Advance View https://doi.org/10.3354/meps14297

July 6, 2023<sup>§</sup>



Contribution to the Theme Section 'Marine functional connectivity'

# Assessing the demographic connectivity of common cockles in a shallow estuary as a basis for fisheries management and stock protection efforts

Flemming Thorbjørn Hansen<sup>1,3,\*</sup>, Anders Chr. Erichsen<sup>2</sup>, Camille Saurel<sup>1</sup>, Pedro Seabra Freitas<sup>1</sup>

<sup>1</sup>Section for Coastal Ecology, DTU AQUA, Technical University of Denmark, 2800 Kgs. Lyngby, Denmark <sup>2</sup>Environmental Solutions, DHI A/S, Agern Allé 5, 2970 Hørsholm, Denmark

<sup>3</sup>Present address: Environmental Solutions, DHI A/S, Agern Allé 5, 2970 Hørsholm, Denmark

ABSTRACT: Common cockle Cerastoderma edule populations in the Danish Limfjorden constitute an important ecosystem component and a valuable resource for fishermen and industries, providing a large proportion of cockle landings in both Denmark and the European Union. However, processes driving cockle recruitment and mortality are not well understood, and prevent sustainable fisheries management and species protection efforts. We report a thorough study of processes that are the main drivers of population recruitment, namely larval dispersal and settlement. Outputs from biophysical modelling of cockle larval dispersal, connectivity analysis and derived graph theory metrics were used to analyse potential demographic connectivity or isolation between known cockle populations and other parts of Limfjorden. The results show that the most productive and commercially important cockle beds are almost exclusively dependent on larval imports from unexploited spawning biomass elsewhere rather than on self-recruitment, allowing for exploitation levels that would be unsustainable otherwise. Other parts of Limfjorden are relatively isolated, relying mostly on self-recruitment. The results also show that in some areas where predicted larval settlement potentials are highest, the absence of a cockle population indicates that other factors, likely environmental, are more important. This study provides an example of contrasting population dynamics and connectivity, suggesting that the vulnerability of cockle populations to exploitation or natural mortality may be highly variable and interlinked. Ignoring processes affecting larval dispersal may jeopardise cockle populations and fisheries in Limfjorden. This study highlights the importance of understanding processes of marine connectivity for the protection of bivalve populations and sustainable fisheries management.

KEY WORDS: Larval dispersal  $\cdot$  Connectivity  $\cdot$  Agent-based modelling  $\cdot$  Cockles  $\cdot$  Cerastoderma edule  $\cdot$  Limfjorden

## 1. INTRODUCTION

The spatial distribution of most benthic populations in marine systems is connected via dispersal of pelagic life stages (e.g. Grantham et al. 2003, Josefson & Hansen 2004, Cowen et al. 2006, Treml et al. 2008, Cowen & Sponaugle 2009, Josefson 2016). Such dispersal is driven by ocean currents. The dis-

\*Corresponding author: flth@dhigroup.com

Article was changed to Open Access, and the copyright notice updated after Advance View publication. This corrected version: February 6, 2024 persal pathways that link habitats and populations drive recruitment dynamics and gene transfer (which supports population resilience), and affect the ability of populations to recover (Balbar & Metaxas 2019). Despite the general consensus regarding the importance of the dispersal of pelagic life stages for shaping benthic populations and communities, studies on this topic are only rarely considered in marine popu-

<sup>©</sup> The authors 2023. Open Access under Creative Commons by Attribution Licence. Use, distribution and reproduction are unrestricted. Authors and original publication must be credited.

Publisher: Inter-Research  $\cdot$  www.int-res.com

lation protection (Balbar & Metaxas 2019, Darnaude et al. 2022) or as a basis for sustainable management of fisheries (Berger et al. 2021).

In general, the dispersal of pelagic larvae of benthic organisms depends on the temporal and spatial variability of the speed and direction of ocean currents and of the pelagic larval duration (PLD). Different species have different PLDs, ranging from a few hours to several weeks or even months (Bradbury et al. 2008, Hilário et al. 2015); subsequently, the potential distances of larval dispersal may vary considerably among species. However, PLD itself does not necessarily scale to dispersal distance, particularly in systems dominated by oscillating or complex current directions and vertical velocity gradients (e.g. Gomes et al. 2016, Nolasco et al. 2022). In addition, species may exhibit vertical migration behaviour (e.g. tidal or counter tidal) synchronised to promote or inhibit dispersal distances (Hill 1991). Within species, PLD varies, as larval development is typically affected by water temperature, with increasing temperature reducing the length of the PLD and vice versa (e.g. Filgueira et al. 2015, Lawlor & Arellano 2020). Similarly, reproductive development and onset of spawning in bivalves are strongly influenced and often triggered by temperature (Bayne et al. 1976, Philippart et al. 2003, Bernard et al. 2011, Zippay & Helmuth 2012); thus, shifts in spawning season may affect larval dispersal in areas with distinct seasonal circulation patterns (e.g. Lett et al. 2010).

Breeding population distribution and densities of benthic species, along with specific reproductive output, onset and duration of spawning events, larval mortality, larval behaviour during drift and the PLD, potentially affect the dispersal and settlement patterns of pelagic life stages. While this is the case for common cockles (e.g. Dare et al. 2004, Robins et al. 2013, Coscia et al. 2020, Vera et al. 2022), the implications for cockle recruitment are not yet fully understood. Predation-induced mortality from filter-feeding adult cockles and other bivalves, known as larviphagy (Dare et al. 2004, Troost et al. 2008, Malham et al. 2012), may result in low larval settlement of cockles in years with high predation pressure and vice versa. Other studies have found higher successful spatfall following warm winters (Dare et al. 2004), although its impact on recruitment was not addressed. In cockles, environmental drivers dominate settlement, survival and recruitment processes (Dankers 1993), often with no clear relationship between the size of reproductive adult stocks and numbers of recruits (Andresen et al. 2014). Thus, a high larval production (~1 million eggs female<sup>-1</sup>,

Dare et al. 2004) does not necessarily translate into high settlement or recruitment success.

While annual cockle stock recruitment may be complex and difficult to predict, potential cockle larval dispersal and settlement patterns can be predicted if ocean currents, the PLD of cockle larvae and the distribution of cockle beds are known. Larval dispersal is typically studied with biophysical modelling, which combines hydrodynamic models simulating the direction and speed of ocean currents, and agentbased modelling (ABM), which simulates the Lagrangian drift trajectories and settling of individual larvae. Outputs from this type of biophysical modelling are widely used as a basis for analysing the connectivity within and between subpopulations of marine organisms (Cowen et al. 2003, Treml et al. 2015, Truelove et al. 2017, Coscia et al. 2020). In this context, we use the term demographic connectivity to specifically refer to the relative contribution to population growth rates of dispersal versus local recruitment (Lowe & Allendorf 2010), operating on an intraannual and ecological time scale, as opposed to evolutionary connectivity, operating on multigenerational and long-term time scales (Lowe & Allendorf 2010, Hawkins et al. 2016, Marandel et al. 2018).

During the last 2 decades, a growing number of studies have successfully linked the outcome of biophysical models with empirical data, emphasizing the importance of marine connectivity in both an evolutionary and a demographic context. For example, a recent meta-study on coral reef fish found clear relationships between connectivity metrics derived from biophysical modelling, biodiversity indices and species abundances (Fontoura et al. 2022). Numerous other studies have found links between empirical population genetic gradients and dispersal barriers inferred from biophysical modelling (e.g. Mertens et al. 2018 and references therein).

Common cockles *Cerastoderma edule* are widely distributed throughout the northeastern Atlantic Ocean, including the North Sea, where the species inhabits shallow coastal areas with fine-grained sandy or muddy sediments (Tyler-Walters & Hiscock 2021). Cockles are buried in the upper 5 cm and may reach densities up to 10 000 ind.  $m^{-2}$  (Tyler-Walters & Hiscock 2021). While the common cockle is an important ecosystem component serving as a food source for breeding and migrating water birds (e.g. Bakker et al. 2021) and a significant ecosystem engineer (e.g. Ciutat et al. 2007, Donadi et al. 2013), it also supports extensive commercial fisheries in intertidal areas in the UK, Ireland, Netherlands, France, Spain and Portugal (data from Eurostat 2013–2020).

The Danish strait, Limfjorden, currently supports large subtidal cockle populations subject to intensive fishing. In some years, it is the most valuable individual bivalve fishery in Denmark constituting ca. 1/3 of the total cockle landings in Europe (Eurostat), with annual landings between ca. 5000 and >10000 t (data from Danish Fisheries Agency for 2013-2022). This fishery is heavily reliant on a single small fishing area, Kås Bredning, for regular and large landings, accounting for 65% of total annual landings from Limfjorden (range 43-82%, 2017-2022). Other basins within the fjord system are fished less frequently due to large variations in cockle abundances, suggesting that cockle populations in these areas are less resilient and subject to variations in recruitment and mortality. Other subpopulations of cockles are located within protected Natura 2000 areas where fisheries are prohibited. Variations in these cockle subpopulations, either from recruitment failure or natural and fishing mortality, may disrupt larval dispersal pathways and potentially compromise the whole of Limfjorden cockle fisheries, risking significant economic and social impacts on fishermen and industry stakeholders. This suggests a fragility in the exploitation of cockle populations that needs to be addressed by reliable stock estimates, but also by understanding the local reproductive and recruitment dynamics of cockles, to sustainably manage and exploit the resource.

The aim of the present study was to investigate the demographic connectivity of cockle populations in Limfjorden and how important fishing grounds may be replenished. Since the distribution of cockles in Limfjorden is widely spread, with densities varying highly between sites and years, the study also aims at addressing the general patterns of the potential larval dispersal and connectivity in the whole of Limfjorden. Such information can guide decisions regarding the sustainable management of cockle exploitation and/or the protection of strongly or weakly connected spawning stocks in relevant areas of Limfjorden.

## 2. MATERIALS AND METHODS

## 2.1. Overview

We use an ABM approach for simulating the larval dispersal driven by simulated ocean currents, predicted by a hydrodynamic model, also referred to as Lagrangian ocean modelling (van Sebille et al. 2018). Results from larval dispersal simulations, i.e. of start and end positions of individual simulated agents, are further analysed to understand the connectivity within and between both known subpopulations of cockles and other potential cockle habitats in Limfjorden. All data processing and analysis of the model output from the ABM were done in R 4.1.0 (R Core Team 2021).

We discriminate between 3 types of geographical references in Limfjorden: sub-basins, major cockle beds and administrative units. Sub-basins refer to distinct geographical sections named according to Fig. 1. Major cockle beds refer to areas with known high cockle densities (see Fig. 3, for details see Section 2.2). Administrative units refer to mussel fisheries management units (Section S1.5 in Supple-

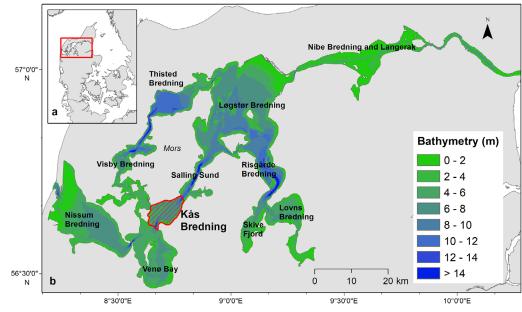


Fig. 1. (a) Location and (b) bathymetry of Limfjorden. Red hatched area indicates the outline of Kås Bredning (administrative unit), where the most important commercial cockle stocks are located. Names refer to sections of Limfjorden referred to as sub-basins in the text ment 1 at www.int-res.com/articles/suppl/m14297\_ supp/). In the following sections, the term larvae is used when referring to simulated agents.

## 2.2. Study area

Limfjorden is a shallow enclosed strait of ca. 180 km in length located in the northern part of the Jutland peninsula connecting the North Sea to the west with the Kattegat to the east (Fig. 1), covering an area of ca. 1575 km<sup>2</sup> with an average depth of 4.8 m and a maximum depth of 24 m. The salinity in Limfjorden varies from 19 to 34 PSU. Currents are driven by changes in water levels between the North Sea in the west and Kattegat in the east, wind forcings and the topology of the estuary. Freshwater from local rivers, especially in the southern and central part of Limfjorden, also affects currents, salinity and stratification.

Water level at the western entrance is driven by tides and wind, and the water exchange with the North Sea is on average 4000 m<sup>3</sup> s<sup>-1</sup> (and up to 8000–10000 m<sup>3</sup> s<sup>-1</sup>). Due to the presence of narrow straits and the resulting flow resistance, only a minor part of the water entering the system flows eastwards into the adjacent sub-basins, resulting in residual currents (Section S1.1 in Supplement 1) with a flux of approximately 300 to 400 m<sup>3</sup> s<sup>-1</sup>. Inside the different sub-basins, wind affects local currents, resulting in some

inter-annual variability. Seabed substrates consist mainly of mixed sandy and muddy substrates recognised as suitable habitats for common cockles and other bivalves, except for inner parts of the system subject to temporary seasonal anoxic conditions and low salinities (Jørgensen 1980, Dolmer et al. 1999). Surveys during 2018 and 2019 showed that cockles are patchily distributed throughout Limfjorden and in highly variable densities (see Fig. 3) (Freitas et al. 2019, 2020, 2021). Kås Bredning, where most of the commercial cockle fisheries occurs, in the western part of Limfjorden covers ca. 52 km<sup>2</sup> (Fig. 1), where ca. 13.4 km<sup>2</sup> comprises fishing grounds, and on average only ca. 3.9 km<sup>2</sup> are fished in any given year.

