

Mathematical models for sustainable fisheries management in U.S. waters: Balancing economic growth and conservation

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Abstract

Sustainable fisheries management is critical for balancing the dual objectives of economic growth and environmental conservation, particularly in U.S. waters where overfishing, habitat degradation, and fluctuating marine ecosystems pose significant challenges. This review explores the role of mathematical models in addressing these challenges and guiding fisheries management decisions. Various models, including population dynamics, bioeconomic, and ecosystem-based approaches, are examined for their utility in setting sustainable catch limits, assessing stock health, and predicting ecosystem changes. Through case studies of U.S. fisheries, the paper highlights how these models have been implemented within the framework of federal regulations, such as the Magnuson-Stevens Act, to achieve sustainable yields while supporting economic growth. The review also identifies trade-offs between short-term economic gains and long-term conservation goals, emphasizing the need for adaptive management strategies. Finally, it explores emerging innovations in mathematical modeling techniques, such as artificial intelligence, and provides policy recommendations to enhance the integration of these models into sustainable fisheries management. This paper underscores the importance of mathematical models as essential tools in ensuring the future viability of U.S. fisheries, balancing economic prosperity with the preservation of marine ecosystems.

Keywords: Mathematical models; Sustainable fisheries; Management; U.S.; Waters; Balancing; Economic growth; Conservation

1. Introduction

1.1. Overview of Sustainable Fisheries Management

Sustainable fisheries management (SFM) plays a pivotal role in maintaining the delicate balance between economic growth and conservation of marine ecosystems. The core objective of SFM is to ensure that fish stocks are harvested at biologically sustainable levels, preserving the long-term productivity of marine resources while simultaneously supporting economic livelihoods (Garcia & Charles, 2021). In the context of U.S. waters, sustainable management is especially crucial due to the country's vast Exclusive Economic Zone (EEZ), which supports a variety of fisheries that are essential for both national food security and international trade (NOAA Fisheries, 2020).

SFM practices are designed to prevent overfishing, which can lead to the depletion of fish stocks and irreversible damage to marine ecosystems. The concept of maximum sustainable yield (MSY) is often applied, where fishing limits are set based on scientific assessments to ensure that populations remain at sustainable levels (Hilborn & Ovando, 2020). In U.S. waters, regulatory frameworks such as the Magnuson-Stevens Fishery Conservation and Management Act have

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been instrumental in implementing SFM, mandating science-based decision-making and ecosystem-based management approaches (Link & Browman, 2014).

Figure 1 illustrates the cyclical process involved in sustainable fisheries management, highlighting the interconnected roles of data collection, assessment, and management. It begins with observers collecting data on fish stocks, which scientists then use to assess the health of fish populations. Managers utilize these assessments to establish regulations, ensuring that fishing practices are sustainable. Fishermen contribute by supporting science and management efforts, completing the cycle of data-informed decision-making. This continuous process ensures that fishing activities are regulated based on scientific data, promoting the long-term health of marine ecosystems and fisheries.

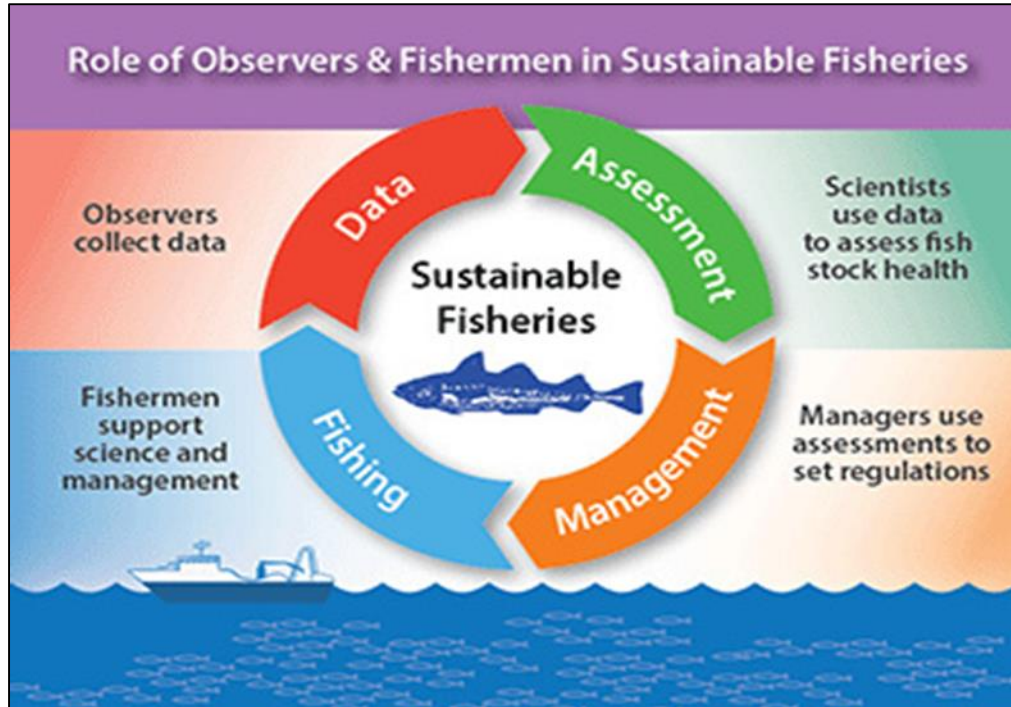


Figure 1 The Role of Data, Assessment, and Management in Sustainable Fisheries: A Collaborative Cycle (Wang & Dicosimo 2019)

An important component of SFM is the incorporation of ecological, social, and economic considerations into management decisions. The integration of ecosystem-based management (EBM) ensures that fisheries are managed with a holistic understanding of ecosystem dynamics, including species interactions, habitat health, and climate variability (Pikitch et al., 2004). By addressing these interconnected factors, SFM seeks to maintain not only the health of fish populations but also the resilience of the broader marine environment.

The economic importance of fisheries cannot be understated, as they contribute billions of dollars to the U.S. economy annually and provide employment to millions of people. However, achieving economic growth through fishing activities must be balanced with conservation efforts to ensure that future generations can also benefit from marine resources (Hilborn et al., 2021). Thus, sustainable fisheries management in U.S. waters represents a critical intersection between scientific research, policy, and the practicalities of resource use.

1.2. Objectives and Challenges

The overarching objective of sustainable fisheries management (SFM) is to harmonize economic growth with the conservation of marine ecosystems. Achieving this balance requires setting fishing practices that ensure long-term sustainability while supporting the livelihoods of millions dependent on fisheries for income, food security, and economic stability (FAO, 2020). In U.S. waters, SFM aims to maintain fish stocks at biologically sustainable levels, secure employment in coastal communities, and contribute to the national economy through commercial and recreational fishing (Smith et al., 2021).

However, managing fisheries sustainably presents several challenges. One of the most significant hurdles is overfishing, which can deplete fish populations to unsustainable levels, leading to the collapse of ecosystems and the loss of

economic opportunities (Worm & Branch, 2012). Overfishing often results from weak regulatory enforcement, insufficient data on fish stocks, and the economic pressures to meet rising demand for seafood. Addressing these issues requires continuous improvement in data collection, robust monitoring systems, and stricter enforcement mechanisms to control fishing efforts and maintain stock health.

Another challenge is the inherent variability of marine ecosystems, driven by factors such as climate change, habitat destruction, and pollution. These changes complicate the task of managing fisheries as they introduce uncertainty into stock assessments and management strategies. The increasing frequency of extreme weather events, ocean acidification, and warming waters further impact fish stocks' reproductive cycles and migration patterns, necessitating adaptive management approaches (Smith et al., 2021). This uncertainty creates a delicate balance between ecological and economic objectives, requiring policies that are flexible enough to respond to emerging environmental challenges while still safeguarding economic interests.

Table 1 provides an organized overview of sustainable fisheries management (SFM) by highlighting essential aspects, such as the core objective of maintaining biologically sustainable fish stocks while supporting economic livelihoods. It discusses the importance of fisheries in U.S. waters, particularly their contribution to national food security and international trade. Key practices, including preventing overfishing through the maximum sustainable yield (MSY) and ecosystem-based management (EBM), are outlined. The table also highlights the significant economic contribution of fisheries, the challenges they face such as overfishing and environmental variability, and the regulatory frameworks in place, particularly the Magnuson-Stevens Act. Lastly, it emphasizes management approaches, such as adaptive management, and suggests strategies like improved enforcement and flexible policies to ensure sustainable practices.

Table 1 Key Aspects of Sustainable Fisheries Management: Objectives, Practices, and Challenges in U.S. Waters

Aspect	Core Objective	Importance in U.S. Waters	Key Practices	Economic Contribution	Challenges	References
Definition	Ensure biologically sustainable fish stock harvests while supporting economic livelihoods	Supports national food security and international trade due to vast Exclusive Economic Zone (EEZ)	Prevent overfishing through Maximum Sustainable Yield (MSY), science-based limits, and ecosystem-based management (EBM)	Fisheries contribute billions of dollars annually to the economy and provide employment to millions of people	Overfishing, insufficient stock data, weak enforcement, and environmental variability from climate change, habitat destruction, and pollution	Garcia & Charles (2021); NOAA Fisheries (2020); Hilborn & Ovando (2020); Pikitch et al. (2004); Hilborn et al. (2021)
Regulatory Framework	Mandate science-based decision-making and EBM through laws like the Magnuson-Stevens Act	Essential for implementing Sustainable Fisheries Management (SFM) practices in U.S. fisheries	Incorporate ecological, social, and economic considerations into management decisions	Balances economic activities with conservation to benefit future generations	Challenges in policy flexibility to respond to environmental changes while safeguarding economic interests	Link & Browman (2014); FAO (2020); Smith et al. (2021)
Ecosystem-Based Management	Achieve a holistic understanding of ecosystem dynamics, including species interactions,	Ensures resilience of the broader marine environment	Address interconnected ecological factors to maintain fish populations and ecosystem health	Supports long-term productivity of marine resources and economic livelihoods	Uncertainty due to environmental changes complicating stock assessments and	Pikitch et al. (2004); Hilborn et al. (2021)

	habitat health, and climate variability				management strategies	
Objectives	Harmonize economic growth with conservation of marine ecosystems	Maintain biologically sustainable fish stocks and secure employment in coastal communities	Set fishing practices that ensure long-term sustainability while supporting livelihoods	Contribute to the national economy through commercial and recreational fishing	Overfishing leading to depletion of stocks, ecosystem collapse, and loss of economic opportunities	FAO (2020); Smith et al. (2021); Worm & Branch (2012)
Challenges	Overfishing, weak regulatory enforcement, insufficient data, and economic pressures	Inherent variability of marine ecosystems driven by climate change, habitat destruction, and pollution	Requires adaptive management approaches and flexible policies to respond to emerging environmental challenges	Balancing short-term economic pressures with long-term sustainability	Environmental changes introduce uncertainty into stock assessments and management strategies	Worm & Branch (2012); Smith et al. (2021); FAO (2020)
Importance of SFM	Represents a critical intersection between scientific research, policy, and practical resource use	Ensures the health of fish populations and the resilience of marine environments	Ongoing efforts to integrate EBM and adaptive management into fisheries practices	Future generations benefit from marine resources through balanced economic growth and conservation	Necessitates rigorous scientific assessments, adaptive management, and strong regulatory frameworks	Garcia & Charles (2021); Hilborn et al. (2021)
Conclusion	SFM is essential for the sustainable utilization of marine resources	U.S. fisheries must balance economic and ecological objectives	Continuous improvement in data collection, monitoring, and enforcement mechanisms	Integration of EBM and adaptive management is key to sustaining economic livelihoods	Collaboration among stakeholders is required to overcome challenges	Garcia & Charles (2021); Pikitch et al. (2004); Smith et al. (2021)

While the objectives of SFM in U.S. waters are clear, the path to achieving them is fraught with challenges. Overcoming these requires a combination of rigorous scientific assessments, adaptive management, and strong regulatory frameworks that protect both marine ecosystems and the economic activities they support.

