Gulf menhaden (Brevoortia patronus) in the U.S. Gulf of Mexico:
Fishery characteristics and biological reference points for management

## SEDAR27-RD-08



# Gulf menhaden (Brevoortia patronus) in the U.S. Gulf of Mexico: Fishery characteristics and biological reference points for management 

Douglas S. Vaughan*, Kyle W. Shertzer, Joseph W. Smith<br>Southeast Fisheries Science Center, NOAA Center for Coastal Fisheries and Habitat Research, 101 Pivers Island Road, Beaufort, NC 28516, USA

Received 1 February 2006; received in revised form 25 September 2006; accepted 8 October 2006


#### Abstract

Gulf menhaden, Brevoortia patronus, plays a key ecological role in the northern Gulf of Mexico and supports the second largest commercial fishery by weight in the United States. Here we describe that fishery and propose biological reference points (BRPs) for its management. The BRPs represent targets and limits of both fishing mortality rate $(F)$ and population fecundity $(\Psi)$, where target is defined as the management goal, and limit, a value to be avoided ( $F<F_{\text {Limit }}$ and $\Psi>\Psi_{\text {Limit }}$ ). We assess stock status relative to the BRPs by fitting a statistical catch-age model to fishery-dependent and fishery-independent data spanning 1964-2004. Results indicate that in the terminal year neither limit reference point is exceeded $\left(F_{2004} / F_{\text {Limit }}=0.75\right.$ and $\left.\Psi_{2004} / \Psi_{\text {Limit }}=1.86\right)$. Of possible concern, however, is a recent increase in fishing mortality and decrease in population fecundity. With these trends, terminal values exceed their targets $\left(F_{2004} / F_{\text {Target }}=1.16\right.$ and $\left.\Psi_{2004} / \Psi_{\text {Target }}=0.93\right)$, although by little relative to uncertainty in the estimates. Sensitivity analyses show these results are robust to model assumptions. Published by Elsevier B.V.


Keywords: Biological reference points; Brevoortia patronus; Fishery management; Gulf menhaden; Stock assessment

## 1. Introduction

Gulf menhaden, Brevoortia patronus, is a small (generally $<22 \mathrm{~cm}$ fork length), euryhaline clupeid fish found in coastal waters of the northern Gulf of Mexico (Nelson and Ahrenholz, 1986; Christmas et al., 1988). The species ranges from Cape Sable, Florida to Veracruz, Mexico (Reintjes, 1969), although it is most abundant from the Florida Panhandle to eastern Texas. During spring through fall, gulf menhaden form dense, nearsurface schools, which are exploited by a large, industrial purseseine fishery.

As obligate filter feeders, menhaden strain plankton and detritus through an elaborate network of gill rakers attached to the branchial basket (Friedland, 1985). Menhaden themselves are a principal forage food for piscivorous fishes, sea birds, and marine mammals (Ahrenholz, 1991), thus providing a key link between primary producers and secondary consumers.

Although no major longitudinal migrations are known to occur (Pristas et al., 1976; Ahrenholz, 1981), gulf menhaden tend to move inshore in early spring and up to 80 km offshore in

[^0]late fall (Roithmayr and Waller, 1963). Spawning occurs October through March and peaks offshore in December and January (Lewis and Roithmayr, 1981). Eggs hatch at sea, and larvae are carried by currents to inland waters, where they metamorphose into juveniles. Gulf menhaden spend their first summer in estuaries, then migrate offshore by late fall. The following spring, they move back into coastal waters.

The gulf menhaden fishery dates to the late 1800s (Nicholson, 1978). Records prior to World War II are fragmentary, but annual landings during 1918-1944 probably ranged 2000-12,000t (Nicholson, 1978). For the 1948 fishing season, Nicholson (1978) documented landings of $103,000 \mathrm{t}$. Chapoton (1970, 1971) cited a general trend of increased landings from the late 1940s through 1970, noting a peak of $521,500 \mathrm{t}$ in 1969. Landings continued to increase through the 1970s and 1980s, exceeding $800,000 \mathrm{t}$ for six consecutive years (1982-1987) and culminating at $982,800 \mathrm{t}$ in 1984 (Smith, 1991). Since 1988, landings have ranged from $421,400 \mathrm{t}$ (1992) to $761,600 \mathrm{t}$ (1994), showing no apparent trends (Table 1). With current landings of $468,736 \mathrm{t}$ (2004) comprising $11 \%$ of all U.S. landings, gulf menhaden supports the second largest commercial fishery in the United States (NMFS, 2005).