### 2.3. Hydrodynamic model

Data on ocean currents originate from a hydrodynamic model, MIKE 3 FM (DHI 2017a), set up and calibrated for Limfjorden, specifically for addressing the local hydrodynamic conditions and processes (Erichsen & Birkeland 2019). The computational mesh has a horizontal resolution ranging from less than 100 m in the narrow passages and inlets to up to ca. 500 m in the central parts of the main basins (Fig. 2) and a vertical resolution of 20 layers. The hydrodynamic setup includes open boundaries to the west connecting to the North Sea and to the east connecting to Kattegat.

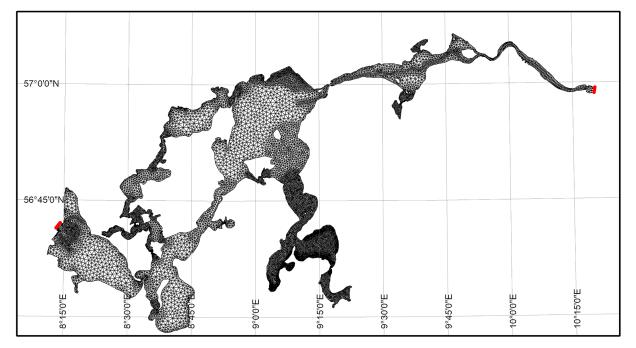


Fig. 2. Computational mesh used in the MIKE 3 FM hydrodynamic model for Limfjorden. Open model boundaries to the North Sea (west) and to Kattegat (east) are indicated in red

The hydrodynamic model was originally developed to support nationwide biogeochemical modelling of Danish marine waters for the Danish Environmental Protection Agency, and has been evaluated by an international evaluation committee (see Implement Consulting Group 2017). Model validation is reported in Erichsen & Birkeland (2019). The temporal resolution of simulated ocean currents was a 1 h time step. Hydrodynamic results for the 7 yr period 2010 to 2016 were used for the larval dispersal model. More details on the hydrodynamic model are available in Section S1.1 in Supplement 1.

## 2.4. Agent-based model

For larval dispersal modelling of cockle larvae, we used the ABM environment ABM Lab (DHI 2017b). ABM Lab is part of an open equation solver, ECO Lab, for building and executing both Lagrangian (particle tracking and ABM) and Eulerian (concentration based) modelling either executed online parallel to the MIKE 3 FM hydrodynamic modelling (DHI 2017a) or executed offline using stored hydrodynamic model results from MIKE 3 FM (e.g. Heinänen et al. 2018) or from other hydrodynamic models (e.g. Jansen et al. 2021). The drift of each agent is calculated based on current speed and direction of the element in the computational grid within which the agent is located without interpolation of current velocities between neighbouring grid cells.

The PLD for cockles has been reported as ranging from ca. 2-3 up to 5-6 wk (Lebour 1938, Creek 1960, Jonsson et al. 1991, Dare et al. 2004, Malham et al. 2012). We used a PLD of 35 d, similar to the PLD used by Coscia et al. (2020), for simulating larval dispersal of cockles in the Irish Sea. The primary spawning period was assumed to occur from 1 May to 30 June, based on a review on cockle spawning onset and duration for different latitudes (Mahony et al. 2020). Agents were released at the seabed in the centroids of a  $1 \times 1$  km grid covering the extent of Limfjorden comprising 1538 release locations. One agent was released in each release location every 6 h for the 2 mo spawning period. In total, 381424 agents were released per year. To account for hydrodynamic processes unresolved by the spatial discretisation of the hydrodynamic model, we used a constant horizontal dispersion coefficient of 1  $m^2 s^{-1}$  (Rossi et al. 2014, Brennan et al. 2019) and a vertical coefficient of  $0.01 \text{ m}^2 \text{ s}^{-1}$  (Visser 1997). The simulations were run for an additional 35 d for all agents to settle after the end of the spawning period. The hydrodynamic

model includes flooding and drying of cells in the computational grid, during oscillating water levels, and all agents stranded on dry cells during the simulations were discarded from further analysis. The total area of cells affected by flooding and drying constituted between 1.7 and 5.1% of the model domain per year. Stranded agents are primarily artefacts resulting from an inadequate grid resolution or time step at the very local scale rather than representing a true biological process. The number of discarded agents constituted on average 14% of the agents released per year, of which the majority of ca. 75% were located in the eastern parts of Limfjorden.

#### 2.5. Connectivity matrices

Connectivity analysis was done by dividing Limfjorden into a grid of  $2 \times 2$  km (Fig. 3), where all pairwise connections (= start and end positions of agents) between grid cells were counted and stored in a connectivity matrix for each year. Only grid cells in the  $2 \times 2$  km connectivity grid that coincide with at least 1 release point for agent releases in the agent-based model were included in the connectivity analysis. The connectivity matrices for individual years and for the whole 7 yr period (sum of all pairwise connections) were converted to connectivity probability matrices. One set of matrices represented the probability of agents being exported from one grid cell to any of the other grid cells (or the same grid cell, here referred to as local retention [LR]). Another set of matrices represented the probability of agents being imported to each grid cell from any of the other grid cells (or the same grid cell, here referred to as selfrecruitment [SR]). The terms LR and SR used here are consistent with Lett et al. (2015). Probability values for each element in the connectivity probability matrices representing export and LR were calculated relative to the initial release of agents in that element excluding agents stranded on dry cells but including agents exported out of the model domain across the open boundaries. Thus, the sum of calculated export plus LR probabilities of all connections for each grid cell in some cases is significantly less than 1, especially in areas close to either of the open boundaries where export of agents occurs. Probability values for each element in the connectivity probability matrices representing import and SR were calculated relative to the number of agents settled in each grid.

The 2 different types of connectivity matrices describe connectivity from different perspectives (Lett et al. 2015, Ospina-Alvarez et al. 2020). Probabilities

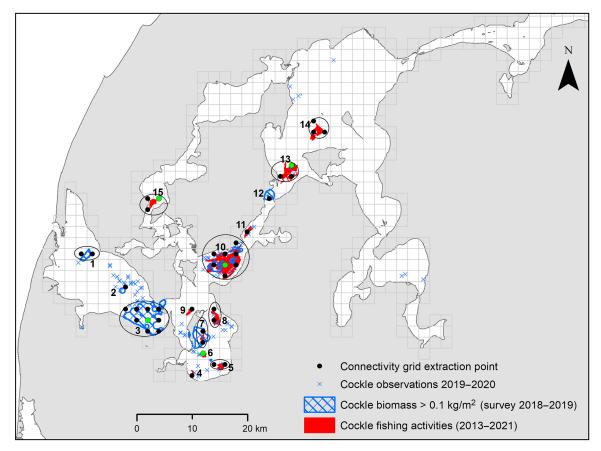


Fig. 3. Location of existing major cockle beds from fishing activities (BlackBox data recorded from 2013 to 2021, red colour), and interpolated (using inverse distance weighting) cockle biomass >0.1 kg m<sup>-2</sup> (survey data from 2018 to 2019, crosshatched blue colour). Non-quantitative observations from 2019 to 2020 are indicated by blue x-markers. The 2 × 2 km grid applied for connectivity analysis shown in grey outline (part of the grid in the eastern part of Limfjorden is not included in this figure). Dots: extraction points for existing major cockle beds in the connectivity matrix. Green dots: locations for extraction of connectivity probability maps included in the main manuscript, Fig. 4 and Section S1.2 in Supplement 1 (www.int-res.com/articles/suppl/m14297\_supp/). Numbers: major cockle bed IDs for reference in the text; and for major cockle beds comprising >1 extraction points are encircled

of larval export (including LR) are proportionally independent of the size of the spawning population, i.e. the relative distribution of exports to other sites remains the same independent of number of eggs spawned, and can provide valuable information for management to identify cockle beds, which may potentially serve as an important larval suppliers to other sites. In contrast, probabilities of larval import (and SR) are dependent on the size of the spawning populations in different beds where larvae originate. Thus, while the import connectivity probabilities may provide managers with an indication of the reliance cockle beds may have on SR relative to imports from other sites, the relative proportion of imports and SR based on realised connectivity may look different. Both connectivity matrices can be combined with data on cockle spawning biomasses to provide estimates on realised connectivity (e.g.

Watson et al. 2010). Here, we exclusively address potential connectivity.

### 2.6. Connectivity probability maps

Connectivity probability maps were extracted for grid cells representing the 15 known major cockle beds representing agent export (including LR) and agent import (including SR) (see Fig. 4, Section S1.2 in Supplement 1). Data on major cockle beds were extracted from processed BlackBox data and survey data. The BlackBox (BlackBox R2, Anchor Lab) is a continuous GPS positioning and vessel activity registration system installed on board all bivalve fishing vessels, providing data at 10 s intervals (Nielsen et al. 2021). BlackBox data were combined with data on cockle landings from 2013 to 2021 (DTU Aqua unpubl. data). Survey data on cockle biomass (>0.1 kg m<sup>-2</sup>) were identified from previous surveys in 2018 and 2019 (DTU Aqua unpubl. data). A connectivity matrix describing the pairwise connectivity probabilities between the 15 major cockle beds was extracted from 40 representative  $2 \times 2$  km subareas in the connectivity grid (dots in Fig. 3).

## 2.7. Cluster analysis

To identify the general patterns of potential connectivity of cockles in the whole of Limfjorden and the location and strength of possible dispersal barriers, cluster analysis was applied using the clustering algorithm Infomap (Rosvall & Bergstrom 2008) available in the R package igraph (Csárdi & Nepusz 2006). The Infomap algorithm is based on information theory principles and has been used previously in marine connectivity studies (Rossi et al. 2014, Huserbråten et al. 2018, Pastor et al. 2021, 2022). The Infomap algorithm solely determines the number of clusters and their individual size and extent, and does not require any user-set thresholds.

Cluster analyses were done using the connectivity matrix representing the connections as absolute numbers of connections for individual years and for all years pooled together and both for the non-transposed and the transposed matrices. The former results in clusters representing groups of  $2 \times 2$  km grid cells that export agents to each other, and the latter represents groups of grid cells that import agents from each other. The 2 methods produce a somewhat different but supplementary delineation of clusters. The use of transposed graphs was recently proposed by Moutsinas et al. (2021) for detecting graph structures in trophic networks.

To facilitate the interpretation, cluster analysis results are graphically represented including information on the strength (dispersal probabilities) of the within- and between- cluster connectivity. For the non-transposed matrices, probabilities representing the export of agents between clusters are calculated relative to the total number of agents with a start position within each cluster. For the transposed matrices, probabilities representing the import between clusters are calculated relative to the total number of agents with an end position within each cluster. Only clusters based on a minimum of four  $2 \times$ 2 km grid cells are included. Likewise, only connections between clusters with a minimum of eight  $2 \times$ 2 km grids cells are included.

### 2.8. Graph theory metrics

In addition to the dispersal probability maps and cluster analysis results, we extracted the graph theory metrics referred to as strength and transitivity (Montoya & Solé 2002, Csárdi & Nepusz 2006, Costa et al. 2017). Strength is also referred to as weighted degree and describes the weighted number of connections (referred to as edges in graphs) in and out of each grid cell (referred to as nodes in graphs), weighted by the connectivity of each connection as in the corresponding connectivity matrices. We extracted the in-strength and out-strength of each grid cell, where grid cells with high values of instrength represent major potential sink areas, and grid cells with high values of out-strength represent major potential source areas. The transitivity is a graph metric that is defined as the total realised number of triangular connections in the neighbourhood of a given node (or grid cell in the connectivity grid) that the node is connected to, relative to the total possible number of triangular connections in the same neighbourhood. If an area (grid cell) in Limfjorden is connected to a number of other grid cells, the transitivity is a measure for how tight this neighbourhood network is. Transitivity attains values between 0 and 1, where the value represents the relative proportion of realised triangular networks in the neighbourhood of the node.

#### 2.9. Sensitivity analyses

Several standard sensitivity analyses were carried out to test robustness of results regarding alternative PLDs (21, 25, 30, 40, 50 d), alternative spawning period (1 April–31 May) and alternative horizontal (10 m<sup>2</sup> s<sup>-1</sup>) and vertical (0.001 m<sup>2</sup> s<sup>-1</sup>) dispersion coefficients. Results evaluated included larval import probability maps for selected major cockle beds and cluster analysis results. Evaluations were done by visual inspection.

