

Trends and fluctuations in populations are determined by complex interactions between extrinsic forcing and intrinsic dynamics. For example, stochastic recruitment can induce low-frequency variability, i.e. cohort resonance, which can induce apparent trends in abundance and may be common in age-structured populations; such low-frequency fluctuations can potentially mimic or cloak critical variation in abundance linked to environmental change, overexploitation or other types of anthropogenic forcing (Bjrnstad, 2004). Although important, these effects can be difficult to disentangle. The simulations so far show that life histories are important and should be used to help condition operating models to ensure robust feedback-control rules. MSE is important to help develop these robust feedback control rules and to help identify appropriate observational systems. Although the performance of the HCR depended on the life-history characteristic, it was not in the way initially expected, i.e. the outcomes could not be grouped solely by whether the Operating Models (OMs) represented fast growing vs. late maturing species or demersal vs. pelagic stocks. What was important was the nature of the dynamics, i.e. how variable was the stock between years; for example, a stock could exhibit high interannual variability if natural mortality and recruitment variability was high, regardless of the values of  $k$ ,  $L_{inf}$ ,  $L_{50}$ . The nature of the indices is also important; for example, even if a stock had low interannual variability, an index could be highly variable if it was based on juveniles or there were large changes in spatial distribution between years. It is therefore necessary to look at the robustness of HCRs to the nature of the time-series of the stock (as represented by the OM) and to the characteristics of the data collected from it (as represented by the Observation Error Model). This will require tuning by constructing a reference set of OMs and then tuning the HCR to secure the desired trade-offs. The work so far can be considered as focusing first on developing HCR that perform satisfactorily for a reference set, the next step is to develop case-specific HCRs.

8 Aspects to consider for the 3.2.1 rule by the next meeting would be:

- 8.1 Investigating the impact of relative weighting of the  $r$ ,  $f$  and  $b$  components of the rule on the performance of the rule;
- 8.2 Investigating more extensively the time-lag properties of the  $r$  component, including alternative formulations;
- 8.3 Setting of appropriate reference levels in the  $f$  and  $b$  component of the rules, and the extent to which this could be done with tuning that depends on life-history traits and/or the nature of the time-series;
- 8.4 Investigation of the use of trends in an index without a reference level.

8 Longer term aspect to consider for data-limited rules:

- 9.1 Focusing on the nature of time-series and developing diagnostics that could help determine the rules that would work well under alternative characterisations of the nature of the time-series, and aspects such as quality of data used by the rules (and hence ability to detect signals), ability to set appropriate reference points, etc.;
- 9.2 Linking life-history traits, the form of density-dependence and fishery characteristics (e.g. including fishery selectivity) to the nature of resulting time-series;
- 9.3 Develop guidance for use of catch rules by linking (a) and (b);
- 9.4 Avoiding the shot-gun approach to simulation testing e.g. by making more extensive use of sensitivity (elasticity) analysis to highlight factors that are most important in determining the time-series behaviour of stocks;
- 9.5 Investigating the implications of how the operating models are set up (fishing history, depletion levels, selectivity assumptions, mortality) on the behaviour of the stock and on the performance of the catch rule.

Supply of Research Services to establish MSY proxies for  
data-limited stocks (2017-18) to the Marine Institute, Rinville,  
Oranmore, Co. Galway. (Ref: ITT17-015)

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**SUMMARY**

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## 1. The Call

The overall aim of the project is to develop and test a range of assessment models and methods to establish MSY reference points (or proxy MSY reference points) across the spectrum of data-limited stocks. There is a requirement for the following research services over a 24 months period between May 2017 and April 2019:

**Task 1: *Stock prioritisation*** A number of example stocks have been identified (**Table 3.**). The final list of stocks will be prioritised using criteria like: economic value of the stock; importance of the species to the ecosystem (key-stone species); sensitivity to the impacts of fishing; available data.

**Task 2: *Data collation*** To run in parallel with other tasks. The project relies on existing data sets, however these data need to be collated in a usable form. Most datasets are available from the Marine Institute, or are publicly available, but others may only exist in other European labs/agencies.

**Task 3: *Method and simulation framework development and implementation*** A number of data-limited methods exist. In order to compare the performance of these methods it would be useful to implement them all in the same framework, e.g. R. New methods may also be developed in the same framework.