The fishery is conducted by a fleet of large (up to 60 m ) purseseine vessels from ports in Mississippi and Louisiana (Smith,

Table 1
Number of plants, number of vessels, nominal fishing effort of the reduction fishery (vessel-tonne-weeks, v-t-wks), landings, and effective sample size, 1964-2004

| Fishing year | No. of reduction plants | No. of vessels | Nominal effort (1000 v-t-wks) | Landings of reduction fishery (1000 t) | Nominal catch/effort of reduction fishery | Landings of bait fishery (1000t) ${ }^{\text {a }}$ | Total landings $(1000 \mathrm{t})$ | Effective sample size, $n_{t}$ (no. fish/10) ${ }^{\text {b }}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1964 | 11 | 78 | 272.9 | 407.8 | 1.49 | 1.2 | 409.0 | 613 |
| 1965 | 13 | 87 | 335.6 | 461.2 | 1.37 | 1.2 | 462.4 | 759 |
| 1966 | 13 | 92 | 381.3 | 357.6 | 0.94 | 1.2 | 358.8 | 621 |
| 1967 | 13 | 85 | 404.7 | 316.1 | 0.78 | 1.2 | 317.3 | 703 |
| 1968 | 14 | 78 | 382.8 | 371.9 | 0.97 | 1.2 | 373.1 | 764 |
| 1969 | 13 | 75 | 411.0 | 521.5 | 1.27 | 1.2 | 522.7 | 738 |
| 1970 | 13 | 76 | 400.0 | 545.9 | 1.36 | 1.2 | 547.1 | 520 |
| 1971 | 13 | 85 | 472.9 | 728.5 | 1.54 | 1.2 | 729.7 | 383 |
| 1972 | 11 | 75 | 447.5 | 501.9 | 1.12 | 1.2 | 503.1 | 989 |
| 1973 | 10 | 66 | 426.2 | 486.4 | 1.14 | 1.2 | 487.6 | 895 |
| 1974 | 10 | 71 | 485.5 | 587.4 | 1.21 | 1.2 | 588.6 | 1009 |
| 1975 | 11 | 78 | 538.0 | 542.6 | 1.01 | 1.2 | 543.8 | 953 |
| 1976 | 11 | 82 | 575.8 | 561.2 | 0.97 | 1.2 | 562.4 | 1339 |
| 1977 | 11 | 80 | 532.7 | 447.1 | 0.84 | 1.2 | 448.3 | 1490 |
| 1978 | 11 | 80 | 574.3 | 820.0 | 1.43 | 1.2 | 821.2 | 1294 |
| 1979 | 11 | 78 | 533.9 | 777.9 | 1.46 | 1.2 | 779.1 | 1112 |
| 1980 | 11 | 79 | 627.6 | 701.3 | 1.12 | 1.0 | 702.3 | 988 |
| 1981 | 11 | 80 | 623.0 | 552.6 | 0.89 | 1.1 | 553.7 | 1027 |
| 1982 | 11 | 82 | 653.8 | 853.9 | 1.31 | 1.6 | 855.5 | 1034 |
| 1983 | 11 | 81 | 655.8 | 923.5 | 1.41 | 1.7 | 925.2 | 1452 |
| 1984 | 11 | 81 | 645.9 | 982.8 | 1.52 | 2.3 | 985.1 | 1594 |
| 1985 | 7 | 73 | 560.6 | 881.1 | 1.57 | 3.0 | 884.1 | 1323 |
| 1986 | 8 | 72 | 606.5 | 822.1 | 1.36 | 8.5 | 830.6 | 1649 |
| 1987 | 8 | 75 | 604.2 | 894.2 | 1.48 | 17.3 | 911.5 | 1646 |
| 1988 | 8 | 73 | 594.1 | 623.7 | 1.05 | 16.0 | 639.7 | 1240 |
| 1989 | 9 | 77 | 555.3 | 569.6 | 1.03 | 13.5 | 583.1 | 1395 |
| 1990 | 9 | 75 | 563.1 | 528.3 | 0.94 | 11.1 | 539.4 | 1146 |
| 1991 | 7 | 58 | 472.3 | 544.3 | 1.15 | 8.6 | 552.9 | 1138 |
| 1992 | 6 | 51 | 408.0 | 421.4 | 1.03 | 10.9 | 432.3 | 1421 |
| 1993 | 6 | 52 | 455.2 | 539.2 | 1.18 | 12.0 | 551.2 | 1458 |
| 1994 | 6 | 55 | 472.0 | 761.6 | 1.61 | 9.9 | 771.5 | 1606 |
| 1995 | 6 | 52 | 417.0 | 463.9 | 1.11 | 8.1 | 472.0 | 1349 |
| 1996 | 5 | 51 | 451.7 | 479.4 | 1.06 | 9.0 | 488.4 | 1212 |
| 1997 | 5 | 52 | 430.2 | 611.2 | 1.42 | 8.8 | 620.0 | 992 |
| 1998 | 5 | 50 | 409.3 | 486.2 | 1.19 | 10.0 | 496.1 | 904 |
| 1999 | 5 | 55 | 414.5 | 684.3 | 1.65 | 9.8 | 694.1 | 1064 |
| 2000 | 4 | 47 | 417.6 | 579.3 | 1.39 | 4.3 | 583.6 | 838 |
| 2001 | 4 | 44 | 400.6 | 521.3 | 1.30 | 6.4 | 527.7 | 622 |
| 2002 | 4 | 43 | 386.7 | 574.5 | 1.49 | 7.5 | 582.0 | 560 |
| 2003 | 4 | 42 | 363.2 | 517.1 | 1.42 | 6.6 | 523.7 | 784 |
| 2004 | 4 | 42 | 390.5 | 468.7 | 1.20 | 4.5 | 473.2 | 664 |