## 3. RESULTS

## 3.1. Connectivity of existing major cockle beds

For visualisation of the dispersal dynamics of cockle larvae, examples of connectivity probability maps (export and import) were extracted for selected  $2 \times 2$  km grid cells representing individual major cockle beds (Fig. 4). Connectivity between each pair

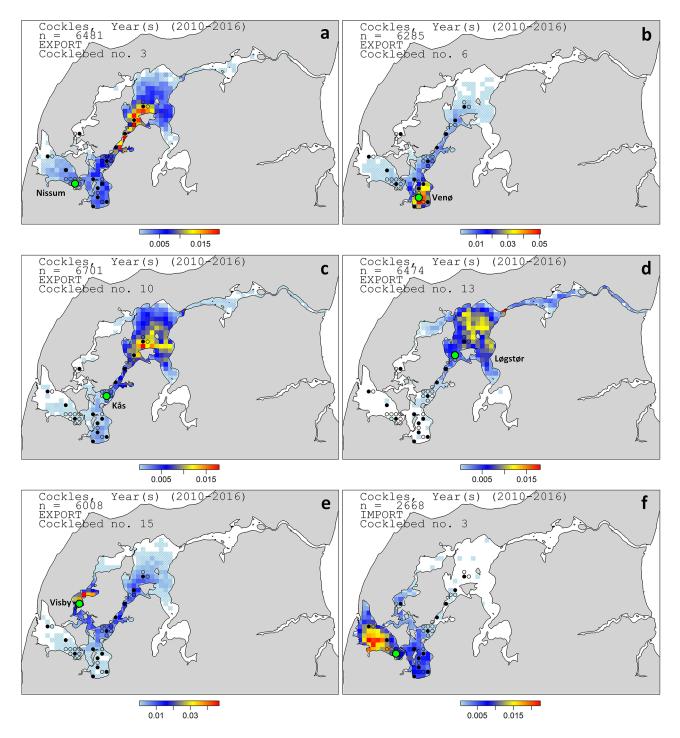
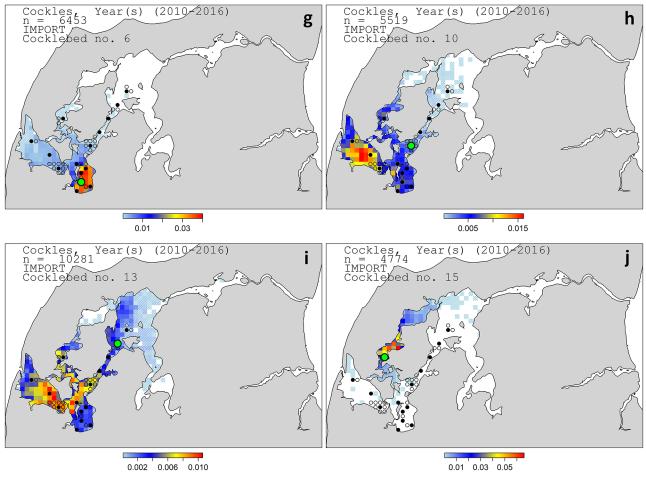


Fig. 4. (a–e) Export and (f–j) import connectivity probability maps for selected positions in the connectivity grid (enlarged green dot) representing existing major cockle beds in Limfjorden (nos. 3, 6, 10, 13 and 15, Fig. 3) based on cockle larval dispersal simulation for 7 yr, 2010 to 2016. For export connectivity probability maps, colour legends represent dispersal probabilities calculated relative to the initial release of larvae in the agent-based model including larvae exported out of the domain across the open boundaries but excluding agents stranded on dry cells (see Section 2.4). For import connectivity probability maps, colour legends represent dispersal probabilities calculated relative to the total number of larvae included in the analysis. Black dots (filled and hollow) refer to connectivity grid (2 × 2 km) cells which coincide with high cockle densities from the 2018 to 2019 survey and/or from cockle fisheries data (Black-Box data) from 2013 to 2021 (see Section 2.6). Filled dots represent 2 × 2 km grid cells for extraction of export and import connectivity probability maps selected to represent each of the 15 cockle beds referred to in Fig. 3





of  $2 \times 2$  km grid cells constituting the 15 major cockle beds has been summarised systematically in connectivity probability matrices (values in %) representing the export (plus LR) and import (plus SR), highlighting major cockle beds that are particularly well connected and those which are not (see Tables 3 & 4). The clear asymmetry of strengths of connectivity (colours) on either side of the diagonal of both matrices is a result of the dominant west-to-east dispersal of larvae along the central axis of Limfjorden, with limited connectivity in the other direction, except for cockle bed 15 (in Visby Bredning), where anticlockwise dispersal dominates around the island of Mors.

Diagonal values in the export and import connectivity matrices represent the LR and SR, respectively, of the individual  $2 \times 2$  km grid cells that each of the major cockle beds are composed of. Individual grid cells representing major cockle beds located in relatively isolated parts of Limfjorden (beds 4–8 in Venø Bay and bed 15 in Visby Bredning) have a high proportion of both LR and SR. In Venø Bay, LR and SR constitute up to 4.2% (mean 2.3, SD 1.3) of the original larval release and up to 3.7% (mean 2.7, SD 1.0) of the larval settlement, respectively. In Visby, the corresponding values are 3.3% (mean 1.9, SD 1.3) and 4.2% (mean 2.7, SD 1.4). In Venø Bay, some major cockle beds are distributed within the bay (beds 4–8), and due to the circulation patterns, results show that 20.1% of larvae released eventually settle in one of the other major cockle beds located here (Table 1).

The main donor areas for major cockle bed 10 in the most important fishing area, sub-basin Kås Bredning, are major cockle beds in the neighbouring 3 sub-basins: beds 2 and 3 (Nissum Bredning), beds 4 to 8 (Venø Bay), and bed 15 (Visby Bredning). Of the 18.5% of larvae settled in major cockle bed 10, Kås Bredning, 16.7% originates from major cockle beds in other sub-basins (Table 1), with 9.7, 4.6 and 2.0% from each of these 3 sub-basins, respectively. In comparison, only 0.2% of the larvae settled in bed 10 originates from beds 13 and 14 (Løgstør Bredning)

of larvae that settl	5	ds in each sub-basin t kle beds in the same su		rom cockle beds in other ruitment)	sub-basins or from
Sub-basin	Cockle bed	Exp	ort	Impo	ort
	no.	Export to other		Import from other	Self-
		major cockle beds (%	) (%)	major cockle beds (%)	recruitment (%)

3.4

1.4

0.7

2.9

4.9

20.1

17.3

8.1

8.0

5.9

0.5

13.7

Table 1. Summary of export and import connectivity probabilities between major cockle beds in Limfjorden (Fig. 3), which are
grouped into sub-basins (Fig. 1). Export represents fractions of larvae in major cockle beds in each sub-basin that settle in
major cockle beds in other sub-basins or in cockle beds in the same sub-basin (=local retention). Import represents fractions
of larvae that settle in major cockle beds in each sub-basin that are released from cockle beds in other sub-basins or from
cockle beds in the same sub-basin (=self-recruitment)

and beds 11 and 12 (Sallingsund). SR in bed 10 con-	&
stitutes ca. 1.8% of the total number of larvae settled	su
here. Thus, the most important fishing area is largely	wi
relying on recruitment via larval import from other	mo
sub-basins, transported by the dominant west-to-east	ax
circulation pattern. The most important major cockle	(N
beds serving as donor areas for known major cockle	Lø
beds in Limfjorden (1–15, Fig. 3) are beds 2 and 3 (in	na
Nissum Bredning), beds 4 to 8 (in Venø Bay) and bed	on
15 (Visby Bredning), where ca. 20.7, 28.2 and 18.6 $\%$ ,	(Fi
respectively, of all larvae released will settle in	sn
another (or the same) major cockle bed (Table 1).	Sk

1 - 3

4 - 9

10

11 - 12

13 - 14

15

While SR in major cockle beds located in the narrow sections along the central axis of the dominating west-to-east current is low (i.e. Kås Bredning, Sallingsund and Løgstør Bredning), constituting less than 2% of the total number of larvae settled there, major cockle beds in more isolated parts of Limfjorden have a relatively high SR, with beds 4 to 8 (Venø Bay) being the most confined sub-basin with an SR of approximately 20.1% of the larvae released.

Examples of year-to-year variations in connectivity probabilities from selected locations within existing major cockle beds are shown in Section S1.3 in Supplement 1. Results indicate that year-to-year variations are limited.

## 3.2. Cluster analysis and identification of dispersal barriers

Cluster analyses were done (Fig. 5) using connectivity matrices representing the 7 yr period 2010 to 2016 for the non-transposed (export) and the transposed (import) matrices. Note that the proportions of LR and SR for individual clusters are higher than those for individual  $2 \times 2$  km grid cells (see Tables 3

4), as both LR and SR are calculated relative to the um of agent release and the sum of agent settlement ithin the extent of each cluster. Results show that ost of Limfjorden, particularly along the central xis, is relatively well connected, with the western Vissum Bredning) and central (Kås Bredning and øgstør Bredning) parts being connected predomiantly unidirectionally from west to east but with nly limited exchange of larvae from east to west Fig. 5). More isolated areas are represented by naller clusters (Venø Bay, Lovns Bredning and kive Fjord) with dispersal barriers located at narrow inlets connecting these areas with the larger clusters of the central Limfjorden. However, given the relatively long PLD of cockles, these barriers still allow for some exchange of larvae, particularly from confined areas, with unidirectional dispersal towards the central basins (i.e. Kås Bredning and Løgstør Bredning) being dominant. The cluster comprising the northwestern strait of the island of Mors (Visby Bredning and Thisted Bredning) is dominated by a strong dispersal barrier, towards the east. However, due to the long PLD, larvae from areas within this cluster may reach the central parts of Limfjorden (e.g. Løgstør Bredning) via Kås Bredning and Sallingsund following an anticlockwise dispersal around the island of Mors. The easternmost parts of Limfjorden (Nibe Bredning and Langerak) are highly affected by the significant export of larvae out of Limfjorden to Kattegat. Cluster analysis results for individual years (Section S1.4 in Supplement 1) show similar results for all years with some deviation, especially the limited variation of the exact location of the unidirectional dispersal barrier between the western (Nissum Bredning) and eastern (Løgstør Bredning) parts of Limfjorden. However, the overall patterns of clusters for all years are comparable.

4.8

5.7

16.7

18.6

17.1

0.1

11.8

23.5

1.8

0.5

1.9

7.8

Nissum Bredning

Løgstør Bredning

Visby Bredning

Venø Bay

Kås Bredning

Sallingsund

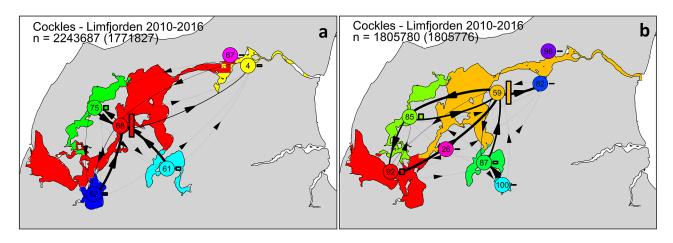


Fig. 5. Results from cluster analysis of the (a) non-transposed (export) and (b) transposed (import) connectivity matrices of the simulated agent trajectories for 7 yr, 2010 to 2016, dividing Limfjorden into clusters represented by a unique colour. (a) Values in the cluster centroids (circles) indicate the level of local retention as the fraction (in %) of larvae with an initial position in each cluster that settles within the same cluster. Similarly, arrows represent exchanges (export) of larvae between clusters, with thickness reflecting the relative proportion of the exchange (export) of larvae relative to the total number of larvae with a start position within each cluster. (b) Values in the cluster centroids (circles) indicate the level of self-recruitment within each cluster as the fraction (in %) of larvae that settles within each cluster that has a start position in the same cluster. Similarly, arrows represent exchanges (import) of larvae that settles within each cluster, with thickness reflecting the relative proportion of the exchange (import) of larvae that settles within each cluster. Similarly, arrows represent exchanges (import) of larvae that settles within each clusters, with thickness reflecting the relative proportion of the exchange (import) of larvae relative to the total number of larvae with an end position within each cluster. Bars beside each cluster centroid in both maps indicate the relative number of larvae. An upper threshold for arrow thickness was set to 10 %

## 3.3. Graph metrics

Source areas (out-strength, Fig. 6a) represent the proportion of released larvae that settle in another, or the same,  $2 \times 2$  km grid cell. Since larvae are evenly released in the entire Limfjorden, source areas are not representing any biologically relevant entity of the system, except the proportion of larvae that are lost or exported out of the model domain across open boundaries towards the North Sea and Kattegat. Results show that in the easternmost parts of Limfjorden (east of Løgstør Bredning), more than 90% of the larvae released here are exported to the Kattegat. In

the westernmost part of Limfjorden (Nissum Bredning), larvae are only lost to the North Sea from areas close to the boundary.

