1365.
- S6. FAO Fishery Committee for the Eastern Central Atlantic (2011). Report of the FAO/CECAF Working Group on the Assessment of Demersal Resources Subgroup North Agadir, Morocco, 8–17 February 2010. (Rome: Food and Agriculture Organisation of the United Nations), p. 350.
- Quetglas, A., Ordines, F., Hidalgo, M., Monserrat, S., Ruiz, S., Amores, Á., Moranta, J., and Massutí, E. (2013). Synchronous combined effects of fishing and climate within a demersal community. ICES J Mar Sci 70, 319-328.
- S8. Ghofar, A. (2011). The Sape Strait cephalopod resource and its response to climate variability. J Coast Develop 8, 35-45.
- S9. Holmes, B., Leslie, M., Keag, M., Roelofs, A., Winning, M., and Zeller, B. (2013). Stock status of Queensland's fisheries resources 2011 (Brisbane: Department of Agriculture, Fisheries and Forestry, Queensland Government).
- S10. Waluda, C.M., Yamashiro, C., and Rodhouse, P.G. (2006). Influence of the ENSO cycle on the light-fishery for *Dosidicus gigas* in the Peru Current: an analysis of remotely sensed data. Fish Res 79, 56-63.
- S11. Field, J.C., Baltz, K., Phillips, A.J., and Walker, W.A. (2007). Range expansion and trophic interactions of the jumbo squid, *Dosidicus gigas*, in the California Current. Cal Coop Ocean Fish 48, 131.
- S12. Hendrickson, L. (2006). Status of fishery resources off the northeastern US: northern shortfin squid. (National Oceanic and Atmospheric Administration).
- S13. Georgeson, L., Stobutzki, I., and Curtotti, R. (2014). Fishery status reports 2013–14. (Canberra: Australian Bureau of Agricultural and Resource Economics and Sciences).
- S14. Hurst, R.J., Ballara, S.L., MacGibbon, D., and Triantafillos, L. (2012). Fishery characterisation and standardised CPUE analyses for arrow squid (*Nototodarus gouldi* and *N. sloanii*), 1989–90 to 2007–08, and potential management approaches for southern fisheries. (Wellington: Ministry for Primary Industries), p. 303.
- S15. Bower, J.R., and Ichii, T. (2005). The red flying squid (*Ommastrephes bartramii*): a review of recent research and the fishery in Japan. Fish Res 76, 39-55.
- S16. Gong, Y., and Choi, K.H. (2008). Fluctuations in abundance of common squid, *Todarodes pacificus* in the far east. J Environ Biol 29, 449-452.
- S17. Yamashita, Kaga, and Sasaki (2013). Stock assessment of the winter sub-stock of Surume Ika (Japanese common squid). (Translated from Japanese).
- S18. Kidokoro, Goto, and Takahara (2013). Stock assessment of the autumn sub-stock of Surume Ika (Japanese common squid). (Translated from Japanese).
- S19. Miyahara, K., Ota, T., Kohno, N., Ueta, Y., and Bower, J.R. (2005). Catch fluctuations of the diamond squid *Thysanoteuthis rhombus* in the Sea of Japan and models to forecast CPUE based on analysis of environmental factors. Fish Res 72, 71-79.
- S20. Gillespie, G.E., Parker, G., and Morrison, J. (1998). A review of octopus fisheries biology and British Columbia octopus fisheries. Research Document 98/87. (Ottawa: Canadian Stock Assessment Secratariet, Fisheries and Oceans Canada).
- S21. Leporati, S.C., Hart, A.M., Marriot, R.J., and Murphy, D. (2015). Innovative development of the *Octopus tetricus* fishery in Western Australia. (Perth: Fisheries Research and Development Corporation).
- S22. Sauer, W., Potts, W., Raberinary, D., Anderson, J., and Sylvio Perrine, M. (2011). Assessment of current data for the octopus resource in Rodrigues, western Indian Ocean. Afr J Mar Sci *33*, 181-187.
- S23. Wood, S.N. (2004). Stable and efficient multiple smoothing parameter estimation for generalized additive models. J Am Stat Assoc *99*, 673-686.
- S24. Hastie, T.J., and Tibshirani, R.J. (1990). Generalized additive models, (New York: Chapman & Hall/CRC).
- S25. Wood, S.N. (2006). Generalized additive models: an introduction with R, (Boca Raton: Chapman and Hall/CRC).
- S26. Burnham, K.P., and Anderson, D.R. (2004). Multimodel inference: understanding AIC and BIC in model selection. Sociol Methods Res *33*, 261-304.

Supplemental Experimental Procedures

We searched extensively for available published and unpublished long-term (≥ 10 years) annual time-series of cephalopod abundance (catch rate) (Table S1). Where necessary, graph scanning software (*Plot Digitizer* 2.6.6) was used to extract data from published graphs. We obtained 67 time-series of cephalopod catch rates (catch data standardised to fishing or survey-sampling effort) from both fisheries-dependent (54%) and fisheries-independent (46%) sources. Time-series ranged from 10 to 61 years in length (mean: 26 years), spanning the time period from 1953 to 2013 (Figure 1). Series that could not be identified to the family level were omitted, as well as series with > 2 missing years. A small number of time-series (n = 3) were based on octopus predation rates in rock lobster fisheries (i.e. number of lobster 'kills' per unit of fishing effort), as opposed to the standard catch rate. To account for different measures of catch and predation rate within the dataset, each catch-rate series was standardised to a mean of 0 and standard deviation of 1 (i.e. z-scores). Casewise deletion was applied to those time-series (n = 5) with one or two years of missing data. Time-series were categorised into three life-history groups (demersal, benthopelagic, and pelagic; see Figure 1 for definitions) and two data types (fisheriesdependent data and fisheries-independent survey data) (see Table S1).

We used generalised additive mixed models (GAMMs) to investigate temporal trends in cephalopod abundance, which we fitted within the *R* computing environment (version 3.2.0) using functions within the package mgcv [S23]. Generalised additive models provide a data-driven method of accounting for non-linear relationships between response and predictor variables by including smoothing functions of those predictors [S24, 25]. We controlled for serial dependence through time by assuming a within time-series autoregressive moving-average (ARMA) process with p=1 and q=1 (i.e. temporal lags of one year for both the autoregressive and moving-average terms), which was pre-selected over alternative temporal autocorrelation structures based on Akaike's Information Criterion (AIC) [S26]. We used GAMMs to estimate trends in abundance for species with different life histories. To determine if trends were influenced by possible biases associated with fisheries-dependent data, we also investigated abundance trends by data type. We reported the effective degrees of freedom for each fitted smooth term (edf, where a linear fit is indicated by an edf of 1) and its approximate significance (p value).

Author Contributions

Funding acquisition, BMG; Conceptualisation, BMG, MS, TAAP, ZAD; Data provision, AA, AQ, GJP, JS, MS, SL, SCL, WS; Data collection and curation, ZAD; Development of methodology, concepts and paper content, AA, BMG, GJP, JS, MS, TAAP, ZAD; Formal analysis and software, TAAP; Writing – Original Draft, ZAD; Writing – Review & Editing, all authors; Visualisation, TAAP, ZAD; Project supervision and administration, BMG, ZAD.