**Task 4: *Method performance appraisal*** Develop a set of diagnostics that can be applied across range of models. Also assess the stability of the model, sensitivity to assumptions and bias in the advised catch.

**Task 5: *Reference point comparisons*** Once reference points have been identified, their performance should be evaluated through simple management strategy evaluations.

**Task 6: *Liaison with Marine Institute*** The service provider is expected to meet on a regular basis with Marine Institute staff involved in the project: Monthly update meetings at the Marine Institute premises in Oranmore Galway

**Task 7: *Linkage with other projects*** The service provider is required to link research output to the following projects:

- The International Council of the Exploration of the Sea (ICES) is in the process of developing methods to identify MSY proxy reference points for data-limited stocks (WKLIFE and WKPROXY series of workshops). The service provider is required to contribute to this process by proposing and testing new assessment models and methods of establishing reference points and will be expected to attend up to 4 one-week meetings at ICES headquarters in Copenhagen. However there are key differences with the ICES approach: This research contract will include stocks not currently assessed by ICES; this research contract will focus on the available data for each stock first and on the methods second; the ICES approach focuses on the methods first and then applies a limited number of methods to a large number of stocks.
- Marine Institute research and development on data poor stocks which includes the biology, stock dynamics and Management Strategy Evaluation (MSE) for Pollock. It is expected that the service provider will collaborate closely with the team developing assessment methods for the pollock stock.
- Galway Mayo Institute of Technology GMIT had been awarded a Cullen fellowship for a PhD project on management strategy evaluation for monkfish. It is expected that the Cullen PhD

and service provider will closely collaborate on tasks like data collation, assessment model implementation, simulation model development and management strategy evaluation.

## 2. Project Plan

The principles of the European Union Common Fisheries Policy (CFP), which has driven the management of Europe's common fisheries resources since 1983, are to manage the activities of fishing fleets aims to ensure sustainable exploitation of the ocean's living resources, the provision of important food resources to humankind, and the profitability of an industry that is an important economic and social activity in many areas of Europe and elsewhere. The overall aim of the project is to support the CFP by developing and testing a range of assessment models and methods to establish MSY reference points (or proxy MSY reference points) across the spectrum of data-limited stocks.

Quantitative scientific advice is at the heart of fisheries management regulations, providing estimates of the likely current and future status of fish stocks through statistical population models, termed stock assessments, but also probabilistic comparisons of the expected effects of alternative management procedures. Management Strategy Evaluation (MSE) uses stochastic simulation to incorporate both the inherent variability of natural systems, and our limited ability to model their dynamics, into analyses of the expected effects of a given management intervention on the sustainability of both fish stocks and fleets.

Following the adoption of the precautionary approach [PA, [Garcia, 1996](#)] by many fisheries organisations, biological reference points have become central to management. Reference points are used as targets to maximise surplus production and limits to minimise the risk of depleting a resource to a level where productivity may be compromised. They must integrate biological processes such as growth, recruitment, mortality and connectivity into indices for productivity and spawning reproductive potential [[Kell et al., 2015b](#)] to provide limits and targets for exploitation. They are increasingly required for by-caught, threatened, endangered, and protected species where data and knowledge are limited, not just for the main commercial stocks, where analytical assessments are available [[Sainsbury and Sumaila, 2003](#)].

A main objective of reference points is to prevent overfishing, e.g. growth, recruitment, economic and target overfishing. Growth and recruitment overfishing are generally associated with limit reference points, while economic overfishing may be expressed in terms of either targets or limits. The difference between targets and limits is that indicators may fluctuate around targets but in general limits should not be crossed. Target overfishing occurs when a target is overshoot, although variations around a target is not necessarily considered serious unless a consistent bias becomes apparent. In contrast even a single violation of a limit reference point may indicate the need for immediate action. Therefore to achieve MSY requires limit as well as target reference points.

## 2.1 Workplan

A variety of reference points and methods for deriving them are used for both data rich and poor stocks. In a data rich situation reference points may be derived directly from a stock assessment model, e.g. in a biomass dynamic model where  $MSY$  is a function of the estimated parameters ( $r$  and  $K$ ); ad-hoc approaches when using age methods such as Virtual Population Analysis, where assumptions about the stock recruitment relationship and future selection and biological parameters have to be made after fitting the assessment model; or in a state space formulation [Nielsen and Berg, 2014] which actually estimates a prediction mechanism and reference points.