The primary sink areas (in-strength, Fig. 6) are in the central parts of Limfjorden (central and southern Løgstør Bredning, northern Sallingsund and the strait of the island of Mors). The western parts, including the entire Nissum Bredning, and the most isolated area to the southeast, Skive Fjord, both receive very few larvae and can be regarded as having relatively low potential import of larvae spawned elsewhere. Areas close to the North Sea model boundary may, however, receive larvae from the

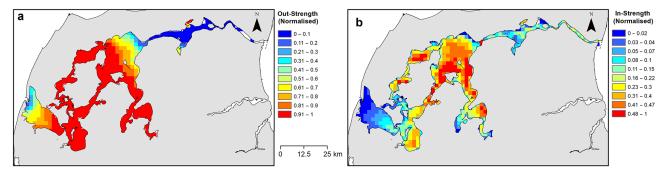


Fig. 6. (a) Source areas also referred to as out-strength, which is the weighted number of connections (edges) out of each cell (node) normalised relative to the maximum value. (b) Sink areas also referred to as in-strength, which is the weighted number of connections (edges) into each cell (node) normalised relative to the maximum value. Legend values for out-strength and instrength are classified using linears and quantiles, respectively

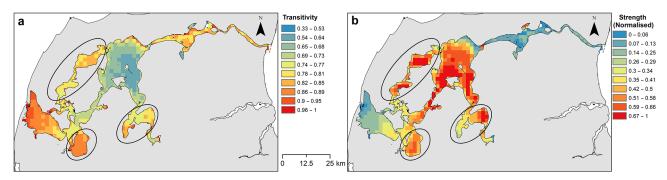


Fig. 7. (a) Transitivity of all 2 × 2 km grid cell in Limfjorden based on the connectivity matrix for 2010 to 2016. (b) In-strength and out-strength, i.e. the weighted total number of connections in and out of each 2 × 2 km grid cell in Limfjorden. Encircled areas are areas with both high transitivity and high in-degree and out-degree. Colour legends are classified using quantiles. Values in both maps are normalised relative to the maximum value in each map

North Sea, but to what extent would have to be addressed in a separate study.

The calculated transitivity for Limfjorden (Fig. 7a) shows the lowest values in the central parts of Limfjorden (including Løgstør Bredning and Sallingsund). These areas are where the total numbers of in- and outstrength are highest (Fig. 7b). Although these areas only have 50% of the possible triangular connections in their neighbourhood, they still have a very large number of connections. Nissum Bredning, on the other hand, has the highest mean transitivity, 87% (SD 5.9%), of the possible triangular connections in their neighbourhood, but there is only a relatively low number of total connections. More confined areas (encircled areas, Fig. 7) have both a high transitivity and a high number of connections and are consistently identified as individual clusters in the cluster analysis presented earlier, both for individual years and for the entire 7 yr period.

## 3.4. Connectivity between sub-basins

Export (including LR) and import (including SR) connectivity probabilities between sub-basins in Limfjorden are presented as a summary (Table 2) of the connectivity matrices with subdivisions into administrative units (Sections S1.5 & S1.6 in Supplement 1). The full connectivity matrix for the whole of Limfjorden (all  $2 \times 2$  km grid cells) is included in Supplement 2 at www.int-res.com/ articles/suppl/m14297\_supp/. For the western and central parts of Limfjorden, the connectivity patterns in the connectivity matrices are similar to the patterns discussed previously in Section 3.1, considering the connectivity between major cockle beds (Tables 3 & 4). For the main fishing area, Kås Bredning, SR in the sub-basin constitutes 3.9% of larvae settled here, and LR constitutes 2.8% of lar-

Table 2. Summary of export and import connectivity probabilities between sub-basins in Limfjorden. Export represents fractions of larvae in one sub-basin that settle in other sub-basins or in the same sub-basin (~local retention). Import represents fractions of larvae that settle in one sub-basin that are released from other sub-basins or from the same sub-basin (~self-recruitment). Sub-basin names refer to Fig. 1. The exact outline of individual sub-basins and the outline of administrative (adm.) units and associated IDs are included in Section S1.5 in Supplement 1

Sub-basin	Adm. unit ID	Exj	port ———	Imj	port
		Export to other adm. units (%)		Import from other adm. units (%)	r Self- recruitment (%)
Nissum Bredning	1.2.3.4.10.29.216	62.4	11.1	15.6	84.4
Venø Bay	5.6.7.8	51.7	46.2	34.6	65.4
Kås Bredning	9	96.1	2.8	96.1	3.9
Sallingsund	11.12.13	79.8	18.6	88.9	11.1
Løgstør Bredning	14.15.16.33.34.35.36.37.38.3	9 19.9	60.6	49.5	50.5
Visby Bredning	23.24.25.26	64.3	33.8	36.6	63.4
Thisted Bredning	27.28.30.32	26.5	71.8	27.6	72.4
Skive Fjord and Risgårde B	redning 17.18.19.22	56.2	39.4	34.4	65.6
Lovns Bredning	20.21	28.3	70.5	14.4	85.8
Nibe Bredning and Langer	ak 40.41.42	0.4	2.0	93.6	6.4

vae released. Similar low SR and LR are found in the eastern part of Limfjorden (Nibe Bredning, 6.4 and 2.0%, respectively), with slightly higher SR in the central parts (including Sallingsund, 11.1 and 18.6%, respectively). In the westernmost parts (Nissum Bredning), LR is only 11% of larvae released here, but SR is 84% of the larvae settled here, indicating that import of larvae from other parts of Limfjorden is limited. SR in the most isolated sub-basins to the north (Thisted Bredning) and to the southeast (Lovns Bredning) constitutes 72.4 and 85.8%, respectively, of the larvae settled here. Similarly, LR constitutes 71.8 and 70.5%, respectively, of the larvae released here. For the southeastern parts of Limfjorden (i.e. the subbasins of Skive Fjord and Lovns Bredning), almost 40% of the cockle larvae (Fig. 5) are exclusively exported to the larger central sub-basin (Løgstør Bredning), while larvae are received primarily from within these sub-basins themselves via larval exchange (import and export) or SR (ca. 87%, Fig. 5). A similar pattern is evident for the strait to the north of the island of Mors (Visby Bredning and Thisted Bredning), although with a clear net transport towards the west. In the most eastern parts of Limfjorden (Nibe Bredning and Langerak), larvae are exported to the Kattegat across the open model boundary, with only a very limited number (0.4%)of larvae exported towards the west.

## 3.5. Sensitivity analysis

Results from the sensitivity analyses are included and discussed in Sections S1.7-S1.14 in Supplement 1. In general, model results showed a slight increase in the areal extent of donor areas of individual cockle beds with increasing PLD but were disproportional to the relative change in PLD. The core donor areas (yellow and red colours in Fig. 4, Section S1.13 in Supplement 1) showed a limited spatial displacement with increasing PLD but with a tendency of the core donor area to become less pronounced. Changes in PLD from 30 to 50 d did not affect the number and the outline of individual clusters; only LR and SR were reduced with increasing PLD. Changing the spawning period only had marginal effect. Differences between years showed limited variability with the overall patterns of the cluster analysis results, with dispersal probability maps being comparable. Increase in horizontal dispersion resulted in an increase in the number of clusters in the most isolated parts of Limfjorden.

## 4. DISCUSSION

## 4.1. Findings

In this study, we investigated the potential demographic connectivity of common cockles in Limfjorden in general and specifically between the highly productive and commercially important cockle fishing area Kås Bredning and other parts of Limfjorden. Patterns in demographic connectivity may explain some of the temporal and spatial variability in cockle stock densities and demography observed in Limfjorden (Freitas et al. 2019, 2020, 2021), and the analyses identified cockle beds that serve as main suppliers of cockle larvae to cockle beds in other parts of the system. Some cockle beds were found to be more isolated and more reliant on SR. The results also show that in the central part of the fjord system, where predicted larval settling is highest, the absence of a cockle population indicates other factors, potentially environmental ones, are more important. These are discussed below (this section) and may include local variability in seabed substrates and sediment conditions, food availability, inter- and intraspecific competition for space and predation by adult cockles and other filter feeders on pelagic larvae.

The most important fishing area, Kås Bredning, where the largest proportion of cockle landings occurs, relies heavily (and possibly solely) on external larval supply from multiple cockle populations elsewhere in the fjord system. This can explain why Kås Bredning sustains a relatively stable recruitment of cockles, producing regular and large cockle landings every year. One of the donor areas is the largest known contiguous and currently unexploited population of cockles in the western part of the fjord system (Nissum Bredning) and is located within a protected Natura 2000 area. Historically, limited shellfish fisheries (e.g. mussels and flat oysters) have been permitted in parts of Natura 2000 areas in Limfjorden. Findings in this study, however, indicate that cockle fisheries in Nissum Bredning may potentially affect cockle larval supply to the currently exploited fishing areas east of Nissum Bredning, in particular Kås Bredning. The most potentially vulnerable cockle populations are found in the more confined parts of the fjord system, including the northwestern strait of the island of Mors (Visby Bredning) and the relatively isolated parts to the southeast (Skive and Lovns Bredning). Annual recruitment here is probably almost exclusively based on SR and thus potentially vulnerable to changes in population size within individual sub-

Table 3. Export probability connectivity matrix (in %) of the connection between the 15 known major cockle beds in Limfjorden. Name refers to sub-basins as in Fig. 1 and Section S1.5 in Supplement 1, Fig. S4. Bed ID refers to major cockle bed ID as in Fig. 3. Grid ID refers to cell ID in the 2 × 2 km connectivity grid (Supplement 3 at www.int-res.com/
articles/suppl/m14297_suppl/). Colour legend indicates levels of connectivity probability intervals. Sum is the sum of export probabilities (in %) for each grid ID. Row and column
orders reflect a predominantly west-to-east direction where possible. Rows represent sources (FROM), while columns represent sinks (TO). Colours represent export probability
intervals— green: >1%: vellow: 0.1–1%: red: 0.01–0.1%; white: <0.01%