${ }^{\text {a }}$ Average bait landings in 1980-1982 are used to represent the small amount of unknown bait landings in 1964-1979. Bait landings in 2004 are preliminary, as they do not include the typically trivial amount of landings from November to December.
${ }^{\text {b }}$ Sample size in 1964-1971 was 20 fish, thus $n_{t}$ for the period was no. fish/20.
1991). Coastal in nature, the fishery harvests up to $93 \%$ of its catch from within 16 km of the shoreline (Smith et al., 2002). One Gulf Coast state, Louisiana, dominates the harvest, with up to $92 \%$ of the annual catch in recent years. Shore-side reduction factories process the fish into meal, oil, and soluble products. In addition, a small purse-seine fishery for gulf menhaden as bait exists in Louisiana, but its landings are dwarfed by those of the reduction fishery.

Management of the fishery is by interstate agreement through the Gulf States Marine Fisheries Commission (Vanderkooy and Smith, 2002). The fishing season extends from the third Monday in April through November 1. Purse-seining for menhaden has been prohibited by Florida since 1995 and by Alabama since

2003, but remains legal with restrictions in territorial waters of Mississippi, Louisiana, and Texas (Vanderkooy and Smith, 2002).

Historically, up to 14 reduction plants (in 1968, Table 1) processed gulf menhaden (Nicholson, 1978), but the number of plants stabilized at 11 in 1975-1984 (Smith et al., 1987). Several ports, such as Cameron, Empire, and Moss Point, supported multiple factories owned by various companies. Beginning in 1985, corporate acquisitions and company downsizing reduced the number of menhaden processing facilities to eight by 1986, six by 1992, and four by 2000 (Vanderkooy and Smith, 2002). Since 2000 , a single company has dominated the fishery, operating three of the four extant plants in the northern Gulf.

Commensurate with the decline in fish plants has been the reduction in number of gulf menhaden purse-seine vessels. Fleet size peaked at 82 vessels in 1982 (Vanderkooy and Smith, 2002). Several downsizings followed: to 73 vessels in 1985, to 58 vessels in 1991, and to 47 vessels in 2000 (Table 1). In 2004, 41 vessels unloaded gulf menhaden for reduction at four Gulf ports (Abbeville, Cameron, Empire, and Moss Point).

Nominal or observed fishing effort in the gulf menhaden fishery is measured in vessel-tonne-weeks ( $\mathrm{v}-\mathrm{t}-\mathrm{wks}$ ), defined as a vessel's net tonnage times the number of weeks that vessel unloaded fish at least one day (Smith, 1991). Nominal effort peaked at 655,800 v-t-wks in 1983, the year prior to peak landings. In general, observed landings have tracked effort over the past four decades (Table 1).

Capture of gulf menhaden for use as bait has constituted only a small fraction of total landings (Vanderkooy and Smith, 2002). Bait landings occurred almost exclusively in Florida (mainly from Tampa Bay and the Panhandle areas) until the late 1980s, when Louisiana and Alabama began landing substantial quantities. Louisiana became the principal state for bait landings after Florida banned most commercial net gear in 1995. Landings for bait peaked at about $17,000 \mathrm{t}$ in the late 1980 s, and since the 1990s, have averaged about 9000 t annually (Table 1).