In data poor situations a wide variety of statistical methods have been used or proposed to estimate stock status, productivity, fishing rates and reference points, for example using samples of length-composition [Kokkalis et al., 2015, Prince et al., 2015], age-composition [Thorson and Cope, 2015], fishery catch and fishing effort data [Roa-Ureta et al., 2015], abundance indices [Needle, 2015] or simple length-based reference points [Cope and Punt, 2009]. Before being able to make management recommendations, a link between a trigger reference point and stock status has to be identified, e.g. so a harvest control rule (HCR) can be used to link removals to the current state of the resource [Restrepo and Powers, 1999]. Cope and Punt [2009] proposed a way to do this for catch-based length indicators, using a decision tree and a risk assessment. This approach could be used for a range of indicators. However, [Cope and Punt, 2009] also noted that a full examination of such an approach requires a management strategy evaluation.

In an MSE setting reference points are tuned (i.e. chosen) to meet management objectives. Harvest strategies (i.e. HCRs) can either be model based or empirical Dowling et al. [2015], in the former a stock assessment is used to estimate stock status and reference points while in the later management is based on trends in the data directly. The Commission for the Conservation of Southern Bluefin Tuna (CCSBT) provides a model-free example of a MP [Hillary et al., 2015] that is based on year-to-year changes and trends in empirical indicators (i.e. CPUE and fisheries independent indices); reference levels are then tuned to meet management objectives using MSE, where tuning refers to adjusting the parameters of the MP to try and achieve the stated objectives represented by the OM. Model-based MPs, for example those based on a stock assessment model, may include the estimation of  $MSY$ -based reference points, but the values of  $F$ ,  $F_{MSY}$ ,  $B$  and  $B_{MSY}$  from the OM do not need to be equivalent to their proxies in the MP (e.g. if a stock assessment models used in the MP is structually different from that used to condition the OM).

WKLIFE was tasked with developing operational methods for setting proxy reference points for stocks where survey based assessments indicate trends (category 3) and for which reliable catch data are available (category 4). Methods so far examined include length-based indicators, spawning potential ratio (SPR), catch and cpue, and catch only based methods. These methods are now being implemented by the ICES study group WKPROXY, and along with others [Thorson et al., 2015, Carruthers et al., 2014], will be first evaluated using simulation, e.g. using crosstesting where a data rich stock assessment is used to generate data and then fitted to a data poor model and estimates of stock status compared. This approach requires a data rich assessment and that the stock assessment represents the stock dynamics. Alternatively life history theory and relationships can be used to simulate stocks and fisheries for a variety of hypotheses about their dynamics, i.e. using the FLife package [see Rosenberg et al., 2014]. To ensure a management advice framework based on a stock assessment and reference points (i.e. a control system) is robust requires showing that it still functions correctly in the presence of uncertainty or stressful environmental conditions [Radatz et al., 1990]. This requires an Operating Model (OM, i.e. a simulation model that represents hypotheses about resource dynamics) conditioned

on ecological processes that affect the behaviour of management systems, i.e the focus is on the future, not on fitting historical data as when conditioning an OM on a stock assessment. This is a less data, and more hypothesis-orientated approach [Kell et al., 2006a].

To conduct MSE requires six steps [Punt and Donovan, 2007]; namely

**Identification** of management objectives and mapping these to performance measures to quantify how well they are achieved

**Selection** of hypotheses about system dynamics for building **Operating Models** (i.e. Simulation Models)

**Building** the simulation models, i.e. conditioning them on data and knowledge, and rejecting and weighting different hypotheses.

**Identifying** alternative management strategies, (i.e. the combination of pre-defined data, stock assessment methods, reference points and HCRs).

**Running** the simulations using the HCRs as feedback control procedures; and

**Agreeing** the Management Strategies that best meet management objectives.

The MSE will be conducted using FLR<sup>1</sup> [Kell et al., 2007] a family of packages in R for conducting MSE and stock, following the tasks below. Task 1 will help identify stocks and management objectives; Task 2 will allow the OMs to be conditioned; Task 3 will allow the OM to be implemented and pseudo data simulated to evaluate the proposed stock assessment methods and reference points; Task 4 will screen the candidate stock assessment methods (both those considered by WKLIFE but others to ensure that methods are state-of-the-art); and Task 5 will conduct MSE. Task 6 will ensure that the project delivers tools that make a major contribution to the management of data poor stocks; and Task 7 will help in dissemination, and ensure that methods developed tested across a wide range of case studies.