15	1051 Sum	0.00 25.6		0.00 23.4	0.00 20.2	0.00 19.8	0.00 20.9	0.00 19.3	0.00 17.1	0.00 23.2	0.00 21.2	17	0.00 16.9	0.00 28.9	0.00 29.7		0.00 30.2	0.00 31.0				0.02 19.6		0.00 9.9		0.00 9.0		0.00	0.00	0.00	0.00 5.7	0.00	4	0.00 3.	0.00 2.3		1 50 17
Visby 15 15	985 1050			0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.02		0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.00	0.00 0.00												0.00 0.00	0.00 0.00				0.00 0.00		0.05 1.1.4
14 14	1456 $1520$	41 0.33	0.48	1.20 0.58	1.23 0.55	1.14 0.63	1.04 0.54	1.19 0.83	1.02 0.95	0.67 0.49	1.02 0.76	0.87	1.26 0.93	0.28 0.18	0.22 0.14	0.30 0.30	0.22 0.10	0.09 0.16	0.06	0.06	0.26	1.02 0.56	1.13	1.01	0.81	1.40 1.01 1 18 0 87	1 02	0.97	1.08	1.16 0.82	1.14 0.96	1.03	1.05	0.77	0.49 0.72	0.52	0 0 0 0 0 0
Løgstør 13 14 ·	1455	0 0.65 0	0.84	1.02	1.23	1.26	1.15	1.39	1.44	0.95	0.95	1.35	1.50	0.23	0.21	0.26	0.13	0.17	0.25	0.29	0.34	1.44	1.41	1.09	1.12	1 24	1 19	1.07	0.96	1.12	1.00	0.79	0.78	0.63	0.45	0.37	1 9 1
13 13	2 1193 1258	3 1.44 1.50	1.68	1.81	1.60 1.23	1.55 1.75	1.44 1.87	1.91 1.36	1.34 1.44	1.63 1.66	1.58 1.42	1.46	1.50 1.40	3 0.63 0.70	0.43 0.38	0.48 0.48	0.37 0.41	0.41 0.49	0.46	0.48	0.87	1.26	1.10	0.85	0.84	0.79 0.89	0.83	0.59	0.66	0.68	0.52	0.71	0.23	0.22	0.17 0.13	0.13	156 101
Salling 13	1061 1192	1.91 0.38	1.72	1.69 0.41	1.48 0.92	1.33 0.55	1.44 0.54	1.37 0.56	1.30 0.50	1.73 0.59	1.81 0.55	1.34	1.54 0.55	0.78 0.18	0.40 0.05	0.48 0.16	0.48 0.08	0.00 0.09	0.69	0.59	0.81	1.20 0.46	0.92	0.79	0.66	CC.U 07.0	0.84	0.74	0.66	0.70 0.56	0.33 0.46	0.18	0.23	0.37	0.10 0.18	0.18	071 153 046
10 10 10 11	733 7	79 1.69 0.30 1.04	0.23	0.88 1.22 0.19 0.91	0.55 0.86 0.06 0.86	0.37 0.75 0.08 0.63	50 1.21 0.10 0.87	60 0.80 0.14 0.48	60 0.81 0.09 0.40	82 1.33 0.21 0.54	73 1.23 0.23 0.78	0.11	48 0.75 0.12 0.47	38 0.40 0.08 0.10	17 0.54 0.03 0.27	16 0.56 0.08 0.23	27 0.59 0.10 0.24	32 0.57 0.08 0.27			0.06	0.68 0.06	0.09	0.09	0.31 0.07	12 0.24 0.06 0.19 18 0.32 0.04 0.20				0.30	08 0.11 0.02 0.14	0.00	0.08 0.05				0.78
Kaas 10 10 10 1	667 668 731	1.33 1.36 1.47 0.71 0.7	0.57	0.91 0.98 1.17 0.51 0.8	0.55 0.80 0.80 0.62 0.5	0.69 1.14 0.35	0.94 0.77 1.10 0.96 0.54 0.50 1.21	$0.83 \ 0.69 \ 0.93 \ 0.82 \ 0.34 \ 0.60 \ 0.80$	0.53 0.72 0.23 0.60	L.04 0.72 1.10 1.25 0.71 0.82 1.33	0.94 0.73 1.03 0.99 0.47 0.73 1.23		0.53 0.72 0.20 0.48	0.78 0.65 0.50 0.75 0.20 0.38 0.40	$0.91 \ 0.30 \ 0.46 \ 0.67 \ 0.11 \ 0.17 \ 0.54$	1.00 0.39 0.46 0.54 0.13 0.16 0.56	1.07 0.45 0.65 0.81 0.16 0.27	0.90 0.44 0.61 0.68 0.13 0.32	$0.86 \ 0.42 \ 0.57 \ 0.57 \ 0.16 \ 0.20 \ 0.49$	$0.91 \ 0.25 \ 0.45 \ 0.80 \ 0.11 \ 0.22 \ 0.33 \ 0.05$	0.43 0.70 0.28	0.91 0.36	0.30 0.25 0.16 0.33	0.22 0.18 0.19 0.18 0.12 0.16 0.28	0.27 0.09 0.24 0.31 0.18 0.22	0.13 0.10 0.16 0.28 0.12 0.12 0.24 0 16 0 10 0 18 0 26 0 06 0 18 0 32	0.18 0.05 0.17 0.32 0.05 0.14 0.32 0.02	0.21 0.05 0.14 0.18 0.08 0.17 0.15 0.03	0.12 0.06 0.18 0.0	0.06 0.18 0.08 0.12	0.06 0.05 0.08 0.08	0.06 0.02	0.03	0.03 0.02 0.00 0.00 0.08 0.02		0.00 0.02 0.00 0.00 0.00 0.0	046 060 060 075 036 068 064
9 10 10	404 602 666	0.46 1.69 1.33	1.45	0.34 1.39 0.91	0.37 0.74 0.55	0.20 0.92 0.61	0.29 0.94 0.77	0.22 0.83 0.69	0.23 0.52 0.44 0.53	0.61 1.04 0.72	0.31 0.94 0.73		0.25 0.79 0.44 0.53	0.43 0.78 0.65	0.38 0.91 0.30	0.33 1.00 0.39	0.56 1.07 0.45	0.44 0.90 0.44								0.06 0.13 0.10				0.00 0.16 0.04 0.06	0.02 0.05 0.02 0.06						
10 7 8 8	1 406	5 0.19 0.41 0.44 0	0.39	0.25 0.20 0.39 0.39 0	5 0.18 0.55 0.62 0	0.35 0.47 0.27	0.17 0.23 0.33 0.44 0	0.15 0.60 0.29	0.29 0.21 0.38 0.20 0	0.25 0.23 0.30 0.46 0	0.24	0.25	0.20 0.37 0.22 0.22 0	2.76 2.36 2.61 1.35 0	2.89 2.40 2.97 1.61 0	2.36 2.46 1.62	3.01 2.75 3.31 1.34 0	2.90 2.57 3.18 1.58 0	3.16 2.20 3.19 1.62 0	3.20 2.34 2.67 1.48 0	1.69 2.09 1.09	0.49	0.13	0.21	0.06	00.0	8 0 1 1 0 1 2 0 0 5 0	6 0.06 0.00 0.05 0	6 0.12 0.06 0.00 0	0.06	0.03 0.02 0.00	00'0	0.00	0 0.00 0.03 0.00 0		0.00 0.00 0.00 0.00	0 0 00 0 14 0 28 0 14
	1 81 82 1	0.08 0.25 0.14 0.11 0.2	0.14 0.18 0.23	0.41 0.29 0.20	0.18 0.49 0.25 0.37 0.2	0.18 0.41 0.39 0.51 0.43	0.31 0.29 0.29	0.15 0.45 0.29 0.29 0.34	0.29 0.46 0.37 0.47 0.2	0.12 0.26 0.25 0.35 0.2	$0.08 \ 0.42 \ 0.27 \ 0.23 \ 0.27 \ 0.18 \ 0.42$	0.53 0.26 0.28	0.08 0.55 0.19 0.30 0.2	1.43 4.26 2.21 3.28 2.7	1.57 4.26 3.02 3.77 2.8	1.36 4.03 2.36 3.67 3.02	1.34 4.36 2.47 3.82 3.0	1.78 4.85 2.79 3.58 2.9	1.46 4.56 2.88 4.07 3.1	4.34 2.56 3.69		0.30 1.02 0.53 0.81 0.79	0.18 0.16	0.21 0.04 0.22	0.04 0.16 0.04 0.10 0.1	0.03 0.16 0.10 0.10 0.03 0.04 0.10 0.01 0.11 0.10 0.08 0.16 0.08 0.13	0.02 0.17 0.08 0.08 0.08 0.11 0.12 0.06 0.10 0.02 0.17 0.08 0.08 0.08 0.11 0.12 0.05 0.08	0.06 0.09 0.06 0.08 0.06 0.06 0.00 0.05	0.00 0.18 0.00 0.12 0.06	0.00 0.08 0.06 0.08 0.0	0.02 0.00 0.02	0.00 0.02	0.02 0.00 0.00 0.00 0.0			0.00 0.00 0.00 0.00 0.00 0.00	0 14 0 14 0 11 0 11 0 00 0 00 0 14
3 3 3	400 4	10	0	-	10	10	8	~1	<u> </u>	8	~	~		~	- 1	~1	~1	~1	-	10		~			~ -		1 0		$\sim$	~1	)	0		~			2
Nissum 3 3 3 3	335 3	$0.19 \ 0.16 \ 0.63 \ 0.14 \ 0.30 \ 0.41 \ 0.93 \ 0.95 \ 0.54 \ 0.82 \ 0.82 \ 0.35$	0.02 0.14 0.63 0.07 0.20 0.50 0.73 0.91 0.39 0.68 1.09 0.20	0.07 0.10 0.63 0.14 0.30 0.15 0.53 0.76 0.41 0.51 0.47 0.30	0.00 0.25 0.12 0.12 0.25 0.31 0.31 0.43 0.31 0.12 0.37 0.25	0.06 0.08 0.12 0.18 0.18 0.22 0.47 0.43 0.37 0.37 0.29 0.06	0.00 0.06 0.19 0.17 0.27 0.37 0.58 0.48 0.31 0.35 0.37 0.2	0.02 0.03 0.34 0.05 0.09 0.25 0.35 0.29 0.22 0.25 0.26 0.12	0.03 0.03 0.18 0.09 0.09 0.17 0.32 0.24 0.17 0.23 0.18 0.11	0.05 0.16 0.41 0.21 0.33 0.43 0.81 0.61 0.33 0.74 0.56 0.28	0.10 0.10 0.32 0.11 0.37 0.23 0.50 0.36 0.32 0.57 0.36 0.23	0.00 0.00 0.09 0.06 0.16 0.11 0.36 0.39 0.09 0.22 0.23 0.06	$0.02 \ 0.02 \ 0.09 \ 0.08 \ 0.09 \ 0.08 \ 0.08 \ 0.20 \ 0.23 \ 0.14 \ 0.17 \ 0.12 \ 0.11$	0.00 0.03 0.15 0.03 0.05 0.03 0.33 0.40 0.08 0.20 0.15 0.03	$0.00\ 0.00\ 0.10\ 0.06\ 0.13\ 0.11\ 0.25\ 0.22\ 0.22\ 0.21\ 0.19\ 0.02$	0.00 0.02 0.10 0.07 0.13 0.03 0.23 0.16 0.13 0.16 0.13 0.02	0.00 0.00 0.10 0.06 0.06 0.10 0.21 0.19 0.05 0.25 0.13 0.02	0.00 0.02 0.08 0.05 0.09 0.08 0.19 0.32 0.16 0.24 0.11 0.02	0.00 0.00 0.08 0.06 0.17 0.14 0.20 0.35 0.05 0.17 0.14 0.02	0.02 0.05 0.03 0.05 0.08 0.02 0.14 0.33 0.05 0.11 0.10 0.05	0.02 0.00 0.00 0.04 0.15 0.06 0.17 0.34 0.11 0.23 0.11 0.04	0.00 0.02 0.06 0.12 0.18 0.24 0.27 0.30 0.24 0.24 0.23 0.03	0.00 0.01 0.01 0.01 0.04 0.03 0.06 0.06 0.01 0.07 0.04 0.01	0.00 0.00 0.03 0.01 0.06 0.01 0.06 0.07 0.07 0.07 0.07 0.01	0.00 0.00 0.00 0.01 0.00 0.00 0.04 0.09 0.01 0.06 0.01 0.00				0.00 0.00 0.00 0.00 0.00 0.00 0.12 0.06 0.00 0.00 0.06 0.00	0.00 0.00 0.00 0.00 0.02 0.00 0.02 0.02	0.00 0.00 0.00 0.00 0.00 0.02 0.03 0.00 0.00	0.00 0.00 0.00 0.00 0.00 0.02 0.02 0.00 0.00 0.02 0.02 0.00	0.00 0.00 0.00 0.00 0.05 0.00 0.02 0.02		0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.0		0.00 0.00 0.04 0.07 0.00 0.04 0.04 0.11 0.11 0.07 0.04 0.07
3 Ni	270 2	33 0.14 0.30 0.43	3 0.07 0.20 0.50	33 0.14 0.30 0.15	2 0.12 0.25 0.3	2 0.18 0.18 0.22	9 0.17 0.27 0.33	<b>14</b> 0.05 0.09 0.25	8 0.09 0.09 0.13	1 0.21 0.33 0.43	12 0.11 0.37 0.23	9 0.06 0.16 0.1	30.0 60.0 80.0 60	5 0.03 0.05 0.00	0 0.06 0.13 0.1	0 0.07 0.13 0.00	0 0.06 0.06 0.10	8 0.05 0.09 0.08	18 0.06 0.17 0.14	3 0.05 0.08 0.02	0 0.04 0.15 0.06	16 0.12 0.18 0.2 <sup>4</sup>	11 0.01 0.04 0.03	03 0.01 0.06 0.0	00 0.01 0.00 0.00			12 0.00 0.03 0.02	0.0 0.00 0.00	0 0.00 0.02 0.00	0.0 0.00 0.00 00	0.0 0.00 0.00 0.02	0 0.00 0.05 0.00	00 0.00 0.00 000		0.0 0.00 0.00 000 000	M 0.07 0.00 0.04
1 1 2	719 720 528	0.19 0.16 0.6	0.02 0.14 0.6	0.07 0.10 0.6	0.00 0.25 0.1	0.06 0.08 0.1	0.00 0.06 0.1	0.02 0.03 0.3	0.03 0.03 0.1	0.05 0.16 0.4	0.10 0.10 0.3	0.00 0.00 0.0	0.02 0.02 0.0	0.00 0.03 0.1	0.00 0.00 0.1	0.00 0.02 0.1	0.00 0.00 0.1	0.00 0.02 0.0	0.00 0.00 0.0	0.02 0.05 0.0	0.02 0.00 0.0	0.00 0.02 0.0	0.00 0.01 0.0	0.00 0.00 0.0	0.00 0.00 0.0		0.00.00.00.00	0.02 0.00 0.0	0.00 0.00 0.0	0.00 0.00 0.0	0.00 0.00 0.0	0.00 0.00 0.0	0.00 0.00 0.0	0.00 0.00 0.0	0.00 0.00 0.0	0.00 0.00 0.00	0 00 0 00 0
Name Bed ID	· •	719	720	528	270	271	334	335	336	398	399	400	401	14	81	82	145	210	275	341	406	404	602	666	667 669	000 731	732	733	798	864	1061	1192	1193	1258	1455	1520	985
	NameBed ID	1		7	e	n	З	S	e	e	e	e	e	4	5	5	9	4	Ł	8	∞	6	10	10	10	10	10	10	10	_	lin 12	13	13	13	14	14	15

Table 4. Import probability connectivity matrix (in %) of the connection between the 15 known major cockle beds in Limfjorden. Name refers to sub-basins as in Fig. 1 and Section S1.5 in Supplement 1. Bed ID refers to major cockle bed ID as in Fig. 3. Grid ID refers to cell ID in the 2 × 2 km connectivity grid (Supplement 3. Colour legend indicates levels of connectivity probability intervals. Sum is the sum of import probabilities (in %) for each grid ID. Row and column orders reflect a predominantly west-to-east direction where possible. Rows represent sinks (TO), while columns represent sources (FROM). Colours represent import probability intervals: green: >1%; yellow: 0.1–1%; where possible. Rows represent sinks (TO), while columns represent sources (FROM). Colours represent import probability intervals: green: >1%; yellow: 0.1–1%; where possible.