1.3. Objectives and Challenges

The primary objective of sustainable fisheries management is to balance economic growth with the conservation of marine ecosystems. This requires implementing fishing practices that ensure the long-term sustainability of fish stocks while supporting the livelihoods of communities dependent on fisheries for income, food security, and economic stability. In U.S. waters, sustainable fisheries management aims to maintain fish populations at sustainable levels, secure employment in coastal communities, and contribute to the national economy through commercial and recreational fishing activities.

Despite the clarity of these goals, several challenges complicate their achievement. Overfishing remains a significant hurdle, as it can deplete fish populations to unsustainable levels, leading to the collapse of ecosystems and loss of economic opportunities. This issue often arises due to weak regulatory enforcement, limited data on fish stocks, and

economic pressures to meet the growing demand for seafood. Addressing these challenges necessitates robust data collection, enhanced monitoring systems, and stricter enforcement mechanisms to control fishing activities and ensure the health of fish populations.

Additionally, the variability of marine ecosystems, driven by factors such as climate change, habitat degradation, and pollution, presents another challenge to sustainable fisheries management. These environmental changes introduce uncertainty into stock assessments and management strategies. Climate change, in particular, affects the reproductive cycles, migration patterns, and overall health of fish stocks, making adaptive management strategies critical. The increasing frequency of extreme weather events, ocean acidification, and warming waters further complicate these efforts, requiring policies that can adapt to changing conditions while still supporting economic growth.

While the objectives of sustainable fisheries management in U.S. waters are well-defined, overcoming the associated challenges requires a combination of scientific assessments, adaptive management, and robust regulatory frameworks. These efforts are necessary to protect marine ecosystems and ensure the continued economic viability of the fishing industry.

1.4. Role of Mathematical Models in Fisheries Management

Mathematical models are critical tools in sustainable fisheries management, enabling policymakers to make informed decisions regarding fish stock assessments, catch limits, and long-term sustainability strategies. These models incorporate biological, environmental, and economic factors to provide insights into fish population dynamics and the effects of fishing pressure on marine ecosystems. By simulating various scenarios, models help to predict future fish stock levels, optimize fishing efforts, and minimize the risk of overexploitation (Fogarty & Botsford, 2007).

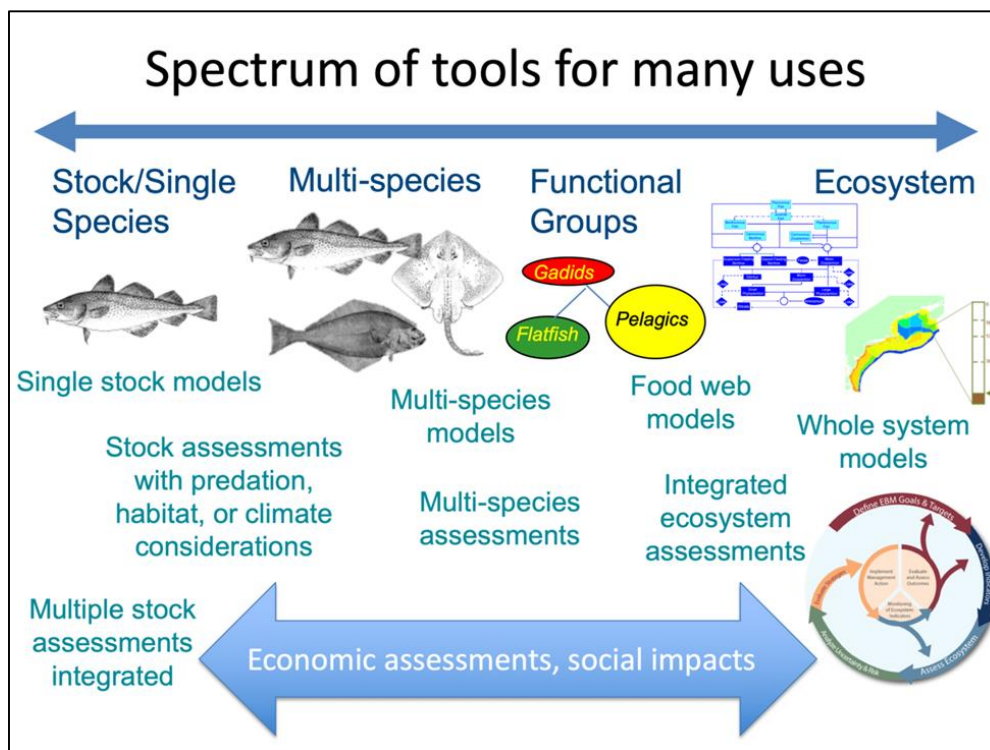


Figure 2 Mathematical Models in Fisheries Management: A Spectrum from Single-Species to Ecosystem Approaches (NOAA Fisheries, 2024)

Figure 2 illustrates the range of mathematical models used in fisheries management, from simple stock or single-species models to complex ecosystem-wide models. At one end of the spectrum, single-species models assess individual fish populations, considering factors like predation, habitat, or climate, and are used to guide sustainable harvesting. As the models become more complex, multi-species and functional group models account for interactions between different species, helping to understand food webs and interdependencies within ecosystems. At the far end, ecosystem models offer a holistic view of the entire marine environment, integrating multiple factors such as habitat, species interactions,

and human impacts. These models are crucial for conducting integrated ecosystem assessments that inform long-term, sustainable management strategies, while also considering economic and social implications.

One of the most widely used mathematical approaches is population dynamics modeling, which helps to estimate fish stock size, growth rates, and reproduction patterns. These models, such as the Schaefer and Beverton-Holt models, play a vital role in determining the maximum sustainable yield (MSY) that ensures fish populations remain within sustainable limits while supporting economic activities. Furthermore, bioeconomic models extend the scope by integrating economic variables, such as fishing costs and market prices, into biological models, allowing for a more comprehensive understanding of the trade-offs between conservation and economic growth (Clark, 2010).

In addition to population dynamics and bioeconomic models, ecosystem-based models are increasingly being adopted to address the complexity of marine environments. These models take into account the interactions between species, environmental factors, and human activities, offering a more holistic view of fisheries management. Ecosystem-based models are essential for understanding the indirect effects of fishing, such as habitat destruction and shifts in species composition, and for managing fisheries within the broader context of ecosystem health (Pikitch et al., 2004).

Mathematical models provide a scientific foundation for sustainable fisheries management. They not only assist in setting catch limits and protecting fish stocks but also enable managers to balance ecological and economic objectives. These models are indispensable in addressing the complex challenges of modern fisheries management, offering the necessary tools to make decisions that promote both sustainability and economic resilience.

1.5. The Organization of the Paper

This paper is organized into five main sections, each addressing critical aspects of sustainable fisheries management in U.S. waters. Section 1 introduces the topic, outlining the importance of balancing economic growth with conservation and the role of mathematical models in achieving this balance. It also discusses the key challenges facing sustainable fisheries management.

In Section 2, the paper delves into the various types of mathematical models used in fisheries management. It covers population dynamics models, bioeconomic models, and ecosystem-based models, examining their application and effectiveness in U.S. fisheries. This section also highlights the strengths and limitations of these models in real-world management scenarios.

Section 3 focuses on the practical implementation of these models within the U.S. federal regulatory framework. It explores how federal laws like the Magnuson-Stevens Act guide fisheries management, provides case studies of successful model implementation, and addresses the challenges faced in applying these models effectively.

Section 4 shifts to the economic and ecological implications of fisheries management. It discusses the economic significance of U.S. fisheries, conservation strategies, and the trade-offs between economic growth and conservation efforts. This section emphasizes the importance of striking a balance between exploiting marine resources for economic gain and ensuring long-term sustainability.

Finally, Section 5 presents future directions and innovations in fisheries management. It highlights advancements in modeling techniques, policy recommendations for improved management, and a vision for a sustainable future for U.S. fisheries. The paper concludes by summarizing the critical points and advocating for the integration of advanced technologies and collaborative governance to ensure the resilience and sustainability of U.S. fisheries.

2. Mathematical models in fisheries management

2.1. Population Dynamics Models

Population dynamics models are fundamental to sustainable fisheries management, as they provide a framework for understanding fish stock behavior over time. These models focus on key biological processes such as birth, growth, death, and reproduction within fish populations, helping managers estimate sustainable harvesting levels while ensuring long-term ecological balance (Quinn & Deriso, 1999). By predicting changes in fish populations based on environmental conditions and fishing pressures, these models allow for the careful regulation of catch limits and the prevention of overfishing.

Figure 3 illustrates the basic dynamics of fish population changes, showing how populations increase and decrease based on key factors. Population increases occur through births and immigration, where new fish are either born into the population or move into the area from elsewhere. On the other hand, population decreases happen due to deaths and emigration, as fish either die naturally or leave the area. This visual representation highlights the factors that contribute to the fluctuation of fish populations, which are essential considerations in fisheries management and population dynamics modeling. It demonstrates the balance between gains and losses within a population, crucial for maintaining sustainable fish stocks.