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<sup>1</sup><http://www.flr-project.org/>

## 2.2 Tasks

### 2.21 Task 1: Stock prioritisation ([Laurie](#))

*A number of example stocks have been identified. The final list of stocks will be prioritised using criteria like: economic value of the stock; importance of the species to the ecosystem (key-stone species); sensitivity to the impacts of fishing; available data.*

The final choice of stock will be made after the award of the contract based on their economic, social and ecological importance but also to reflect a contrasting range of life histories, fisheries and datasets. We will however focus on the following stocks:

- Sprat in the Celtic Sea and West of Scotland Sprat (Sub-area VI & Divisions VIIa-c and f-k)
- Grey gurnard VI & VII (excl. VIId)
- Ling IIIa, IVa, VI, VII, VIII, IX, XII, and XIV
- Rays, primarily in areas VIIa,f,g
- John dory in ICES Sub-area VII and Divisions VIIa,b and d (Northeast Atlantic)
- In collaboration with Newport STO:
  - Saithe VII, VIII, IX, X
  - Pollock VII
- Turbot VIIe,f,j,h and sub area VIII and IXa
- Brill VII (or suitably defined)

A meta-database will be created identifying the data sources and relevant publications for the potential stocks of interest but also for related stocks and species. A reason for considering related stocks and species is because it is possible to compare the performance of data poor and data rich methods using cross-testing. In a cross-test data and population estimates from a data rich assessment are used to simulate data poor datasets which can then be used to test data poor assessment methods, allowing candidate methods to be identified. While a Robin Hood approach can be used to take information from data rich stock to inform assessments of information poor species, i.e. taking from the rich to help the poor. Since similarities in taxonomy, life-history or ecology allows the information from data-rich stocks to be utilised as prior distributions or penalty functions for the data poor species. Hierarchical Bayesian methods allow poor-data species to borrow strength from species with good-quality data. [Jiao et al. \[2011\]](#) for example used hierarchical Bayesian state-space surplus production models and showed estimates were considerably more robust than those of the nonhierarchical models.

Once the meta-database has been prepared (end of month 1) then a list of study stocks will be agreed, following which a database will be designed and an attempt to acquire the data made, following which the final list will be agreed (end of month 2).

### 2.22 Task 2: Data collation ([Laurie](#))

*Data collation (to run in parallel with other tasks) The project relies on existing data sets, however these data need to be collated in a usable form. Most datasets are available from the Marine Institute, or are publicly available, but others may only exist in other European labs/agencies.*

Datasets will include, stock assessment datasets (ICES, NAFO, STECF<sup>2</sup>, ...), fisheries, life history parameters (Fishbase<sup>3</sup>, fishnets<sup>4</sup>), surveys (MI), commercial sampling sets (MI), and economic data (e.g. BIM).

Life history data will also be compiled since many studies have shown the relationships between life history traits for processes such as growth, maturity and natural mortality. Life history has also been used to develop priors in stock assessments for difficult to estimate parameters. e.g. the population growth rate ( $r$ ) in data poor assessments. Life history parameters can also be used to develop an Operating Model.

The meta-database will be extended with code to read the data into a common format, e.g. data frames and other objects in R and FLR to model stocks, populations and fisheries. It is important to ensure that data are easily available and that any processing steps are well documented and standardised this is true for both the basic data and the results from the MSE (e.g. datasharing<sup>5</sup>). s.

### 2.23 Task 3: Framework Development ([Laurie](#))

*Method and simulation framework development and implementation A number of data-limited methods exist. In order to compare the performance of these methods it would be useful to implement them all in the same framework, e.g. R. New methods may also be developed in the same framework.*

All methods will be implemented in R and be compatible with The Fishery Library in R (**FLR**) [[Kell et al., 2007](#)], a project that has for the last ten years been building an extensible toolset of statistical and simulation methods for quantitative fisheries science, with the overarching objective of enabling fisheries scientists to carry out analyses of management procedures in a simplified and robust manner through the MSE approach.

**FLR** has become widely used in many of scientific bodies providing fisheries management advice, both in Europe and elsewhere. The evaluation of the effects of elements of the revised CFP, the analysis of the proposed fisheries management plans for the North Sea, or the comparison of management strategies for Atlantic tuna stocks, among others, have used the **FLR** tools to advice managers of the possible courses of action to favour the sustainable use of many marine fish stocks.