	Sum	14.0	1.5	14.9	9.6	19.1	18.5	17.4	17.6	16.0	17.0	16.5	16.0	31.2	30.8	30.3	31.2	30.8	29.8	29.9	26.7	21.5	20.3	18.1	4.6	~ ~	18.2	19.0	17.2	19.3	18.9	19.4	19.7	20.0	9.1	9.0	2.0	<u>,</u> u	C. 1
5		-	18 11	_		-	<u> </u>	<u> </u>	32 11	·	-							_							_		-				-		-				71 8		
			0.00						21 0.																				-								17 10		
			0.0		4 0.0										5 0.0	6 0.0			0.0								5 0.6										0 0		
		-	0.0		0.3																		-																_
14	-							0.0	0.0		0.0(	0.0		0.0(	0.0	0.0	0.0(	0.0	0.0	0.0				0.0	0.0		0.0					0.28	0.0			0 0			
14	1456	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00													0.00	0.02										0.07	0.32	0.28			
14	1455	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.02	0.00	0.00		0.05	0.01	0.00	0.00	0.06	0.25	0.10	0.08	0.27	0.29	0000		0.00
13	258	0.00	0.00	0.00	0.00	00.0	0.08	0.00	00.0	0.00	00.0		00.0	00.0	0.00	0.00	0.00	0.00	0.00	0.04	0.00	0.05		0.02	0.00		0.02		0.08			0.42		0.26					
															01 0	00				02 0	00 0																		
-																											12 0												
															5 0.	0.90	0.90	0.90	0.4														33 0.						20
-	-					-		_	·	_							_	_	_						_														
						0.0 7		0.0						0.0	3 0.0	3 0.0		2 0.0	0.0 6																				
						0.17													0.0																		0.00		
10	732		0.00	0.00			0.08	0.07					0.12			0.11				0.14	0.08						0.21		0.08	0.31									
10	731	0.00	0.37	0.00	0.17	0.09	0.08	0.11	0.07	0.00	0.08	0.09	0.12	0.08	0.09	0.11	0.06	0.15	0.09	0.11	0.11	0.38	0.13	0.11	0.16	0.20	0.21	0.24	0.17	0.24	0.34	0.55	0.49	0.55	0.66	0.58	0000		0.00
10	668	0.00	0.18	0.12	0.17	0.00	0.25	0.07	0.04	0.25	0.17	0.09	0.12	0.08	0.14	0.15	0.11	0.04	0.07	0.12	0.11	0.19	0.14	0.16	0.20	0.29	0.19	0.24	0.33	0.31	0.44	0.85	0.51	0.58	0.83	0.92	0000		0.00
10	667		0.00																																				
								.15 (						.11 (	.18	.06			.20							0 T 0						06.	.55 (	.53			00		
																																		70 0					
-	-	_	18 0	_								-	_								_	_						·			_			-	_	-			
			0.00																																				
			5 0.0																-	-							0 0 0 0 0												
			0.5				1 0.0		7 0.7																		1 0.3												
7			0.0				0.7		0.7																	0 0 0	0.3												
7	210		0.18	0.31					0.70																														
9	145	0.00	0.00	0.37	0.69	0.34	0.49	0.49	0.42	0.19	0.68	0.37	0.12	3.17			3.72	3.54		3.67	2.26	1.64			0.74	0.36	0.40	0.55		0.36	0.28	0.12			0.08	0.14	0000		0.00
5	82	0.00	0.18	0.37	0.69	0.69	0.16	0.52	0.35	0.50	0.42	0.37	0.12	3.14	3.10	3.02	3.47	3.45	3.21	2.65	2.67	0.94	0.96	0.53	0.51	00.0	0.24	0.51	0.42	0.34	0.27	0.23	0.28	0.28	0.16	0.18	1770		0.00
5	81	0.00	0.00	0.37	0.69	0.69	0.58	0.60	0.49	0.87	0.55	0.55	0.12		3.38	3.99	3.67	3.41	3.37	3.30	2.72			0.42	0.53	0.04	0.26	0.51		0.41	0.24	0.07	0.26	0.23	0.13	0.14			
4	14																																				00		
3	01	45	.18	.37	.86 0	51 0	.41 0	.49 (			.46 0	.37 0	.82 (		44 2	.25 1							.81 (		.62		73 0	.72	.67	.72	.93	.81	.92 (	.88	.95 0	.80 60 0	00	8 8	2
		000	0 00	37 0	69 0	86 0	58 0	86 0	88 0	37 0	59 0	69 0	58 0	34 0	43 0	36 0	28 0	30 0	25 0	46 0			65 0	78 0	62 0	n ng Be n	02 0	96 0	59 0		81 0	72 0	0 06	92 0	86 0 	72 0 64 0			200
			11 0.	23 0.	20 0.	97 <mark>0</mark> .	15 <mark>0</mark> .				48 <b>0</b> .	01 0.		19 0.	33 0.	36 0.	22 0.	32 0.	25 0.	46 0.	40 0.	89 0.	92 0.	00 00	16 0.	97 0.	06 1.	14 0.	17 0.	15 0.	00 0.	78 0.	94 0.	86 0.	58 0.				04 C.
											0 1.	7 1.		6 0.	0 0:	2 0.	3 0.	8 0.	1 0.		5 0.	3 0.1	0.0			0 F	8				9 1.	3 0.	5 0.	80.0	1 0	0.0			0
				4 1.5	3 2.2						3 1.9			2 0.2	8 0.2	0 0.3	8 0.3	6 0.2	1 0.3			0 1.7	4 1.0				2 1.1		0 1.0	2 0.7	0 0.9	6 0.8	5 0.9	1 0.9	3 0.5	6 0.4 1 0.3			ה ה
		5 0.9	7 0.3	5 0.7							3 0.6	3 0.5		3 0.7		0.5			2 0.3			\$ 0.7	5 0.5	0.0	0.0	7.0 0	0.0	3 0.7	5 0.5	1 0.6	1 0.8	3 0.7		6.0 6	0.0	9.0 č			0.0
			0.3	1.32	0.5		1.3	0.80	0.6		0.68	0.78		0.38	0.3	0.4(		0.4	0.2	0.69		0.66	0.8	1.00	1.0	0.0	0.9	0.78	0.7	0.7	0.87	0.8	1.19	0.80	0.8	0.7(	0.00		5
3	334							-			0.72		1						0.25				0.71		0.96			0.87	0.42	1.01	0.65	0.60					0.00		2.0
з	271	1.36	0.74	0.37		0.77	0.91	0.86	0.74		0.76	0.65	0.35	0.34	0.25	0.40	0.39	0.39	0.38	0.41		0.47	0.71	0.66	0.62	0.61		0.55	0.33	0.74	0.61	0.62	0.73	0.84	0.61	0.55	0000	0000	0.00
3	270	0.00	0.74	0.12	0.34	0.34	0.41	0.19	0.25	0.31	0.08	0.28	0.47	0.11	0.10	0.08	0.09	0.07	0.07	0.16	0.27	0.28	0.19	0.20	0.24	0.20	0.21	0.21	0.08	0.34	0.23	0.35	0.25	0.19	0.20	0.20	0000		0.00
2	528		1.11	2.28	1.37	1.54	0.74	1.16	1.59	1.49	1.27	1.29		0.11	0.30	0.36	0.19	0.28	0.27	0.41	0.62	0.94	1.30	1.20	1.05	1.04	1.23	1.08	0.92	1.29	0.94	0.55	1.03	0.93	0.59	0.70	000		U.U.
1								20	.41					00.0	0.08	.17 (	.15 (	.15 (	.18 (	.23	.46 (	.80 (	.01	50	16.1				.84				.71		.37		00	3 3	3.
1									-																				.92 0								000		د 39.
1 ID			-	_	_	-			_										· · ·														-						
Bec	ID Gri	4	2					čć	čć					1				2																					
	e Bed	-	-	2	e	e	e	e	e	e	3	e	3	4	5	5	9	₽		∞	∞	6	10	10				10	10	_		13					+		
	d					п	III	ssil	T								a	uə/							c	gey	T			-In pn	ιĮ		10		òøт		1	۲q۶	ST
	1 1 2 3 3 3 3 3 3 3 3 3 3 4 5 5 6 7 7 8 8 9 10 10 10 10 10 10 11 12 13 13 13 14 14 14 15 15	1 1 2 3	1 1 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 4 5 5 6 7 7 8 8 9 10 10 10 10 10 10 11 12 13 13 13 14 14 14 14 15 15 15 15 17 17 9 720 528 270 271 334 335 336 398 399 400 401 14 81 82 145 210 275 341 406 404 602 666 667 668 731 732 733 798 864 1061 1192 1193 1258 1455 1456 1520 985 1050 1051 051 317 054 151 10 12 13 13 13 13 13 13 13 13 13 13 13 13 13	$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	$ \begin{array}{rrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrr$	1 1 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3	$ 1 \ 1 \ 2 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3$	1 1 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3	$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	$ 1 \ 1 \ 2 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3 \ 3$	1 1 1 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3	1 1 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3	1 1 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3	1  1  2  3  3  3  3  3  3  3  3  3	1 1 2 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3	$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	1   1   3	1  1  2  3  3  3  3  3  3  3  3  3	1   1   3	$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	11   1   3	1   1   3	11   2   3   4   4   4   4   6   6   6   7   3	1   1   3	1   1   3   4   4   4   4   60   000	1   2   3	1   1   3   4   66   66   56   00	1   1   2   3   4   4   5   5   7   3   3   3   4   4   5   5   7   3   3   3   4   4   5   5   7   5   3	1   1   3	1  1  2  3  3  3  3  3  3  3  3  3	1   2   3   3   5   6   7   8   8   10   10   10   11	1   2   3   1	1   2   3   1	1   1   3   4   1	1   1   3   4   1			

basins, either resulting from natural mortality or over-exploitation.

While demographic connectivity patterns found between existing subpopulations of cockles are supported by observations from survey data and cockle landings, other demographic connectivity predictions are not supported by empirical data. For instance, the large central basin (Løgstør Bredning) was identified as a primary sink area, subject to a potentially high input of larvae from multiple other parts of Limfjorden (including most of the existing major cockle beds) as well as larvae potentially originating from SR. Still, large and dense cockle populations have only been observed in the southern parts of Løgstør Bredning and not in the central and northern parts, where predicted settling is highest and comparably optimal. A hypothesis is that one or more environmental and/or ecological factors may limit the recruitment of cockles in these areas. Several factors may potentially affect the recruitment of cockles, including various environmental factors like oxygen and sediment conditions (Dare et al. 2004), predation (de Montaudouin & Bachelet 1996), food availability (de Montaudouin & Bachelet 1996), disease (Malham et al. 2012, review), adult cockle abundance (André & Rosenberg 1991, Beukema & Dekker 2018) and fisheries (Ens et al. 2004, Beukema & Dekker 2018 and references therein).

Løgstør Bredning has the largest reported biomass of blue mussels Mytilus edulis recorded in the period 2012 to 2021 (stock assessment reports, e.g. Nielsen et al. 2018), which are competitors for food and space, via deteriorated sediment conditions and via larval predation (Donadi et al. 2013, Meyer et al. 2021). Recorded biomasses of blue mussels in prime cockle fishing areas in Limfjorden are relatively lower than those in the central and northern parts of Løgstør Bredning (DTU Aqua unpubl. data). However, while interspecific competition and/or larval predation from e.g. mussels may theoretically explain some of these discrepancies, observations by the authors of high cockle densities found next to dense blue mussel populations (e.g. Kås Bredning and southwestern Løgstør Bredning) suggest that other factors may be more important. Environmental conditions originating from hydrodynamic and biogeochemical model simulations and monitoring data show that current speed, oxygen conditions and food in terms of chl a are slightly more favourable in these prime cockle areas compared to conditions in the central and northern parts of Løgstør Bredning (data extracted from Erichsen & Birkeland 2019, 2020; survey data from the Surface Water Monitoring Database, ODA, https://odaforalle.au.dk/). Observations by the authors during monitoring campaigns and mussel bottom-culture activities also suggest that sediment conditions in Løgstør Bredning are variable with patchily unconsolidated mud that deviates from the locations with high cockle densities, despite identical seabed sediment classification (EMODNET 2022).

One or more of these dissimilarities in environmental conditions, interspecific competition and/or larval predation may explain the discrepancy between the existing distribution of high-density populations of cockles and the locations of the primary sink areas for cockle larvae in Løgstør Bredning predicted from biophysical modelling in this study. This decoupling between larval settlement and recruitment has been found for cockles at other study sites (e.g. Dankers 1993, Andresen et al. 2014), and findings in this study indicate the occurrences of this decoupling and the causal relationships of the underlying processes may be highly site dependent. These findings also emphasise that the analysis of potential connectivity based on biophysical modelling alone without data on the present distribution of the species studied and/or habitat quality may lead to biased conclusions on sink-source dynamics and ultimately misguidance of management practices, particularly when recruitment processes are not well understood.