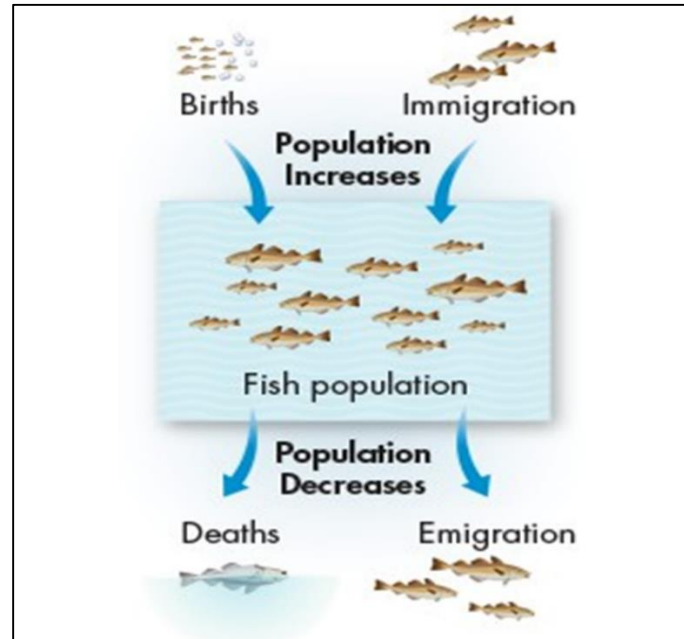


Figure 3 Fish population dynamics (American Fisheries Society 2024)

The changes in the population can be mathematically represented using a differential equation that accounts for births, deaths, immigration, and emigration.

The general form of the population dynamics equation is:

$$\frac{dN}{dt} = (B + I) - (D + E)$$

Where:

N is the population size,

$\frac{dN}{dt}$ is the rate of change of the population over time,

B is the birth rate (which increases the population),

I is the immigration rate (increases population),

D is the death rate (decreases population),

E is the emigration rate (decreases population).

This equation describes how the fish population grows through births and immigration and decreases through deaths and emigration.

Figure 4 illustrates the population dynamics of a fish population over time, accounting for factors such as births, immigration, deaths, and emigration. As seen, the population grows steadily due to the combined effects of births and immigration, outpacing the reductions from deaths and emigration. This growth is depicted as an exponential increase, reflecting the surplus in factors contributing to population growth. This kind of model helps in understanding population trends based on various ecological factors in fisheries management.

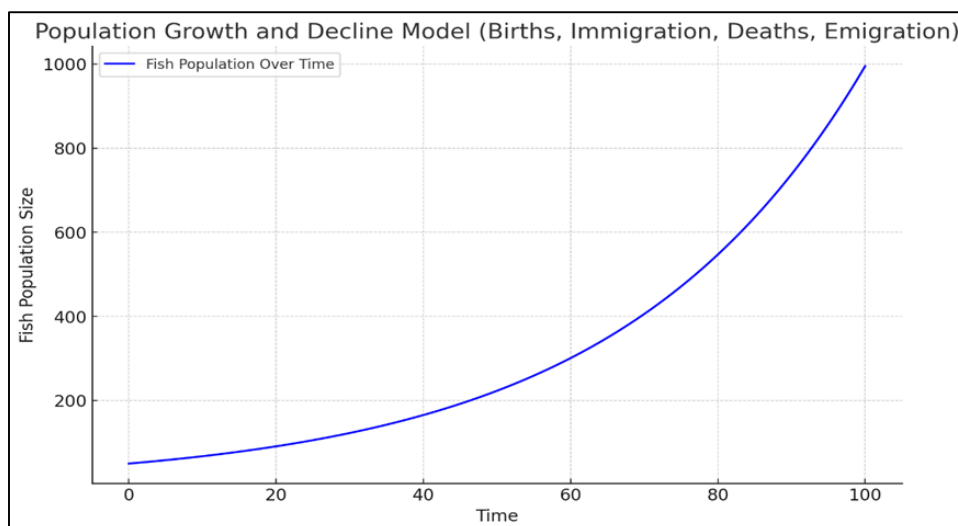


Figure 4 Fish Population Dynamics: Impact of Births, Immigration, Deaths, and Emigration Over Time

The most commonly used population dynamics models in fisheries management are the Schaefer model and the Beverton-Holt model. The Schaefer model, also known as the surplus production model, is used to estimate the maximum sustainable yield (MSY) by balancing fish reproduction with harvesting. It assumes that fish stocks grow at a certain rate until they reach a carrying capacity, beyond which population growth slows (Haddon, 2011). Managers use this model to determine the optimal level of fishing effort that maximizes yield without depleting the population.

The Beverton-Holt model, on the other hand, is a recruitment model that predicts the number of new fish entering a population based on the number of spawners. This model is essential in understanding how fishing affects the reproductive capacity of fish populations and helps managers set fishing quotas that protect breeding stock and ensure population stability (Maunder & Piner, 2015). Both the Schaefer and Beverton-Holt models are integral to calculating sustainable fishing limits and are widely applied in fisheries management across the U.S. and globally.

Table 2 provides a concise overview of the critical components of population dynamics models used in fisheries management. It covers the definition and key biological processes such as birth, growth, death, and reproduction that these models account for in fish populations. The table highlights two commonly used models, the Schaefer model and the Beverton-Holt model, which are essential for estimating sustainable yield and understanding recruitment patterns in fish populations. Additionally, it discusses the application of these models in fisheries management to set catch limits and prevent overfishing, while also addressing challenges like environmental variability and data limitations. Relevant references supporting the concepts are also provided.

Table 2 Key Aspects and Models of Population Dynamics in Sustainable Fisheries Management

Aspect	Description	References 1
Definition	Framework for understanding fish stock behavior over time	Quinn & Deriso (1999)
Key Biological Processes	Birth, growth, death, and reproduction within fish populations	Quinn & Deriso (1999)
Common Models	Schaefer model (surplus production) and Beverton-Holt model (recruitment)	Haddon (2011), Maunder & Piner (2015)
Schaefer Model	Estimates MSY by balancing fish reproduction and harvesting; used to determine optimal fishing effort	Haddon (2011)
Beverton-Holt Model	Predicts new fish entering a population based on spawners; helps protect breeding stock	Maunder & Piner (2015)
Applications in Fisheries Management	Used to set catch limits, prevent overfishing, and ensure long-term population stability	Quinn & Deriso (1999)
Challenges	Environmental variability, data limitations, and integration of ecosystem factors	Haddon (2011), Maunder & Piner (2015)

Incorporating these models into decision-making processes allows fisheries managers to balance economic activities with the biological realities of fish populations. However, challenges such as environmental variability and data limitations must be addressed to improve the precision and reliability of these models. As more sophisticated modeling techniques are developed, including those that integrate ecosystem factors, population dynamics models will continue to evolve, providing even greater insight into sustainable fisheries management.

2.2. Bioeconomic Models

Bioeconomic models combine biological dynamics of fish populations with economic principles, offering a comprehensive tool for fisheries management. These models allow policymakers to explore the economic impacts of different management strategies while ensuring that biological sustainability is maintained. By integrating data on fish stock growth, harvesting costs, market prices, and fishing effort, bioeconomic models help achieve optimal outcomes for both fisheries' ecological health and economic viability (Clark, 2010).

Figure 5 presents a simplified view of bioeconomic models in fisheries management. It shows how the biological dynamics of fish populations and economic principles converge to achieve an optimal balance between ecological sustainability and economic profitability. The core models include the Gordon-Schaefer model, which focuses on ensuring sustainable fish stocks, and dynamic optimization models, which help maximize profitability by adapting to changes in environmental and economic conditions. These models ensure that maintaining healthy fish populations supports long-term economic gains, creating a sustainable balance between conservation and profit.

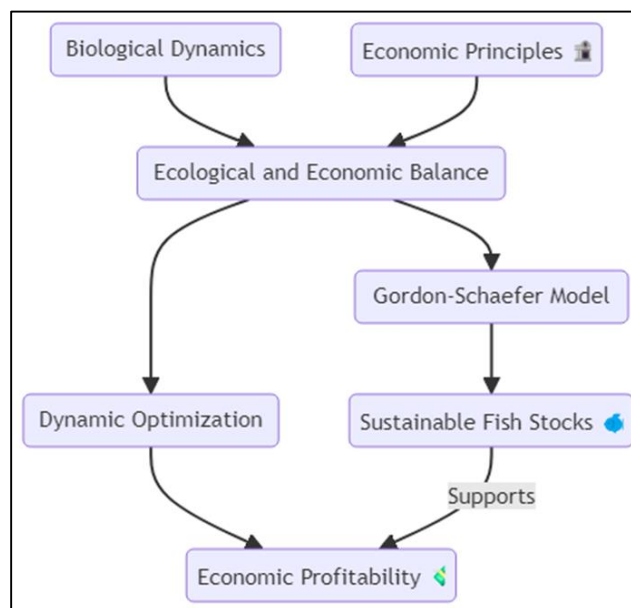


Figure 5 Balancing Ecology and Economy: A Simplified Bioeconomic Model for Fisheries Management

The Gordon-Schaefer Model is central to this, linking sustainable fish stocks and economic profitability. The flow also involves dynamic optimization to maintain balance between ecological sustainability and economic gain.

The Gordon-Schaefer model is used to find the optimal harvest rate that maximizes economic profitability while ensuring sustainable fish stocks. It is based on the concept of Maximum Sustainable Yield (MSY) and incorporates both biological and economic factors.

The basic equation of the Gordon-Schaefer model is:

$$\pi = p \cdot H - c \cdot E$$

Where:

π is the profit,

p is the price per unit of fish,

H is the harvest or catch (which depends on fishing effort and fish population),

c is the cost per unit of fishing effort,

E is the fishing effort (how much fishing is done, measured in time, labor, or gear used).

The model integrates biological dynamics through the fish population growth equation, which can be written as:

$$G(N) = rN\left(1 - \frac{K}{N}\right)$$

Where:

N is the fish population size,

r is the intrinsic growth rate of the population,

K is the carrying capacity of the environment,

$G(N)$ is the natural growth of the fish population.

Combining these with harvest, the harvest function is:

$$H = q \cdot E \cdot N$$

Where:

q is the catchability coefficient (how effective fishing effort is at catching fish).

Thus, the dynamic optimization seeks to find the level of effort E that maximizes the profit π , while maintaining the fish stock N at sustainable levels, according to the Gordon-Schaefer model. This optimization balances ecological sustainability with economic profitability, as shown in the diagram.