The **FLR** toolset is currently composed of a variety of packages, covering the various steps in the fisheries advice and simulation workflow. They include a large number of S4 classes, and more recently Reference Classes, to model the data structures that represent each of the elements in the fisheries system. Class inheritance and method overloading are essential tools that have allowed the **FLR** packages to interact, complement and enrich each other, while still limiting the number of functions an user needs to be aware of. Methods also exist that make use of R's parallelization facilities and of compiled code to deal with complex computations.

Using **FLR** means that advantage can be taken of existing methods, and that dissemination and support is easier and will be maintained after the life of the project. Under the project development will be on mainly on four packages **FLife**, **mpb**, **hcr** and **oem**. In addition new methods will be added to other **FLR** packages as appropriate.

**FLife** is a package for modelling life history relationships, e.g. for developing priors, estimating quantities such a Z from length data, deriving reference points and indicators and for creating OMs.

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<sup>2</sup><https://stecf.jrc.ec.europa.eu/dd/medbs/ram>

<sup>3</sup><http://www.fishbase.org/search.php>

<sup>4</sup><https://github.com/fishnets/fishnets>

<sup>5</sup><https://github.com/AdrianHordyk/datasharing>



**mpb** is a package for modelling biomass dynamic based management procedures, it has also been used to assess a variety of stocks, e.g. Atlantic bigeye and North Atlantic albacore and swordfish. It also forms the basis of the North Atlantic albacore MP evaluated using MSE.

**hcr** will be a new package that will include a variety of empirical HCRs, e.g. those used by CCSBT, proposed by ICES and from a review of the literature [e.g. Pomaredé et al., 2010].

**oem** will be a new package that implements a variety of observation error models, that will be used to simulate a variety of datasets from OMs that will be used by the data poor methods.

In addition Dr Kell is the developer of two packages that are used to provide a common set of diagnostics across stock assessment methods (**diags**) and to summarise stock status relative to reference points and for summarising the results from MSE (**kobe**)

There are a variety of R packages, that already implement a variety of data poor methods, e.g. <https://github.com/quang-huynh/MLZ>, <https://github.com/AdrianHordyk/LBSPR> <https://github.com/cran/DLMtool> wherever possible these packages will be used and we will collaborate with their developers.

#### 2.24 Task 4: Method Performance Appraisal (Laurie)

**Method performance appraisal** *Develop set of diagnostics that can be applied across range of models. Also assess the stability of the model, sensitivity to assumptions and bias in the advised catch.*

A range of summary statistics will be required to illustrate trade-offs between multiple potentially conflicting objectives. Although there are many potential summary statistics so that decision makers can choose between tangible options on the basis of actual projections rather than abstract concepts and performance statistics, however, should ideally be few, informative and based axes such as stock status, 'safety', 'stability' and 'yield'. It is also necessary to distinguish between technical summary statistics (i.e. those required to evaluate model fits and performance) and those required to evaluate management objectives.

Results will be presented using an interactive app, based on shiny, that can be used to evaluate the performance of the models.

#### 2.25 Task 5: Reference Point Comparisons (Laurie, C  il  n)

**Reference point comparisons (across candidate methods)** *Once reference points have been identified, their performance should be evaluated through simple management strategy evaluations.* A set of appropriate stock assessment models will be fit to the available data (Task 1 and 2). Methods used will reflect the available data on a stock-by-stock basis (Task 2) and also methods available or developed in Tasks 3 and 4. Performance diagnostics (e.g., residual inspection, retrospective patterns) will be run for each assessment model fit.

We will provide a review of reference points and indicators, based on a variety of assumptions, e.g. MSY based on biomass dynamic stock assessment models, and indicators such as  $L_{opt}$ ,  $L_{50}$  and  $L_{mega}$  for length-based methods. Then compare these using simulation, e.g. cross-testing and simulations based on FLife. This will allow the power of the methods to detect whether a stock has achieved its targets and avoid its limits. Based on this screening process a set of candidate reference points and assessment methods will be proposed for MSE.

MSE will include a Value-of-information analysis, where the benefits of collecting better data and new information will be evaluated.