## 4.2. Challenges

Pastor et al. (2021) studied the potential connectivity of blue mussels in Limfjorden using a combination of larval dispersal modelling and population genetic analysis. The modelling approaches were similar to the present study, although less systematic in terms of spatial coverage of larval release points, and not including the westernmost parts of Limfjorden, e.g. Nissum Bredning. A PLD of 21 d was used for mussels, while we used 35 d for cockles. Despite the shorter PLD, the authors concluded that Limfjorden is a well-connected system supported by the genetic results showing no genetic deviations between sampling sites. This conclusion seems reasonable considering the relatively high abundance of blue mussels throughout Limfjorden (including numerous bottom cultures and line cultivation sites) and/or when considering a multigenerational or evolutionary context. For cockles, however, the current knowledge on distribution and abundance indicates many more patchy occurrences with high spatial and temporal variability, and large areas where cockles are almost absent (like central and northern parts of Løgstør Bredning). Thus, demographic connectivity processes may be more important for cockles than for mussels in a system like Limfjorden, despite a relative longer PLD.

The different conclusions between the 2 studies highlight one of the most challenging topics in marine connectivity studies. As for most other larval dispersal and marine connectivity studies, criteria for when a connection between sites can be considered strong or weak are not trivial (e.g. Treml et al. 2012, Jacobi et al. 2012) and remain unresolved. Factors such as fecundity, larval mortality and recruitment success are important in addition to larval dispersal and connectivity. A relatively low demographic connectivity inferred from a biophysical model may not necessarily imply that populations are not connected in a demographic context and vice versa (Treml et al. 2012). For species with high reproductive outputs (like cockles and blue mussels) and high population densities, even low calculated dispersal probability may be sufficient to supply a minimum of larval settlement to support a large recruitment, resulting in larval dispersal and settlement only having a secondary importance relative to environmental and ecological factors. Thus, the identification of criteria or thresholds to discriminate between strong and weak connectivity that is biologically relevant is required for a better interpretation of outcomes from connectivity studies (Cowen et al. 2006). For cockles, as for other marine species, such criteria or thresholds need to be addressed in future research on demographic connectivity (e.g. aiming at examining statistical correlations between observations of abundances and annual recruitment successes) and on environmental and ecological explanatory variables (e.g. from both monitoring data and hydrodynamic and biogeochemical model outputs) and larval dispersal and connectivity metrics, as presented here.

While criteria for connectivity thresholds are indeed a key challenge for evaluating the outcome of marine connectivity analyses, uncertainties associated with model assumptions and model parameterisations are other crucial factors to address. In our study, the hydrodynamic data set is in high spatial resolution and well calibrated; however, any refinement and downscaling of the computational grid and/or time step may potentially affect the outcome of the biophysical model and hence the derived connectivity metrics. Reviews of previous studies suggest that such refinement tends to increase LR (Swearer et al. 2019). This is supported by the sensitivity analysis in our study showing a decrease in larval dispersal with an increase in the horizontal dispersion factor, where horizontal dispersal is included to reflect dispersal processes not resolved in the computational grid of the hydrodynamic model. Uncertainties also relate to biological parameters including the PLD and the designated spawning period. Sensitivity analysis, however, indicated connectivity metrics in terms of the spatial dispersal probability and cluster analyses were relatively insensitive, except for PLD of 25 d or less. Finally, stranded agents in the biophysical model were discarded from the connectivity analysis, and this may potentially introduce a bias to the results presented here. In parts of Limfjorden where existing dense cockle beds are found, discarded agents comprise an average of 3.6% of the total number of released agents each year. The potential implication for the results presented here is assumed to be marginal.

#### 4.3. Implication for cockle fisheries management

The use of larval dispersal modelling and connectivity analysis has previously been proposed as a tool to support marine management. Uses may include optimal selection and planning of marine protected areas (e.g. Shanks et al. 2003, Ross et al. 2017, Jonsson et al. 2020), marine spatial planning (e.g. Jonsson et al. 2021), optimisation of coastal ecosystem services (e.g. Ospina-Alvarez et al. 2020), identification and delineation of exemptions areas within the Ballast Water Management Convention (Baetens et al. 2018, Hansen & Christensen 2018) and optimisation of monitoring networks for marine invasive species (Lindegren et al. 2022). Many of these studies, like the study presented here, rely on estimates of potential connectivity rather than realised connectivity (Watson et al. 2010), and the implication for recruitment and population development are often not addressed directly. Although predictions of recruitment and population growth are often complex and limited by available data and knowledge of individual drivers, the use of meta-population concepts and modelling, together with reasonable assumptions of demographic rates, can provide a useful insight to the population dynamics that can be expected or predicted within and between subpopulations of marine organisms. Here, meta-populations refer to subpopulations that belong to an interconnected network where demographic rates (offspring, mortality, etc.) and dispersal rates (larval sources and sinks) together drive population recruitment, densities and growth rates at a subpopulation level. These types

of analyses are essential for evaluating different resource management strategies, such as population catch quotas and no-harvest areas (Puckett et al. 2014, Theuerkauf et al. 2021). For the management of the cockle fishery in Limfjorden, the study presented here provides a baseline for such future assessment, where analysis of potential connectivity in combination with data from annual stock assessment and fisheries surveillance can support the prediction of future stock development under different management strategies and scenarios. This includes the impacts from opening of non-fished areas, which may provide significant larval supplies to other areas, or closure of fished areas that may be heavily reliant on SR.

Larval dispersal modelling and connectivity analyses as presented here are valuable tools for gaining insight into the potential causalities of some of the underlying processes driving population distribution and dynamics of cockles in a system like Limfjorden. However, empirical data are required for validation if we want to take this type of study a step further. These could include multiannual monitoring and stock assessment of cockles and other competitive species and their demography; larval surveys (e.g. Paris & Cowen 2004); elemental fingerprinting of larval shells (Nolasco et al. 2018); genetic relatedness (Couvray & Coupé 2018); and monitoring and modelling (calibrated and validated) of key environmental drivers such as temperature, oxygen concentrations, food availability, currents and sediment conditions.

Acknowledgements. This study was funded by the Danish EMFF/EHFF program (European Fisheries Fund and Danish Ministry of Environment and Food) within the project COCKLE II: Bæredygtigt hjertemuslingefiskeri i Limfjorden (33113-B-20-172). Views in this publication are of the authors only, and the European Union or Danish Ministry of Environment and Food cannot be held responsible for views and information contained herein. The authors gratefully acknowledge the valuable help of the staff at the Coastal Ecology Section of DTU Aqua in the collection and processing of cockle samples. This publication is based upon work from COST Action Unifying Approaches to Marine Connectivity for Improved Resource Management for the Seas (SEA-UNICORN) CA19107, supported by COST (European Cooperation in Science and Technology, www.cost.eu).

#### LITERATURE CITED

- André C, Rosenberg R (1991) Adult–larval interactions in suspension-feeding bivalves *Cerastoderma edule* and *Mya arenaria*. Mar Ecol Prog Ser 71:227–234
- Andresen H, Strasser M, van der Meer J (2014) Estimation of density-dependent mortality of juvenile bivalves in the Wadden Sea. PLOS ONE 9:e102491

- Baetens K, Gittenberger A, Barbut L, Lacroix G (2018) Assessment of the ecological implications when installing an SRA between Belgium and the Netherlands. Final project report. Royal Belgian Institute of Natural Sciences, Operational Directorate Natural Environment, Ecosystem Modelling, Brussels
- Bakker W, Ens BJ, Dokter A, van der Kolk HJ and others (2021) Connecting foraging and roosting areas reveals how food stocks explain shorebird numbers. Estuar Coast Shelf Sci 259:107458
- Balbar A, Metaxas A (2019) The current application of ecological connectivity in the design of marine protected areas. Glob Ecol Conserv 17:e00569
  - Bayne BL, Widdows J, Thompson R (1976) Physiological integrations. In: Bayne BL (ed) Marine mussels. Cambridge University Press, Cambridge, p 261–299
- Berger AM, Deroba JJ, Bosley KM, Goethel DR, Langseth BJ, Schueller AM, Hanselman DH (2021) Incoherent dimensionality in fisheries management: consequences of misaligned stock assessment and population boundaries. ICES J Mar Sci 78:155–171
- Bernard I, de Kermoysan G, Pouvreau S (2011) Effect of phytoplankton and temperature on the reproduction of the Pacific oyster *Crassostrea gigas*: investigation through DEB theory. J Sea Res 66:349–360
- Beukema JJ, Dekker R (2018) Effects of cockle abundance and cockle fishery on bivalve recruitment. J Sea Res 140: 81–86
- Bradbury IR, Laurel B, Snelgrove PVR, Bentzen P, Campana SE (2008) Global patterns in marine dispersal estimates: the influence of geography, taxonomic category and life history. Proc Biol Sci 275:1803–1809
- Brennan CE, Maps F, Gentleman WC, Plourde S and others (2019) How transport shapes copepod distributions in relation to whale feeding habitat: demonstration of a new modelling framework. Prog Oceanog 171:1–21
- Ciutat A, Widdows J, Pope ND (2007) Effect of Cerastoderma edule density on near-bed hydrodynamics and stability of cohesive muddy sediments. J Exp Mar Biol Ecol 346:114–126
- Coscia I, Wilmes SB, Ironside JE, Goward-Brown A and others (2020) Fine-scale seascape genomics of an exploited marine species, the common cockle *Cerastoderma edule*, using a multimodelling approach. Evol Appl 13: 1854–1867
- Costa A, Petrenko AA, Guizien K, Doglioli AM (2017) On the calculation of betweenness centrality in marine connectivity studies using transfer probabilities. PLOS ONE 12:e0189021
  - Couvray S, Coupé S (2018) Three-year monitoring of genetic diversity reveals a micro-connectivity pattern and local recruitment in the broadcast marine species *Paracentrotus lividus*. Heredity 120:110–124
- Cowen RK, Sponaugle S (2009) Larval dispersal and marine population connectivity. Annu Rev Mar Sci 1:443–466
- Cowen RK, Paris CB, Olson DB, Fortuna JL (2003) The role of long distance dispersal versus local retention in replenishing marine populations. Gulf Caribb Res 14: 129–138
- Cowen RK, Paris CB, Srinivasan A (2006) Scaling of connectivity in marine populations. Science 311:522–527
- Creek GA (1960) The development of the lamellibranch Cardium edule L. Proc Zool Soc Lond 135:243–260
  - Csárdi G, Nepusz T (2006) The Igraph software package for complex network research. Int J Complex Syst 1695

- Dankers N (1993) Integrated estuarine management obtaining a sustainable yield of bivalve resource while maintaining environmental quality. In: Dame R (ed) Bivalve filter feeders in estuarine and coastal ecosystem processes. NATO ASI Series, Vol G33. Springer, Berlin, p 479–511
- Dare PJ, Bell MC, Walker P, Bannister RCA (2004) Historical and current status of cockle and mussel stocks in the Wash. CEFAS, Lowestoft
- Darnaude AM, Arnaud-Haond S, Hunter E, Gaggiotti O and others (2022) Unifying approaches to functional marine connectivity for improved marine resource management: the European SEA-UNICORN COST action. Res Ideas Outcomes 8:e80223
  - de Montaudouin X, Bachelet G (1996) Experimental evidence of complex interactions between biotic and abiotic factors in the dynamics of an intertidal population of the bivalve *Cerastoderma edule*. Oceanol Acta 19:449–463
  - DHI (2017a) MIKE 21 & MIKE 3 flow model FM. Hydrodynamic and transport module. Scientific documentation, DHI GROUP, Hørsholm. https://manuals.mikepowered bydhi.help/2017/Coast\_and\_Sea/MIKE\_321\_FM\_Scienti fic\_Doc.pdf
  - DHI (2017b) MIKE ECO Lab. Numerical lab for ecological and agent based modelling. User guide, DHI GROUP, Hørsholm. https://manuals.mikepoweredbydhi.help/2017/ General/MIKE\_ECO\_Lab\_UserGuide.pdf
- Dolmer P, Kristensen PS, Hoffmann E (1999) Dredging of blue mussels (*Mytilus edulis* L.) in a Danish sound: stock sizes and fishery-effects on mussel population dynamic. Fish Res 40:73–80
- Donadi S, Westra J, Weerman EJ, van der Heide T and others (2013) Non-trophic interactions control benthic producers on intertidal flats. Ecosystems 16:1325–1335
  - EMODNET (European Marine Observation and Data Network) (2022) European Marine Observation Data Network (EMODnet) seabed habitats project. www. emodnet-seabedhabitats.eu/ (accessed Jun 2022)
  - Ens BJ, Smaal AC, de Vlas J (2004) The effects of shellfish fishery on the ecosystems of the Dutch Wadden Sea and Oosterschelde: final report on the second phase of the scientific evaluation of the Dutch shellfish fishery policy (EVA II). Alterra-rapport no. 1011, RIVO-rapport C056/ 04, RIKZrapport RKZ/2004.031. Alterra, Wageningen
  - Erichsen AC, Birkeland M (2019) Development of mechanistic models. Mechanistic model for Limfjorden. Hydrodynamic model documentation. Technical note, December 2019. Prepared by DHI Group for the Danish EPA, Hørsholm
  - Erichsen AC, Birkeland M (2020) Development of mechanistic models. Mechanistic model for Limfjorden. Technical documentation on biogeochemical model. Technical note, September 2020. Prepared by DHI Group for the Danish EPA, Hørsholm
- Filgueira R, Brown MS, Comeau LA, Grant J (2015) Predicting the timing of the pediveliger stage of *Mytilus edulis* based on ocean temperature. J Molluscan Stud 81: 269–273
- Fontoura L, D'Agata S, Gamoyo M, Barneche DR and others (2022) Protecting connectivity promotes successful biodiversity and fisheries conservation. Science 375:336–340
  - Freitas PS, Saurel C, Nielsen P, Petersen JK (2019) Hjertemuslinger 2018 bestandsestimat i vestlige Limfjorden. 1-16, notat til Fiskeripolitisk Kontor, Udenrigsministeriet, Kongens Lyngby