Figure 6 above illustrates the Gordon-Schaefer model, showing the relationship between fishing effort (E) on the horizontal axis and yield (H) and profit on the vertical axis. The blue dashed line represents the yield, which increases with effort but starts to decline after reaching the maximum sustainable yield (MSY). The green line represents profit, which also increases initially but declines after a certain point due to overfishing, leading to reduced profits. This model demonstrates how balancing fishing effort is crucial for maintaining both sustainable fish stocks and economic profitability.

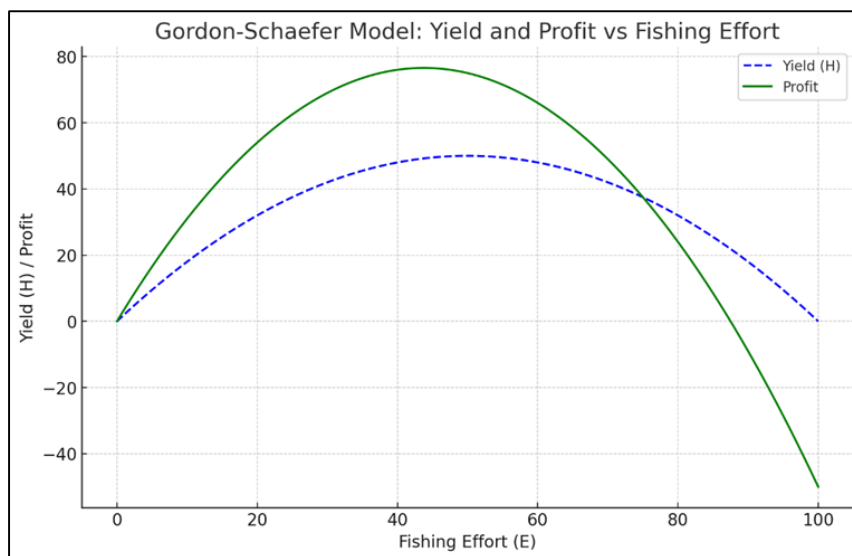


Figure 6 Gordon-Schaefer Model: Impact of Fishing Effort on Yield and Profit"

At the core of bioeconomic models is the concept of the optimal harvest strategy, which balances the economic benefits of fishing with the need to conserve fish stocks. The Gordon-Schaefer model is one of the most prominent bioeconomic models used in fisheries management. It extends the traditional Schaefer surplus production model by incorporating the costs and revenues associated with fishing activities, helping managers determine the economically optimal level of effort that maximizes profits while maintaining sustainable fish populations (Gordon, 1954). This model is widely used in managing fisheries where overfishing could lead to resource depletion and economic losses.

In addition to the Gordon-Schaefer model, dynamic optimization models are frequently employed to address more complex scenarios. These models account for the variability in stock recruitment, environmental changes, and fluctuating market conditions, allowing for adaptive management strategies that maximize long-term economic returns (Costello et al., 2016). By incorporating dynamic variables, these models are particularly useful in regions where fish populations and market conditions are highly variable, enabling managers to adjust fishing practices based on real-time data.

The application of bioeconomic models is essential for evaluating trade-offs between short-term economic gains and long-term sustainability. While these models provide a robust framework for decision-making, they also highlight the need for continuous data collection and refinement to account for evolving environmental and economic factors. As fisheries face increasing pressures from climate change and market demand, bioeconomic models will remain central to achieving the dual goals of economic profitability and ecological conservation.

Table 3 provides an overview of bioeconomic models, which integrate biological dynamics of fish populations with economic principles to guide sustainable fisheries management. It highlights the core concept of optimal harvest strategies, focusing on balancing economic benefits with the need for conservation. Key models such as the Gordon-Schaefer model and dynamic optimization models are discussed, with the former incorporating fishing costs and revenues to determine the optimal fishing effort. Dynamic optimization models account for variables like stock recruitment and market conditions, allowing for adaptive management. The table also outlines the applications of bioeconomic models in evaluating trade-offs between short-term economic gains and long-term sustainability, while addressing challenges such as the need for continuous data collection and refinement due to changing environmental and economic conditions.

Table 3 Key Aspects of Bioeconomic Models in Fisheries Management: Balancing Economic Viability and Ecological Conservation

Aspect	Description	References
Definition	Combines biological dynamics of fish populations with economic principles	Clark (2010)
Core Concept	Optimal harvest strategy balancing economic benefits and conservation	Clark (2010)
Key Models	Gordon-Schaefer model, dynamic optimization models	Gordon (1954), Costello et al. (2016)
Gordon-Schaefer Model	Extends Schaefer model by incorporating costs and revenues to maximize profits while maintaining sustainable stocks	Gordon (1954)
Dynamic Optimization Models	Accounts for variability in stock recruitment, environmental changes, and market conditions for adaptive management	Costello et al. (2016)
Applications in Fisheries Management	Used to evaluate trade-offs between short-term gains and long-term sustainability	Clark (2010)
Challenges	Requires continuous data collection and refinement due to evolving environmental and economic factors	Clark (2010), Costello et al. (2016)

2.3. Ecosystem-Based Models

Ecosystem-based models are an essential advancement in fisheries management, as they go beyond single-species approaches to consider the broader ecological context in which fisheries operate. These models account for the complex interactions between species, habitats, and environmental factors, providing a more holistic view of how ecosystems function and how fisheries affect, and are affected by, these systems (Pikitch et al., 2004). By integrating ecological, biological, and physical processes, ecosystem-based models enable managers to develop strategies that support both sustainable fisheries and ecosystem health.

Figure 5 illustrates the complex dynamics between predator and prey populations within an ecosystem-based management framework, highlighting how habitat management influences population growth and survival. It compares three approaches: ecosystem-based habitat management, single-structure-focused management, and single-species-focused management. The ecosystem-based approach considers factors such as resource availability in shallow littoral

zones and coarse woody habitats, which support prey growth and reproduction. Predators, in turn, affect prey populations through predation, while also benefiting from spatial refuges that shape their foraging behavior. The figure emphasizes that ecosystem-based models incorporate these interactions to provide a more holistic understanding of fisheries management compared to traditional, single-species approaches. The relationships between predator and prey can be represented mathematically using predator-prey models, such as the Lotka-Volterra equations, which describe how these populations change over time based on birth, death, and predation rates. This integrated approach helps fisheries managers design more sustainable strategies that account for broader ecological factors.

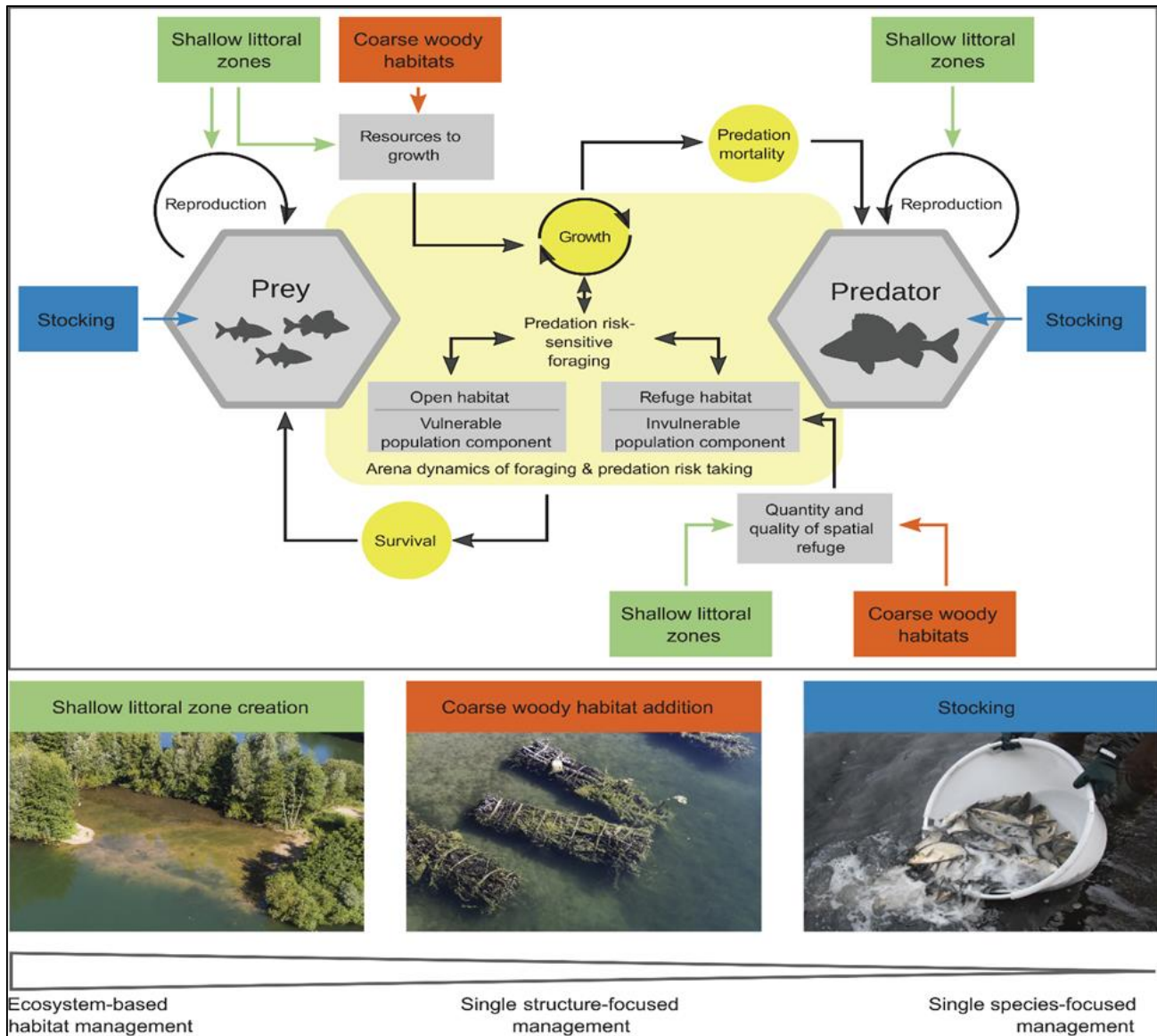


Figure 7 Ecosystem-Based Models (Bendrick Iet al., 2023)

To model this mathematically, we can use the Lotka-Volterra predator-prey equations, which describe the population dynamics of predators and prey.

These equations describe the interactions between two species: prey N and predator P .

2.3.1. Prey Population Equation:

$$\frac{dN}{dt} = rN - aNP$$

Where:

N is the prey population.

r is the intrinsic growth rate of the prey (which is supported by habitat, resources, and reproduction as shown in the image).

a is the predation rate coefficient (the effectiveness of the predator in catching prey).