## 2.26 Task 6: Liaison with Marine Institute (C  il  n, Laurie, Laurie)

*The service provider is expected to meet on a regular basis with Marine Institute staff involved in the project: Monthly update meetings at the Marine Institute premises in Oranmore Galway*

The proposal is ambitious but achievable. However there needs to be good communication between the consortium and the Marine Institute to ensure the project keeps focused and delivers. Therefore we will arrange monthly face-to-face meetings, make all code, data and results available on the cloud and in a suitable repository (e.g. github) and provide a web based interface for model results.

Wider project 6-monthly progress reports and meetings at the Marine Institute will ensure the overarching goals of the project are achieved.

## 2.27 Task 7: Linkage with other Projects (C  il  n)

- Monkfish

This project will develop in close collaboration with the Cullen Fellowship of Mr Luke Batts, co-supervised by Dr Hans Gerritsen (MI) and Dr C  il  n Minto (GMIT). Active collaboration will occur with Tasks 3–5, as these are similarly proposed in the Cullen Fellowship where they are applied specifically to *Lophius budegassa* and *Lophius piscatorius* stocks in ICES areas VII–VIII.

- Pollock

Active collaboration exists between GMIT and the Newport Research Cluster (e.g., *Unlocking the Archive* project). Further collaboration and linkages will be built around data-poor assessment of pollock (liaising with the dedicated Scientific and Technical Officer working on pollock at the Furnace research facility). Both visits to Newport and group attendance at the monthly meetings will facilitate collaboration and crossover.

- DRuMFISH project

The project will also link with the DGMARE project: “Study on approaches to management for data-poor stocks in mixed fisheries (DRuMFISH)” to which GMIT is a partner in the consortium. Methodological development from DRuMFISH (e.g., hierarchical methods) will be directly relevant to the present proposal.

- CPV codes 71354500-9 Marine survey services 73112000-0 Marine research services 90712300-4 Marine conservation strategy planning 98360000-4 Marine services 77700000-7 Services incidental to fishing 73000000-2 Research and development services and related consultancy services 73110000-6 Research services 73200000-4 Research and development consultancy services 73210000-7 Research consultancy services.

- There are also other projects worldwide that can be link to e.g. the global group on stock assessment methods and the tRFMO MSE WG.

### ***2.3 Project Management and Milestones***

To achieve the goals of the project requires good communication between the consortium and the Marine Institute. Therefore we will arrange monthly face-to-face meetings and 6 monthly meetings throughout the lifetime of the project. In addition all code will be available via a repository such as github, databases will be accessible via the cloud and we provide a web based interface (such as a shiny app) for model results.

The 6 monthly meetings, i.e. kick-off, 6<sup>th</sup> month, 12<sup>th</sup> month and the final meeting will provide the milestones. Outputs will include working papers for the two ICES groups WGCSE, and WKPROXY. These will document the methods and also present case study applications which will be agreed at the 6 monthly meetings and developed on the cloud. To help with this a wiki will be used.

### 2.31 Task Summary

A full break down of tasks is given below. Each task is assigned to a lead who will take responsibility for delivery, however, the task overlap and members of the consortium will be involved across the range of tasks as required, see figure ??.

#### Task 1 Stocks (Laurie)

- Identify management objectives and current reference points.
- Create a meta-database, that will identify data sources and allow case studies to be chosen.
- The meta-database should include related species and stocks, as well as those listed below, to allow OM to be conditioned, cross-testing to be conducted and priors to be developed.

#### Task 2 Data (Laurie)

- Design a DB to hold the data referred to in the meta-database
- Develop R/SQL scripts to access and read the data
- Develop tools to summarise, check the data and conduct meta-analyses.
- Summarise the error structure of the data series to allow a variety of OEM to be implemented
- Develop tools to help in conditioning OMs

#### Task 3 Framework (Laurie)

- Review appropriate assessment methods, used by ICES and Regional Fisheries Management Organisations
- Identify code and R packages
- Implement methods as required in R using S4 classes and methods and packages such as TMB, Stan, Bugs.
- Develop OMs based on life history and/or data rich stocks
- Develop OEMs for the range of data (e.g. CPUE, catch, length, size composition) used in the data poor assessments.

#### Task 4 Methods (Laurie)

- Compare methods to determine data and information needs, e.g. using simulation without feedback control to conduct power analyses where the probabilities of achieving targets and avoiding limits is evaluated.