- Freitas PS, Nielsen P, Saurel C, Olsen J, Petersen JK (2020) Hjertemuslingers fiskeri i Limfjorden: status og ledelsesanbefalinger. 1-15, notat til Fiskeri, Miljø- og Fødevareministeriet, Kongens Lyngby
- Freitas PS, Saurel C, Olsen J, Petersen JK (2021) Hjertemuslinger fiskeri i Limfjorden: status 2020–2021 sæson og ledelsesanbefalinger. 1-13, notat Jr. 21-1033607 til Ministeriet for Fødevarer, Landbrug og Bæredygtig Fiskeri, Kongens Lyngby
- Gomes I, Peteiro LG, Albuquerque R, Nolasco R, Dubert J, Swearer SE, Queiroga H (2016) Wandering mussels: using natural tags to identify connectivity patterns among marine protected areas. Mar Ecol Prog Ser 552: 159–176
- Grantham BA, Eckert GL, Shanks AL (2003) Dispersal potential of marine invertebrates in diverse habitats. Ecol Appl 13:108–116
  - Hansen FT, Christensen A (2018) Same risk area case-study for Kattegat and Øresund. Final report. DTU Aqua report no. 335-2018, National Institute of Aquatic Resources, Technical University of Denmark, Kongens Lyngby
- Hawkins SJ, Bohn K, Sims DW, Ribeiro P and others (2016) Fisheries stocks from an ecological perspective: disentangling ecological connectivity from genetic interchange. Fish Res 179:333–341
- Heinänen S, Chudzińska M, Mortensen J, Zhi T and others (2018) Integrated modelling of Atlantic mackerel distribution patterns and movements: a template for dynamic impact assessments. Ecol Model 387:118–133
- Hilário A, Metaxas A, Gaudron SM, Howell KL and others (2015) Estimating dispersal distance in the deep sea: challenges and applications to marine reserves. Front Mar Sci 2:6
- Hill AE (1991) Vertical migration in tidal currents. Mar Ecol Prog Ser 75:39–54
  - Huserbråten M, Moland E, Jorde PE, Olsen EM, Albretsen J (2018) Connectivity among marine protected areas, particularly valuable and vulnerable areas in the greater North Sea and Celtic Seas regions. Institute of Marine Research, Flødevigen
  - Implement Consulting Group (2017) International evaluation of the Danish marine models. Performed by the panel of international experts. Report prepared by Implement Consulting Group for the Danish EPA, Hellerup
- Jacobi MN, André C, Döös K, Jonsson PR (2012) Identification of subpopulations from connectivity matrices. Ecography 35:1004–1016
- Jansen T, Hansen FT, Bardarson B (2021) Larval drift dynamics, thermal conditions and the shift in juvenile capelin distribution and recruitment success around Iceland and East Greenland. Fish Res 236:105845
- Jonsson PR, André C, Lindegarth M (1991) Swimming behaviour of marine bivalve larvae in a flume boundarylayer flow: evidence for near-bottom confinement. Mar Ecol Prog Ser 79:67–76
- Jonsson PR, Moksnes PO, Corell H, Bonsdorff E, Nilsson Jacobi M (2020) Ecological coherence of marine protected areas: new tools applied to the Baltic Sea network. Aquat Conserv 30:743–760
- Jonsson PR, Hammar L, Wåhlström I, Pålsson J, Hume D, Almroth-Rosell E, Mattsson M (2021) Combining seascape connectivity with cumulative impact assessment in support of ecosystem-based marine spatial planning. J Appl Ecol 58:576–586
  - Jørgensen BB (1980) Seasonal oxygen depletion in the bot-

tom waters of a Danish fjord and its effect on the benthic community. Oikos 34:68–76

- Josefson AB (2016) Species sorting of benthic invertebrates in a salinity gradient—importance of dispersal limitation. PLOS ONE 11:e0168908
- Josefson AB, Hansen JLS (2004) Species richness of benthic macrofauna in Danish estuaries and coastal areas. Glob Ecol Biogeogr 13:273–288
- Lawlor JA, Arellano SM (2020) Temperature and salinity, not acidification, predict near-future larval growth and larval habitat suitability of Olympia oysters in the Salish Sea. Sci Rep 10:13787
- Lebour MV (1938) Notes on the breeding of some lamellibranchs from Plymouth and their larvae. J Mar Biol Assoc UK 23:119–144
- Lett C, Ayata SD, Huret M, Irisson JO (2010) Biophysical modelling to investigate the effects of climate change on marine population dispersal and connectivity. Prog Oceanogr 87:106–113
- Lett C, Nguyen-Huu T, Cuif M, Saenz-Agudelo P, Kaplan DM (2015) Linking local retention, self-recruitment, and persistence in marine metapopulations. Ecology 96: 2236–2244
- Lindegren M, Gabellini AP, Munk P, Edelvang K, Hansen FT (2022) Identifying key processes and drivers affecting the presence of non-indigenous marine species in coastal waters. Biol Invasions 24:2835–2850
- Lowe WH, Allendorf FW (2010) What can genetics tell us about population connectivity? Mol Ecol 19:3038–3051
- Mahony KE, Lynch SA, Egerton S, Cabral S, de Montaudouin X (2020) Mobilisation of data to stakeholder communities. Bridging the research-practice gap using a commercial shellfish species model. PLOS ONE 15: e0238446
- Malham SK, Hutchinson TH, Longshaw M (2012) A review of the biology of European cockles (*Cerastoderma* spp.). J Mar Biol Assoc UK 92:1563–1577
- Marandel F, Lorance P, Andrello M, Charrier G, Le Cam S, Lehuta S, Trenkel VM (2018) Insights from genetic and demographic connectivity for the management of rays and skates. Can J Fish Aquat Sci 75:1291–1302
- Mertens LEA, Treml EA, von der Heyden S (2018) Genetic and biophysical models help define marine conservation focus areas. Front Mar Sci 5:268
- Meyer J, Kröncke I, Bartholomä A, Heckroth M, Scheiffarth G (2021) Small-scale and long-term variability in population dynamics of the cockle *Cerastoderma edule* in a southern North Sea tidal flat system. Front Mar Sci 8: 698467
- Montoya JM, Solé RV (2002) Small world patterns in food webs. J Theor Biol 214:405–412
- Moutsinas G, Shuaib C, Guo W, Jarvis S (2021) Graph hierarchy: a novel framework to analyse hierarchical structures in complex networks. Sci Rep 11:13943
  - Nielsen P, Nielsen MM, Geitner K, Petersen JK (2018) Konsekvensvurdering af fiskeri af blåmuslinger og søstjerner i Løgstør Bredning 2017/2018. DTU Aqua-rapport nr. 330-2018, Institut for Akvatiske Ressourcer, Danmarks Tekniske Universitet, Kongens Lyngby
- Nielsen P, Nielsen MM, McLaverty C, Kristensen K and others (2021) Management of bivalve fisheries in marine protected areas. Mar Policy 124:104357
- Nolasco R, Gomes I, Peteiro L, Albuquerque R and others (2018) Independent estimates of marine population connectivity are more concordant when accounting for

uncertainties in larval origins. Sci Rep 8:2641

- Nolasco R, Dubert J, Acuña JL, Aguión A and others (2022) Biophysical modelling of larval dispersal and population connectivity of a stalked barnacle: implications for fishery governance. Mar Ecol Prog Ser 694:105–123
  - Ospina-Alvarez A, de Juan S, Davis KJ, González C, Fernández M, Navarrete SA (2020) Integration of biophysical connectivity in the spatial optimization of coastal ecosystem services. Sci Total Environ 733:139367
- Paris CB, Cowen RK (2004) Direct evidence of a biophysical retention mechanism for coral reef fish larvae. Limnol Oceanogr 49:1964–1979
- Pastor A, Larsen J, Hansen FT, Simon A, Bierne N, Maar M (2021) Agent-based modeling and genetics reveal the Limfjorden, Denmark, as a well-connected system for mussel larvae. Mar Ecol Prog Ser 680:193–205
- Pastor A, Ospina-Alvarez A, Larsen J, Hansen FT, Krause-Jensen D, Maar M (2022) A network analysis of connected biophysical pathways to advice eelgrass (*Zostera marina*) restoration. Mar Environ Res 179:105690
- Philippart CJM, van Aken HM, Beukema JJ, Bos OG, Cadée GC, Dekker R (2003) Climate-related changes in recruitment of the bivalve *Macoma balthica*. Limnol Oceanogr 48:2171–2185
- Puckett BJ, Eggleston DB, Kerr PC, Luettich RA Jr (2014) Larval dispersal and population connectivity among a network of marine reserves. Fish Oceanogr 23:342–361
  - R Core Team (2021) R: a language and environment for statistical computing. R Foundation for Statistical Computing, Vienna. https://www.R-project.org/
- Robins PE, Neill SP, Giménez L, Jenkins SR, Malham SK (2013) Physical and biological controls on larval dispersal and connectivity in a highly energetic shelf sea. Limnol Oceanogr 58:505–524
- Ross RE, Nimmo-Smith WAM, Howell KL (2017) Towards 'ecological coherence': assessing larval dispersal within a network of existing marine protected areas. Deep Sea Res I 126:128–138
- Rossi V, Ser-Giacomi E, López C, Hernández-García E (2014) Hydrodynamic provinces and oceanic connectivity from a transport network help designing marine reserves. Geophys Res Lett 41:2883–2891
- Rosvall M, Bergstrom CT (2008) Maps of random walks on complex networks reveal community structure. Proc Natl Acad Sci USA 105:1118–1123
- Shanks AL, Grantham BA, Carr MH (2003) Propagule dispersal distance and the size and spacing of marine reserves. Ecol Appl 13:159–169
- Swearer S, Treml EA, Shima JS (2019) A review of biophysical models of marine larval dispersal. Oceanogr Mar Biol Annu Rev 57:325–356
- Theuerkauf SJ, Puckett BJ, Eggleston DB (2021) Metapopulation dynamics of oysters: sources, sinks, and implications for conservation and restoration. Ecosphere 12: e03573
- Treml EA, Halpin Urban DL, Pratson LF (2008) Modelling population connectivity by ocean currents, a graph-theoretic approach for marine conservation. Landsc Ecol 23: 19–36
- Treml EA, Roberts JJ, Chao Y, Halpin PN, Possingham HP, Riginos C (2012) Reproductive output and duration of the pelagic larval stage determine seascape-wide connectivity of marine populations. Integr Comp Biol 52:525–537
- Treml EA, Ford JR, Black KP, Swearer SE (2015) Identifying the key biophysical drivers, connectivity outcomes, and

metapopulation consequences of larval dispersal in the sea. Mov Ecol  $3{:}17$ 

- Troost K, Kamermans P, Wolff W (2008) Larviphagy in native and an introduced oyster. J Sea Res 60:157–163
- Truelove NK, Kough AS, Behringer DC, Paris CB, Box SJ, Preziosi RF, Butler MJ IV (2017) Biophysical connectivity explains population genetic structure in a highly dispersive marine species. Coral Reefs 36:233–244
  - Tyler-Walters H, Hiscock K (eds) (2021) Marine life information network: biology and sensitivity key information review database [online]. Marine Biological Association of the United Kingdom, Plymouth. www.marlin.ac.uk
- van Sebille E, Griffies SM, Abernathey R, Adams TP and others (2018) Lagrangian ocean analysis: fundamentals

Editorial responsibility: Susanne E. Tanner (Guest Editor), Lisbon, Portugal Reviewed by: H. Queiroga and 2 anonymous referees and practices. Ocean Model 121:49-75

- Vera M, Maroso F, Wilmes SB, Hermida M and others (2022) Genomic survey of edible cockle (*Cerastoderma edule*) in the northeast Atlantic: a baseline for sustainable management of its wild resources. Evol Appl 15:262–285
- Visser AW (1997) Using random walk models to simulate the vertical distribution of particles in a turbulent water column. Mar Ecol Prog Ser 158:275–281
- Watson JR, Mitarai S, Siegel DA, Caselle JE, Dong C, McWilliams JC (2010) Realized and potential larval connectivity in the Southern California Bight. Mar Ecol Prog Ser 401:31–48
- Zippay ML, Helmuth B (2012) Effects of temperature change on mussel, *Mytilus*. Integr Zool 7:312–327

Submitted: June 15, 2022; Accepted: March 21, 2023 Proofs received from author(s): June 9, 2023