P is the predator population.

2.3.2. Predator Population Equation:

$$\frac{dP}{dt} = bNP - mP$$

Where:

P is the predator population.

b is the reproduction rate of predators per prey consumed (predators grow in proportion to the number of preys they catch).

m is the predator mortality rate.

These equations help simulate the dynamics of predator-prey interactions and how various management strategies, such as habitat creation and stocking, influence population balance and sustainability.

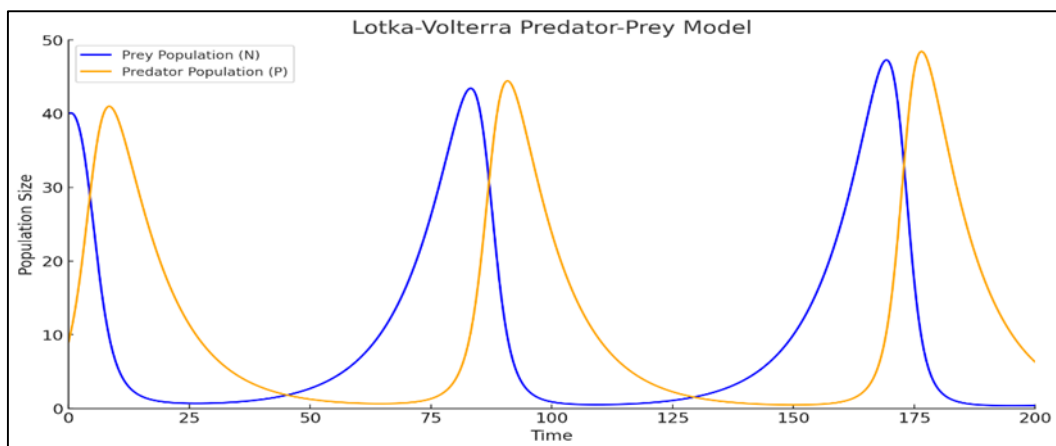


Figure 8 Predator-Prey Population Dynamics: A Lotka-Volterra Model Simulation

Figure 6 depicts the dynamics of a predator-prey system as modeled by the Lotka-Volterra equations. The blue line represents the prey population, while the orange line indicates the predator population over time. As the prey population increases, it provides more food for the predators, leading to a subsequent increase in the predator population. However, as the predator population grows, it exerts more pressure on the prey, resulting in a decline in the prey population. This cyclical pattern illustrates the natural fluctuations between the two populations, highlighting the balance and interdependence within the ecosystem. This model effectively demonstrates how various factors influence the dynamics of predator and prey populations, which can be applied in fisheries management to maintain ecological balance.

One of the key benefits of ecosystem-based models is their ability to incorporate species interactions, such as predator-prey relationships, competition for resources, and the effects of fishing on non-target species. This approach helps to prevent unintended consequences that may arise from traditional single-species management, such as the collapse of dependent species or degradation of habitats (Link, 2010). For example, the Ecopath with Ecosim (EwE) model is widely used to simulate food web dynamics and explore the impact of fishing and environmental changes on entire ecosystems. EwE has proven valuable in regions like the U.S. where multispecies fisheries are common, offering insights into the broader consequences of fishing pressure on marine biodiversity.

Ecosystem-based models also take into account external factors such as climate change, ocean acidification, and habitat loss, which can significantly affect fish populations and the ecosystems they depend on. These models allow for adaptive management by simulating various environmental scenarios and their impact on fisheries. In particular, the Atlantis model has been instrumental in providing spatially explicit simulations of marine ecosystems, helping managers design

marine protected areas (MPAs) and other conservation measures that ensure the long-term sustainability of fisheries within dynamic and changing environments (Fulton et al., 2011).

Table 4 provides a concise overview of ecosystem-based models, which incorporate species interactions, habitats, and environmental factors to manage fisheries holistically. It outlines key components such as predator-prey relationships, ecological processes, and environmental influences like climate change and habitat loss. The benefits of these models include preventing unintended consequences like species collapse and promoting ecosystem health. Key models, such as Ecopath with Ecosim (EwE) and Atlantis, are discussed for their role in simulating food webs and spatially explicit marine ecosystems. Despite their advantages, the table also highlights challenges such as the need for extensive data and computational resources, as well as the complexity of implementing these models on a large scale.

Table 4 Key Aspects of Ecosystem-Based Models in Sustainable Fisheries Management

Aspect	Description	References
Definition	Ecosystem-based models consider species interactions, habitats, and environmental factors in fisheries management	Pikitch et al. (2004)
Key Components	Species interactions (predator-prey, competition), ecological processes, environmental factors	Pikitch et al. (2004), Link (2010)
Benefits	Prevent unintended consequences like species collapse, support sustainable fisheries and ecosystem health	Link (2010)
Key Models	Ecopath with Ecosim (EwE) for food web dynamics, Atlantis for spatial simulations and designing MPAs	Pikitch et al. (2004), Fulton et al. (2011)
External Factors	Climate change, ocean acidification, habitat loss	Fulton et al. (2011)
Challenges	Require extensive data and computational resources; complexity in large-scale implementation	Fulton et al. (2011)

While ecosystem-based models offer a more comprehensive understanding of fisheries management, they also present challenges. These models require extensive data collection and computational resources, and their complexity can make them difficult to implement at scale. Nevertheless, as data availability improves and modeling techniques evolve, ecosystem-based models will play an increasingly important role in fostering sustainable fisheries that support both ecological resilience and economic growth.

3. Federal Regulatory Framework

The U.S. federal regulatory framework for fisheries management is primarily governed by the Magnuson-Stevens Fishery Conservation and Management Act (MSA), which serves as the foundation for sustainable fisheries management in U.S. waters. Enacted in 1976 and amended several times, the MSA established regional Fishery Management Councils that work in collaboration with the National Oceanic and Atmospheric Administration (NOAA) to develop and implement Fishery Management Plans (FMPs). These plans are based on scientific assessments of fish stocks and are designed to prevent overfishing, rebuild depleted stocks, and ensure long-term sustainability (NOAA Fisheries, 2020).

Figure 7 outlines the core components of the U.S. federal regulatory framework for fisheries management. At the center is the Magnuson-Stevens Act (MSA), which guides sustainable fisheries management through the development of Fishery Management Plans (FMPs) by NOAA. These plans include setting Annual Catch Limits (ACLs) to ensure sustainable fish stocks. Complementary laws, such as the Endangered Species Act (ESA) and the Marine Mammal Protection Act (MMPA), work alongside the MSA to protect endangered species and reduce marine mammal bycatch, all contributing to the overarching goal of sustainable fisheries.

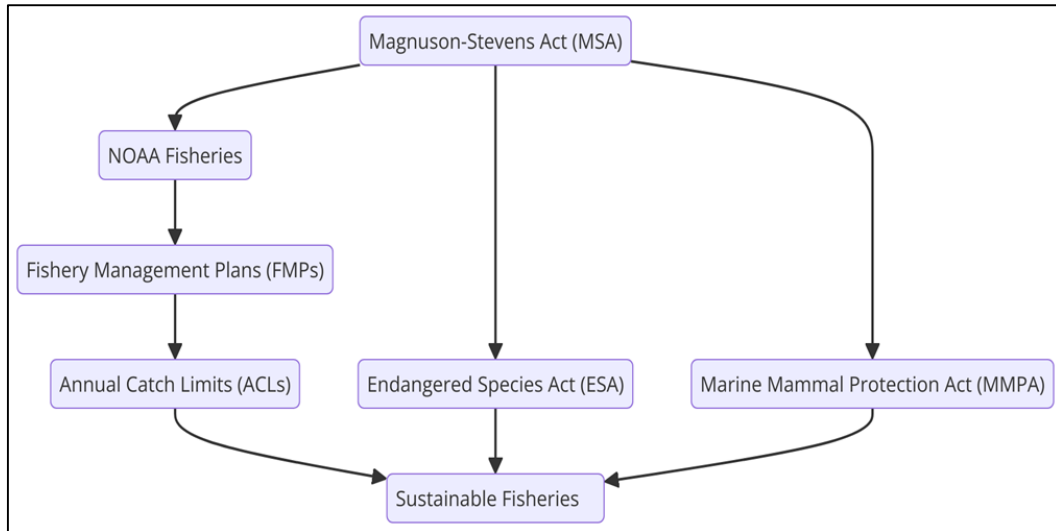


Figure 9 Federal Framework for Sustainable Fisheries Management

A key provision of the MSA is the requirement for fisheries to adhere to science-based catch limits, known as Annual Catch Limits (ACLs), which are set to prevent overfishing while optimizing economic benefits. These limits are informed by stock assessments conducted by NOAA and independent scientific bodies, ensuring that decision-making processes are grounded in the best available data (Rosenberg et al., 2018). The MSA also introduced the concept of rebuilding plans, which are mandated when stocks are found to be overfished, with strict timelines for recovery and measures to reduce fishing pressure.

In addition to the MSA, the Endangered Species Act (ESA) and the Marine Mammal Protection Act (MMPA) are other critical components of the regulatory framework that impact fisheries management. The ESA provides protections for species that are at risk of extinction, requiring fisheries to avoid interactions with endangered or threatened species. Similarly, the MMPA ensures that fisheries reduce bycatch of marine mammals, such as dolphins and seals, to sustainable levels (Guldin, 2017). These laws complement the MSA by emphasizing the need for ecosystem-based management, highlighting the interconnectedness of species and habitats in marine ecosystems.

The U.S. federal regulatory framework for fisheries management is characterized by its focus on science-based decision-making, conservation, and long-term sustainability. Through the implementation of FMPs, ACLs, and rebuilding plans, the MSA ensures that U.S. fisheries are managed to support both ecological health and economic prosperity, with complementary legislation further reinforcing the protection of endangered species and marine ecosystems.

3.1. Case Studies of Model Implementation

The practical application of mathematical models in U.S. fisheries management has been instrumental in achieving sustainability goals. Case studies from key U.S. fisheries demonstrate the effectiveness of these models in balancing conservation and economic interests. Notable examples include the Alaska Pollock fishery and the New England groundfish fishery, both of which have leveraged population dynamics, bioeconomic, and ecosystem-based models to guide decision-making processes.