#### Task 5 Reference Points (Laurie)

- Fit and compare appropriate stock assessments that reflect the available data (Task 2) and methods developed (Tasks 3 and 4)
- Run MSE using the OM, OEM and MPs based on Task 4.
- Conduct a Value-of-Information analysis, i.e. what are the benefits of reducing CVs or collecting alternative data series

#### Task 6 Liason (C  il  n)

- Monthly meetings to monitor progress and get feedback .
- Six monthly meetings to review progress and agree next stage of work.
- Attendance at ICES WGs to provide advice and obtain feedback.

#### Task 7 Other Projects (C  il  n)

Active collaboration will be developed and maintained with the following ongoing projects

- Pollock assessment and MSE at Newport
- Cullen fellowship on Monkfish MSE
- DRuMFISH project on data-poor stock assessment in mixed fisheries

## 2.4 Outputs

*The expected outputs are a collection of existing and new assessment models for data-limited stocks, all implemented in the same framework (e.g. R) with a set of diagnostic tools that can be applied to all models.*

Methods will be implemented as R packages and/or methods; this will include full documentation, online help vignettes and tests. As well as conducting cross-testing to validate models a full set of diagnostic tools will be provided, including checks for convergence using methods such as likelihood profiling; identification of violation of assumptions by checking residuals to fits using the **diags** package; and use methods such as the jack knife or bootstrap to identify problems with the data and model specifications; and conduct hindcasting to evaluate prediction ability [Kell et al., 2016a].

*A set of proposed reference points for a range of stocks with associated management strategy evaluations to contribute to sustainable management of these stocks.*

We will review the reference points currently used in the management of stocks under the CFP and estimated by ICES, in addition we will review reference points used elsewhere by other management bodies and RFMOs. Then compare datapoor and traditional target and limit reference points using crosstesting, in consultation with the Marine Institute and ICES WGs we will come up with a set of candidate reference points, classified by data requirements, and evaluate these using MSE.

*Working documents describing the methods and findings to relevant ICES groups (e.g WGCSE; WKPROXY).*

Dr Kell will attend the Methods related WGs to develop the novel approaches, while Dr Alexander Tidd will attend stock assessment WGs to present applications. All papers will be coauthored with Galway-Mayo Institute of Technology and Marine Institute staff.

*Publication(s) in peer-reviewed journals on new methods/tools/evaluations.*

There are a variety of manuscripts that the project will produce, i.e. on new methods, applications, and a potential review of the relative value-of-information to the value-of-Control.

## 2.5 Deliverables

**Data** Case study data

**Meta-database** identifying data sources for candidate stocks, this will be updated through the life of the project and be made available via the web as a living document.

**Stock database** to hold the data required to condition the OMs and to parameterise the OEM, with tools for analysis and summary.

**Summary database** For performance statistics from the MSE.

**R Packages** These will form part of the **FLR** family of packages

**FLCore** will be updated to include data poor methods as appropriate; in particular the following packages

**kobe** Package with methods for summary statistics

**diags** Package for stock assessment diagnostics

**FLife** Package for simulation based on life histories, e.g. for conditioning OMs

**mpb** Package for management procedures based on biomass based methods

**hcr** Package for empirical MPs

**oem** Observation error models.

**Dissemination ICES WGs** Attendance at WGCSE and WKPROXY

**Web based tools** Shiny app to summaries results

**Manuscripts** A folio of papers will be agreed at the 1st 6 montly meeting, this will include at least 1 paper each on

**Paper 1** Methods

**Paper 2** Applications and

**Paper 3** Review, e.g. of the relative value-of-infomation and control.

### 3. Tables

tablePreliminary list of stocks

Species	TAC	Commercial Catch	Data	Comments
Sprat	No	Targeted species for small fleet	Poor; mainly landings weights	Key-stone prey fish
Gurnards	No	Nearly 100% discarded	Reasonable discard and survey data. No age data	Key-stone prey widely distributed and abundant
Saithe Pollock Ling	Yes	Mixed fishery	Some port sampling, observer and survey data. Very limited age data	Key-stone predator
Rays Skates	Yes	Targeted and mixed fishery	Some port sampling, observer and survey data. No age data	Sensitive species slow reproduction
John Dory	No	Mixed fishery but can be targeted to an extent	Some port sampling, observer and survey data. No age data	Sensitive species valuable non-TAC species (not protected by fisheries management)
Turbot Brill	No	Mixed fishery but can be targeted to an extent	Some port sampling, observer and survey data. Very limited age data	Sensitive species valuable non-TAC species (not protected by fisheries management)



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## 4. Appendices

## GMIT tax clearance certificate