In the Alaska Pollock fishery, one of the largest and most valuable fisheries in the U.S., mathematical models have played a pivotal role in maintaining stock sustainability. The Pollock stock is assessed annually using population dynamics models that account for recruitment, growth, and mortality rates. These models inform the setting of annual catch limits (ACLs) based on the principle of maximum sustainable yield (MSY), ensuring that the fishery remains both productive and sustainable. Through the application of models, the Alaska Pollock fishery has achieved a balance between economic profitability and the conservation of fish stocks, making it a global example of successful fisheries management (Barbeaux et al., 2020).

The New England groundfish fishery presents a different challenge, as it includes multiple species that have been historically overfished. In this case, bioeconomic models have been used to address the economic realities of the fishing industry while promoting stock recovery. The Fishery Management Plans (FMPs) for this region integrate bioeconomic assessments to balance economic incentives with conservation goals. By using these models, managers have been able

to implement catch share programs, which allocate quotas to individual fishermen or fishing communities, helping to reduce overfishing and promote stock rebuilding (O’Leary et al., 2017).

Another significant case study is the use of ecosystem-based models in the California Current Ecosystem, where the integration of ecosystem dynamics into management decisions has been essential. The Ecopath with Ecosim (EwE) model has been applied to assess the impacts of fishing on the entire marine ecosystem, including predator-prey interactions and habitat degradation. This holistic approach has allowed managers to account for the broader environmental effects of fishing activities, ensuring that fisheries are managed within the context of ecosystem health and resilience (Field et al., 2016).

Table 5 summarizes three key case studies demonstrating the successful implementation of mathematical models in U.S. fisheries management. In the Alaska Pollock Fishery, population dynamics models are used to conduct annual stock assessments and determine maximum sustainable yield (MSY), achieving a balance between economic profitability and conservation. The New England Groundfish Fishery utilizes bioeconomic models integrated into Fishery Management Plans (FMPs) and catch share programs to promote stock recovery and reduce overfishing. In the California Current Ecosystem, ecosystem-based models, such as Ecopath with Ecosim (EwE), are applied to manage fisheries holistically, accounting for predator-prey interactions and broader ecosystem health. These case studies highlight how integrating biological, economic, and ecological factors through various models supports sustainable fisheries management.

Table 5 Case Studies of Mathematical Model Implementation in U.S. Fisheries Management

Fishery	Model Used	Outcome	References
Alaska Pollock Fishery	Population dynamics models (annual stock assessments, MSY)	Balance between economic profitability and stock conservation	Barbeaux et al. (2020)
New England Groundfish Fishery	Bioeconomic models (FMPs, catch share programs)	Promotion of stock recovery and reduced overfishing	O’Leary et al. (2017)
California Current Ecosystem	Ecosystem-based models (Ecopath with Ecosim)	Holistic management of fisheries within broader ecosystem context	Field et al. (2016)

These case studies demonstrate the critical role that mathematical models play in fisheries management. By incorporating biological, economic, and ecological factors, these models enable managers to make data-driven decisions that promote sustainability, ensuring that fisheries remain productive while protecting marine ecosystems.

3.2. Challenges in Model Application

While mathematical models are invaluable tools in fisheries management, their practical application is often accompanied by significant challenges. These challenges arise from data limitations, uncertainties in environmental variability, and difficulties in implementing adaptive management strategies across diverse fisheries. Addressing these challenges is essential to improving the efficacy of model-driven fisheries management.

One of the primary challenges in applying mathematical models is the availability and quality of data. Accurate stock assessments, which form the foundation of many population dynamics and bioeconomic models, require extensive data on fish abundance, growth rates, mortality, and environmental conditions. However, many fisheries, particularly smaller or developing fisheries, lack the resources to conduct frequent and comprehensive data collection. As a result, models may be based on outdated or incomplete information, leading to unreliable predictions and management decisions (Pauly & Zeller, 2016). To mitigate this issue, advancements in technology, such as electronic monitoring and satellite-based tracking systems, are being integrated into fisheries management to improve data collection processes.

Another significant challenge is the inherent uncertainty associated with environmental variability, particularly in the context of climate change. Fish stocks are highly sensitive to changes in ocean temperature, acidity, and currents, all of which are influenced by global climate patterns. These changes can affect fish migration patterns, reproduction rates, and overall ecosystem health, complicating the predictions made by traditional population dynamics models (Free et al., 2019). Ecosystem-based models, while more comprehensive, also face difficulties in capturing the full complexity of marine ecosystems under changing environmental conditions. As climate change continues to impact marine ecosystems, models must evolve to include more robust climate projections and adaptive strategies.

Finally, the implementation of adaptive management strategies, which rely on continuous monitoring and real-time adjustments to management plans, presents a logistical and regulatory challenge. Fisheries management is often constrained by rigid regulatory frameworks that are slow to adapt to new scientific information or environmental changes. While models may indicate the need for immediate adjustments to catch limits or fishing practices, bureaucratic processes and stakeholder conflicts can delay these changes, undermining the effectiveness of model-based recommendations (Hilborn, 2016). Addressing these institutional challenges requires fostering greater collaboration between scientists, policymakers, and industry stakeholders to facilitate more agile and responsive management practices.

Table 6 provides an overview of the key challenges in applying mathematical models to fisheries management. It highlights three main issues: data limitations, environmental variability, and difficulties in implementing adaptive management. Data limitations arise from insufficient stock assessments and outdated or incomplete information, particularly in smaller fisheries, which can undermine model accuracy. Environmental variability, especially due to climate change, introduces uncertainty into model predictions as fish populations are highly sensitive to changes in temperature, ocean currents, and other factors. Lastly, the implementation of adaptive management is hindered by rigid regulatory frameworks and stakeholder conflicts, which delay the timely application of model-driven adjustments. Proposed solutions include technological advancements in data collection, integrating climate projections into models, and fostering collaboration among scientists, policymakers, and industry stakeholders to enable more flexible management strategies.

Table 6 Challenges and Solutions in the Application of Mathematical Models for Fisheries Management

Challenge	Description	Solution	References
Data Limitations	Many fisheries lack comprehensive data on stock assessments, fish abundance, and environmental conditions, leading to unreliable predictions	Advancements in technology, such as electronic monitoring and satellite-based tracking, improve data collection processes	Pauly & Zeller (2016)
Environmental Variability	Fish stocks are sensitive to changes in temperature, ocean currents, and other climate-related factors, making model predictions uncertain	Models need to integrate climate change projections and adaptive strategies to account for long-term environmental changes	Free et al. (2019)
Implementing Adaptive Management	Rigid regulatory frameworks and stakeholder conflicts can delay real-time adjustments to management plans, hindering adaptive strategies	Collaboration between scientists, policymakers, and industry stakeholders is needed for more agile and responsive management	Hilborn (2016)

While mathematical models are essential for modern fisheries management, challenges related to data limitations, environmental variability, and adaptive management hinder their full potential. Overcoming these challenges will require ongoing investment in data collection, the incorporation of climate change projections into models, and the development of more flexible regulatory frameworks that can respond to new information in real time.

4. Economic Importance of U.S. Fisheries

The U.S. fisheries sector plays a crucial role in the national economy, contributing significantly to employment, food security, and trade. The economic impact of U.S. fisheries extends across various sectors, including commercial fishing, aquaculture, seafood processing, and recreational fishing. In 2019, the commercial fishing and seafood industry generated over \$200 billion in sales and supported more than 1.7 million jobs across the United States (NOAA Fisheries, 2020). These figures underscore the substantial contribution of fisheries to both local economies and the broader national economic landscape.

Commercial fishing remains the backbone of the U.S. fisheries industry, with major ports in Alaska, the Gulf of Mexico, and the Northeast contributing the highest landings. Alaska, for instance, leads the nation in both volume and value of seafood production, with fisheries such as Pollock, salmon, and crab supporting thousands of jobs and generating billions in revenue annually (Seung & Hong, 2020). These fisheries not only provide livelihoods for fishing communities but also contribute to the U.S. export market, with seafood exports valued at approximately \$5.5 billion annually. The

trade benefits from U.S. fisheries reinforce the importance of maintaining sustainable practices to ensure the long-term viability of these economic contributions.

In addition to commercial fisheries, recreational fishing is an essential component of the U.S. economy. In 2019, more than 50 million Americans participated in recreational fishing activities, contributing \$50 billion in sales and supporting nearly 500,000 jobs (Lovell et al., 2020). Coastal communities across the U.S., particularly in states such as Florida and California, benefit significantly from the tourism associated with recreational fishing. This sector's economic influence highlights the need to balance fishing activities with conservation to maintain healthy fish populations that attract tourists and sustain local businesses.

Table 7 highlights the significant economic contributions of U.S. fisheries, which generate over \$200 billion in sales and support more than 1.7 million jobs across the country. Commercial fishing is the backbone of the industry, particularly in regions like Alaska, the Gulf of Mexico, and the Northeast, where fisheries such as Pollock and salmon contribute billions in revenue. Seafood exports from U.S. fisheries are valued at approximately \$5.5 billion annually, reinforcing the importance of maintaining sustainable practices. In addition to commercial activities, recreational fishing plays a key role, generating \$50 billion in sales and supporting nearly 500,000 jobs, particularly in coastal communities like Florida and California. The overall economic impact underscores the importance of sustainable fisheries management to protect both ecological and economic interests.

Table 7 Economic Contributions of U.S. Fisheries: Employment, Trade, and Regional Impact

Aspect	Description	References
Contribution to Economy	Over \$200 billion in sales and more than 1.7 million jobs supported by the fisheries industry	NOAA Fisheries (2020)
Commercial Fishing	Backbone of U.S. fisheries, contributing billions in revenue annually	Seung & Hong (2020)
Key Regions	Alaska, Gulf of Mexico, and the Northeast are key regions for commercial landings	Seung & Hong (2020)
Seafood Exports	\$5.5 billion annually in seafood exports	NOAA Fisheries (2020)
Recreational Fishing	\$50 billion in sales from recreational fishing, supporting nearly 500,000 jobs	Lovell et al. (2020)
Employment Impact	Fisheries support local economies, especially in coastal regions like Florida and California	NOAA Fisheries (2020), Lovell et al. (2020)

The economic importance of U.S. fisheries is evident in the contributions to employment, trade, and regional economies. Maintaining the sustainability of these resources is critical not only for ecological preservation but also for protecting the livelihoods of millions of Americans. As such, sustainable fisheries management practices are essential to ensuring the continued economic benefits derived from U.S. fisheries.

4.1. Conservation Strategies and Sustainability Targets

Conservation strategies in U.S. fisheries management are designed to maintain fish stocks at sustainable levels while ensuring the long-term health of marine ecosystems. These strategies are primarily guided by scientific assessments of fish populations and are implemented through a combination of regulatory frameworks, protected areas, and adaptive management practices. The Magnuson-Stevens Fishery Conservation and Management Act (MSA) serves as the cornerstone of U.S. fisheries conservation, mandating the use of science-based catch limits and rebuilding plans to prevent overfishing and restore depleted stocks (NOAA Fisheries, 2020).

One of the most effective conservation strategies is the use of annual catch limits (ACLs), which are set based on stock assessments that account for fish population dynamics, environmental factors, and economic considerations. ACLs are designed to ensure that fishing pressure does not exceed sustainable levels, preventing overfishing while allowing for the continued productivity of fisheries. In the U.S., the implementation of ACLs has led to significant progress in rebuilding overfished stocks and maintaining sustainable fisheries, with more than 40 stocks rebuilt since 2000 (Rosenberg et al., 2018). This success highlights the importance of data-driven conservation strategies in achieving sustainability targets.

Another key strategy is the establishment of Marine Protected Areas (MPAs), which provide refuges for fish populations to recover from overfishing and environmental pressures. MPAs are designated areas where fishing and other human activities are restricted or prohibited, allowing ecosystems to regenerate and support the long-term sustainability of fish stocks. In the U.S., MPAs play a crucial role in protecting vulnerable habitats and species, particularly in regions where commercial fishing is intense, such as the Pacific coast and Gulf of Mexico (Lubchenco & Grorud-Colvert, 2015). These areas contribute to biodiversity conservation while also enhancing the resilience of fisheries to climate change and other environmental challenges.

Adaptive management is another essential conservation strategy, allowing fisheries managers to adjust regulations and strategies based on real-time data and changing environmental conditions. Adaptive management involves continuous monitoring of fish stocks and ecosystems, enabling managers to respond to unexpected fluctuations in fish populations or environmental shifts. This flexibility is crucial for addressing uncertainties in fisheries management, particularly in the context of climate change, which is altering marine ecosystems and fish migration patterns (Hilborn, 2016). By incorporating adaptive management practices, U.S. fisheries are better equipped to maintain sustainability targets and promote long-term ecological health.

Table 8 outlines key conservation strategies used in U.S. fisheries management to achieve sustainability targets. Annual Catch Limits (ACLs) are science-based limits that prevent overfishing, contributing to the rebuilding of over 40 fish stocks since 2000. Marine Protected Areas (MPAs) provide designated zones where fishing is restricted, allowing ecosystems and fish populations to recover, enhancing biodiversity, and building resilience against environmental changes. Adaptive management enables real-time adjustments to fishing regulations based on continuous monitoring, particularly important in addressing uncertainties posed by climate change. These strategies, grounded in scientific assessments, play a crucial role in maintaining the ecological health and long-term sustainability of U.S. fisheries.

Table 8 Conservation Strategies and Sustainability Targets in U.S. Fisheries Management

Conservation Strategy	Description	Key Impact	References
Annual Catch Limits (ACLs)	Science-based limits set to prevent overfishing and maintain fish populations at sustainable levels	Led to rebuilding of over 40 fish stocks since 2000	NOAA Fisheries (2020), Rosenberg et al. (2018)
Marine Protected Areas (MPAs)	Designated areas where fishing is restricted to allow ecosystems and fish populations to recover	Contributes to biodiversity conservation and resilience to environmental changes	Lubchenco & Grorud-Colvert (2015)
Adaptive Management	Flexible approach allowing for real-time adjustments to management based on monitoring and environmental changes	Enables fisheries to adapt to uncertainties, particularly in the context of climate change	Hilborn (2016)

U.S. fisheries conservation strategies are built on a foundation of science-based decision-making, protected areas, and adaptive management. These strategies have proven effective in promoting sustainability and ensuring the health of marine ecosystems, enabling the continued economic and environmental benefits of U.S. fisheries.

4.2. Trade-offs Between Economic Growth and Conservation

Achieving a balance between economic growth and conservation is one of the most challenging aspects of fisheries management. U.S. fisheries contribute significantly to the national economy, supporting jobs, trade, and food security. However, these economic benefits often come into conflict with conservation goals, particularly when overfishing or habitat degradation threatens the long-term sustainability of fish populations and marine ecosystems. Fisheries managers are tasked with navigating these trade-offs by implementing policies that promote both economic productivity and environmental stewardship (Branch et al., 2013).

One of the primary trade-offs in fisheries management is between short-term economic gains and long-term sustainability. In many cases, the immediate economic pressures on fishing communities and industries can lead to overfishing, which may temporarily boost revenues but ultimately results in depleted stocks and reduced economic returns over time. The implementation of annual catch limits (ACLs) and other conservation measures has been crucial in addressing this trade-off, but these measures often face resistance from stakeholders concerned about reduced

fishing opportunities and income (Hilborn, 2016). To mitigate these concerns, some fisheries have adopted catch share programs, which allocate specific quotas to individual fishermen or communities, providing economic stability while promoting sustainable fishing practices.

Another trade-off involves the allocation of resources between commercial and recreational fisheries. Both sectors play important roles in the U.S. economy, but their interests and impacts on fish stocks can diverge. Commercial fisheries prioritize maximizing harvests for sale in domestic and international markets, while recreational fisheries focus on maximizing the fishing experience, which often involves larger individual catches. Managing this trade-off requires carefully balancing access to fish stocks between sectors to prevent overfishing while ensuring both economic growth and conservation (Cline et al., 2017; Forood 2024). For instance, some U.S. fisheries have successfully implemented seasonal closures and gear restrictions that minimize the environmental impact of both commercial and recreational fishing, allowing stocks to replenish while still supporting economic activities.

Finally, the trade-off between economic growth and conservation is further complicated by the effects of climate change. As ocean temperatures rise and ecosystems shift, fish populations are moving to new regions, impacting the distribution of fisheries resources. This shift presents challenges for traditional fisheries that rely on specific species and regions, leading to economic losses in some areas while creating new opportunities in others. Fisheries managers must adapt to these changes by developing flexible management plans that consider both the economic impacts of shifting stocks and the need to protect vulnerable species and ecosystems (Free et al., 2019). Climate-resilient fisheries management strategies, such as ecosystem-based approaches, are critical for ensuring that the trade-offs between economic growth and conservation are addressed in a way that supports long-term sustainability.

Table 8 highlights the key trade-offs fisheries managers face in balancing short-term economic gains with long-term sustainability, managing the competing interests of commercial and recreational fisheries, and addressing the impacts of climate change on fish populations. Immediate economic pressures often lead to overfishing, jeopardizing long-term stock health, while measures like Annual Catch Limits (ACLs) and catch share programs help mitigate these conflicts. Balancing resources between commercial and recreational fisheries requires strategies like seasonal closures and gear restrictions to prevent overfishing. Additionally, climate change shifts fish distributions, presenting both challenges and opportunities that demand flexible, ecosystem-based management approaches to ensure climate resilience and economic sustainability.

Table 9 Navigating Trade-offs Between Economic Growth and Conservation in U.S. Fisheries Management

Trade-Off	Description	Strategies	References
Short-term Economic Gains vs. Long-term Sustainability	Immediate economic pressures can lead to overfishing, boosting short-term revenues but threatening long-term stock sustainability	Annual Catch Limits (ACLs), catch share programs to balance economic stability with sustainable fishing	Branch et al. (2013), Hilborn (2016)
Commercial vs. Recreational Fisheries	Commercial fisheries prioritize harvest maximization, while recreational fisheries focus on larger individual catches; both require resource balancing to avoid overfishing	Seasonal closures, gear restrictions to minimize environmental impact while supporting both sectors	Cline et al. (2017)
Economic Growth vs. Climate Resilience	Climate change shifts fish populations, impacting traditional fisheries while creating new opportunities; managers must adapt to protect vulnerable species and maintain economic stability	Flexible management plans, ecosystem-based approaches to support climate-resilient fisheries	Free et al. (2019)

Managing the trade-offs between economic growth and conservation in U.S. fisheries requires a delicate balance of short-term economic pressures, resource allocation, and the long-term health of marine ecosystems. By implementing adaptive management strategies, catch share programs, and ecosystem-based approaches, fisheries managers can better navigate these trade-offs to achieve both economic and environmental sustainability.

5. Advances in Mathematical Modeling Techniques

Recent advances in mathematical modeling techniques have significantly enhanced the ability of fisheries managers to make informed decisions regarding sustainability and resource allocation. These innovations integrate complex data sets, including environmental variables, species interactions, and socioeconomic factors, enabling more accurate predictions of fish stock behavior and ecosystem dynamics. One of the most notable developments is the incorporation of machine learning and artificial intelligence (AI) into fisheries models, which can analyze vast amounts of data and identify patterns that traditional models might overlook (Zhang et al., 2018). These AI-driven models can account for non-linear relationships and complex environmental changes, improving the precision of stock assessments and management recommendations.

In addition to AI, spatial modeling techniques have become increasingly important for understanding the geographic distribution of fish populations and their habitats. Spatially explicit models, such as agent-based models and geostatistical approaches, allow managers to assess how environmental changes and fishing pressures affect different regions. These models help identify critical habitats, migration routes, and areas where fishing should be restricted to ensure sustainable stock levels. The use of spatial modeling has been particularly effective in designing Marine Protected Areas (MPAs) and other conservation measures that align with ecological and economic priorities (Punt et al., 2016). By integrating spatial dynamics, these models provide a more comprehensive view of fisheries ecosystems and support the development of adaptive management strategies.

Another significant advancement in mathematical modeling for fisheries management is the development of ecosystem-based models, which incorporate the entire ecosystem rather than focusing solely on target species. Ecosystem models, such as the Ecopath with Ecosim (EwE) model, integrate data on species interactions, trophic levels, and environmental factors to simulate the broader effects of fishing on marine ecosystems. These models are increasingly used to inform ecosystem-based fisheries management (EBFM), providing insights into how fishing activities influence ecosystem health and resilience (Coll et al., 2015). The ability to simulate complex food webs and ecosystem processes enables more sustainable management strategies that protect biodiversity while optimizing fishery yields.

Table 10 summarizes recent advances in mathematical modeling techniques that have revolutionized fisheries management. AI-driven models utilize machine learning to analyze large datasets and capture complex environmental changes, enhancing the precision of stock assessments. Spatial modeling techniques focus on the geographic distribution of fish populations and critical habitats, supporting the design of Marine Protected Areas (MPAs) and adaptive management strategies. Ecosystem-based models simulate species interactions and environmental factors, providing a comprehensive view of ecosystem impacts and informing sustainable management practices. Together, these innovations offer fisheries managers more accurate and comprehensive tools to balance economic growth with conservation.

Table 10 Innovative Mathematical Modeling Techniques in Fisheries Management: AI, Spatial, and Ecosystem Approaches

Modeling Technique	Description	Application	References
AI-Driven Models	Incorporates machine learning and AI to analyze large datasets, improving precision in stock assessments and capturing complex environmental changes	Enhances non-linear relationships and management recommendations	Zhang et al. (2018)
Spatial Modeling Techniques	Uses spatially explicit models to assess geographic distribution of fish populations, critical habitats, and migration routes	Supports the design of Marine Protected Areas (MPAs) and adaptive management strategies	Punt et al. (2016)
Ecosystem-Based Models	Simulates species interactions, trophic levels, and environmental factors to assess broader ecosystem impacts of fishing	Informs ecosystem-based fisheries management (EBFM), promoting biodiversity protection and sustainable yields	Coll et al. (2015)

Advances in mathematical modeling techniques, including AI-driven models, spatially explicit approaches, and ecosystem-based models, have revolutionized fisheries management. These innovations provide fisheries managers with more accurate and comprehensive tools to navigate the challenges of sustainable fisheries management in a rapidly changing environment. As these technologies continue to evolve, they will play an increasingly important role in supporting both economic growth and the conservation of marine ecosystems.

5.1. Policy Recommendations for Improved Management

Effective fisheries management requires not only the adoption of advanced mathematical models but also the implementation of robust policies that support sustainability goals. One of the key policy recommendations is to strengthen the integration of ecosystem-based management (EBM) into fisheries governance. EBM shifts the focus from managing individual fish stocks to considering the broader ecosystem, including species interactions, habitat health, and external environmental factors such as climate change (Pikitch et al., 2004). To improve the sustainability of U.S. fisheries, federal and regional regulatory bodies must prioritize the development of policies that mandate ecosystem-based approaches across all fisheries, ensuring that the long-term health of marine ecosystems is maintained alongside economic growth.

Another important policy recommendation is to enhance the adaptability of fisheries management systems. Climate change and environmental variability present significant challenges to the long-term sustainability of fisheries, as they can alter fish population distributions, migration patterns, and reproductive cycles. As a result, policies must encourage adaptive management strategies that allow for real-time adjustments based on new scientific data and changing environmental conditions (Pinsky et al., 2018). Establishing adaptive frameworks, such as dynamic harvest control rules and flexible quota systems, can help managers respond to these changes more effectively. Additionally, promoting the use of advanced data collection tools, such as remote sensing and electronic monitoring, will improve the accuracy of stock assessments and allow for more timely policy interventions.

Furthermore, improving stakeholder engagement is critical to successful fisheries management. Policies must emphasize inclusive decision-making processes that involve fishers, scientists, conservation groups, and local communities. Collaborative governance approaches ensure that management strategies are informed by the practical knowledge of those directly affected by regulations, increasing compliance and reducing conflicts (Jentoft & Chuenpagdee, 2009). For instance, co-management frameworks that give fishers a stake in the sustainability of the fisheries they depend on can promote better stewardship and adherence to conservation measures. By fostering cooperation among stakeholders, fisheries policies can better balance economic and conservation goals, achieving more sustainable outcomes.

Policy recommendations for improved fisheries management include integrating ecosystem-based approaches, adopting adaptive management strategies, and enhancing stakeholder engagement. These measures, when combined with the latest advances in mathematical modeling and data collection, will support more resilient and sustainable fisheries management practices that align with both ecological and economic objectives.

5.2. Toward a Sustainable Future for U.S. Fisheries

The future of U.S. fisheries depends on the successful integration of sustainable practices, advanced technologies, and comprehensive management strategies that balance economic productivity with environmental conservation. As the impacts of climate change and overfishing become more pronounced, it is critical for fisheries management to evolve in response to these challenges. A sustainable future for U.S. fisheries will require continued innovation in mathematical modeling, ecosystem-based management, and adaptive governance frameworks (Hilborn, 2016).

One of the key areas of focus moving forward is the need for more resilient fisheries management systems that can adapt to changing environmental conditions. Climate change is altering ocean temperatures, currents, and ecosystems, which, in turn, affect fish populations and their habitats. To address these changes, fisheries management must incorporate climate-resilient strategies that include predictive modeling of climate impacts, dynamic quota systems, and flexible conservation measures (Free et al., 2019). These strategies will enable fisheries to adjust to shifting conditions and ensure long-term sustainability.

Furthermore, advancing technological innovation will play a significant role in the future of sustainable fisheries. The use of artificial intelligence (AI), machine learning, and remote sensing technology can greatly enhance data collection and analysis, allowing for more precise stock assessments and improved monitoring of fishing activities. Real-time data analytics can help managers make quicker decisions, ensuring that fisheries operate within sustainable limits while

minimizing environmental impacts (Zhang et al., 2018). By embracing technological advancements, U.S. fisheries can enhance their efficiency and accuracy, leading to more informed and sustainable management practices.

A sustainable future for U.S. fisheries also hinges on the promotion of inclusive and collaborative governance models. Involving diverse stakeholders, from fishers to conservation organizations, in the decision-making process is essential for achieving sustainable outcomes. Co-management frameworks that give stakeholders a voice in developing and implementing fisheries policies can foster better compliance and stewardship (Jentoft & Chuenpagdee, 2009). Ensuring that management strategies are equitable and transparent will promote long-term buy-in from all parties, contributing to both ecological conservation and economic stability.

Figure 7 illustrates the core strategies necessary to ensure a sustainable future for U.S. fisheries. The central goal is to balance economic productivity with environmental conservation through three major areas: climate-resilient management, technological innovation, and inclusive governance. Climate resilience focuses on adapting fisheries management to environmental changes, utilizing predictive climate modeling, dynamic quotas, and flexible conservation measures. Technological innovation, such as AI and real-time data analytics, enhances the precision and responsiveness of fisheries management. Inclusive governance promotes stakeholder involvement and transparent strategies to foster collaboration, ensuring both ecological sustainability and economic prosperity.

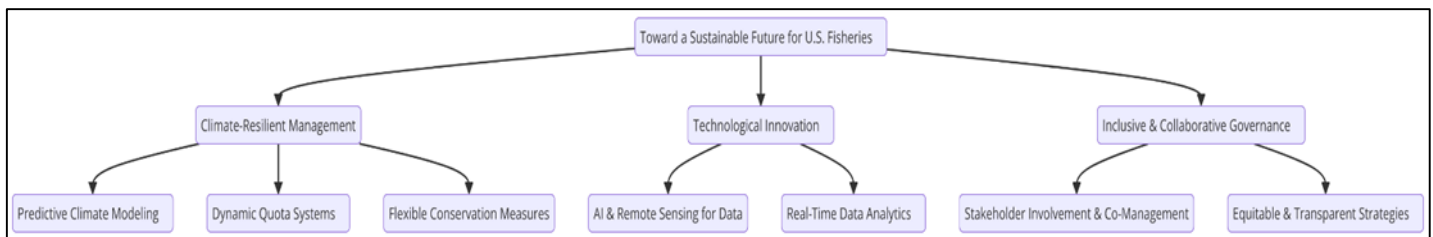


Figure 10 Key Strategies for a Sustainable Future in U.S. Fisheries

To express a model for the sustainable future of U.S. fisheries in a mathematical equation, we would need to integrate various factors such as environmental resilience, economic productivity, and adaptive management into a functional form.

The components of the model can be broken down into measurable variables:

- **Sustainability (S)**: Overall sustainability of the fishery, which depends on several factors:
- **Resilience (R)**: The ability of the fishery to adapt to environmental changes, especially climate change.
- **Technological Innovation (T)**: The efficiency gained from technologies like AI, machine learning, and real-time data.
- **Governance (G)**: The effectiveness of inclusive governance and stakeholder involvement.
- **Fish Stock Health (F)**: Measured by stock abundance, influenced by management strategies like dynamic quotas and conservation measures.
- **Economic Benefit (E)**: Profitability, balanced with sustainability efforts.

We can represent the sustainability equation as follows:

$$S = \alpha R + \beta T + \gamma G + \delta F + \epsilon$$

Where:

$\alpha, \beta, \gamma, \delta, \epsilon$ are the weights or coefficients that determine the relative importance of each factor in the overall sustainability equation.

Each of the components (R, T, G, F, E) can be further broken down into their contributing variables, such as:

R (Resilience) might include factors like predictive modeling (PM) and adaptive measures (AM):

$$R = PM + AM$$

T (Technological Innovation) could depend on advancements like AI (AI) and real-time analytics (RT):

$$T = AI + RT$$

This model integrates key factors contributing to a sustainable future for U.S. fisheries, where sustainability is influenced by resilience to climate change, technological innovation, governance, fish stock health, and economic benefits. Each factor could be modeled with more detailed equations depending on the specific dynamics in play.

The path toward a sustainable future for U.S. fisheries requires a combination of adaptive management, technological innovation, and collaborative governance. By leveraging these tools, fisheries managers can ensure that U.S. fisheries remain productive and resilient in the face of environmental and economic challenges. These efforts will ultimately support both the long-term health of marine ecosystems and the continued prosperity of the fishing industry.

6. Conclusion

Sustainable fisheries management in U.S. waters is a multifaceted endeavor that requires balancing economic growth with the long-term conservation of marine ecosystems. Mathematical models play a pivotal role in guiding fisheries managers by providing scientific insights into fish population dynamics, economic trade-offs, and ecosystem interactions. From population dynamics and bioeconomic models to ecosystem-based approaches, these tools have significantly contributed to more informed and sustainable decision-making. However, challenges such as data limitations, environmental variability, and the complexities of adaptive management still pose obstacles to achieving sustainability targets.

Advances in technology, including artificial intelligence, machine learning, and spatial modeling, have opened new possibilities for more precise and effective fisheries management. These innovations, when integrated into policy frameworks that promote ecosystem-based and adaptive management, can help ensure the resilience of fisheries in the face of climate change and other environmental pressures. Additionally, inclusive governance models that involve stakeholders in decision-making processes will enhance compliance and stewardship, leading to more sustainable outcomes.

As U.S. fisheries continue to evolve, it is essential to prioritize sustainability, not only for the protection of marine resources but also for the continued prosperity of the fishing industry and the livelihoods that depend on it. By embracing advanced modeling techniques, adaptive strategies, and collaborative governance, the future of U.S. fisheries can be both economically productive and environmentally sustainable.

Compliance with ethical standards

Disclosure of conflict of interest

No conflict of interest to be disclosed.

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