The U.S. National Marine Fisheries Service has monitored the gulf menhaden fishery since 1964, collecting information on daily landings, nominal fishing effort, and size and age compositions of the catch (Nicholson, 1978; Smith et al., 1987). Here we use these data and others to assess status of the stock and fishery. Previous stock assessments have summarized fisherydependent data from earlier decades (Nelson and Ahrenholz, 1986; Vaughan, 1987; Vaughan et al., 1996, 2000). This assessment is the first to include a fishery-independent index of abundance and to propose biological reference points for managing the economically and ecologically important stock of gulf menhaden.

## 2. Methods

To assess the status of gulf menhaden, we developed a statistical catch-age model (Deriso et al., 1985; Quinn and Deriso, 1999), fit to data from the fishery and from fishery-independent surveys. The model provided estimates of population fecundity and age-specific fishing mortality rates for 1964-2004. We compared those values to target and limit reference points to estimate status of stock and fishery.

### 2.1. Fishery data

Daily vessel unloads are reported monthly to the National Marine Fisheries Service. Sampling error in landings, as measured by the coefficient of variation (CV), has been estimated ${ }^{1}$ to be about $4 \%$. Landings for bait are generally monitored by state agencies. Since 1980, bait landings have averaged about $1.2 \%$

[^1]of the total menhaden landings (Vanderkooy and Smith, 2002). Rather than treating bait and reduction landings as separate, we combined them into a single time series.

Biostatistical sampling of the reduction fishery is based on a two-stage, cluster design, applied since 1964 across the geographic and temporal range of the fishery (Chester, 1984). The first cluster represents the number of vessels (or purse-seine sets), and the second cluster represents fish sampled per vessel. Under current protocol, a port agent randomly selects a vessel at dockside, and then randomly selects 10 fish (20 in 1964-1971) from the top of the fish hold. Each of these fish is measured for fork length (mm) and weight (g), and a scale patch is removed for ageing (Nicholson and Schaaf, 1978). The sample is not assumed to represent the entire fish hold, but rather the last purse-seine set of the fishing day. In recent years, about 6700 fish have been processed annually. Typically, $90 \%$ or more of the annual catch consists of age-1 and age-2 gulf menhaden (Nicholson, 1978; Smith et al., 1987). At the end of the fishing season, biostatistical data are merged with landings on a port-week basis to produce estimated landings at age (in numbers). Estimates are summed over all port-weeks for the entire fishing season to produce annual estimates of total landings at age (Table 2). These annual estimates were treated as data for fitting the assessment model.

### 2.2. Fishery-independent index of juvenile abundance

We developed an index of juvenile abundance using catch-per-unit-effort data collected by field biologists in Mississippi, Louisiana, and Texas. (No index of adult abundance could be developed, as adult menhaden are not well represented in any fishery-independent surveys.) Sampling methods varied by state. In Mississippi ${ }^{2}$, data were collected 1974-2004 using 16-ft trawl, 50-ft bag seine, and beam plankton net; in Louisana, data were collected 1967-2004 using otter trawls (Perret et al., 1971); in Texas, data were collected 1978-2004 using bag seines (Martinez-Andrade et al., 2005). Analyses were restricted to data from primary sampling months of each survey (February through July for Mississippi, January through July for Louisana, and March through September for Texas).

Data were scaled using a two-step process. First, catch-per-unit-effort data from each gear were standardized to their means. Second, these standardized values were weighted by state according to area and productivity of streams across the northern Gulf of Mexico, as estimated by Ahrenholz et al. (1989). The applied weights represented each state's contribution to total juvenile abundance: $1.9 \%$ for Mississippi, $52.2 \%$ for Louisiana, and $45.9 \%$ for Texas. Standardized values of catch-per-unit-effort from each state were multiplied by that state's proportional contribution.

These data were combined into a single, coast-wide index via a generalized linear model (Hardin and Hilbe, 2001). The

[^2]Table 2
Estimated catch in numbers at age (in million fish) from the gulf menhaden reduction fishery, 1964-2004

| Year | 0 | 1 | 2 | 3 | 4 | 5 | 6 | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1964 | 2.8 | 3329.3 | 1495.2 | 118.1 | 4.4 | 0.0 | 0.0 | 4949.6 |
| 1965 | 43.4 | 5031.4 | 1076.6 | 80.3 | 0.7 | 0.0 | 0.0 | 6232.4 |
| 1966 | 30.5 | 3314.4 | 865.2 | 33.8 | 0.3 | 0.0 | 0.0 | 4244.1 |
| 1967 | 22.4 | 4267.7 | 337.7 | 13.0 | 0.0 | 0.0 | 0.0 | 4640.8 |
| 1968 | 65.1 | 3475.2 | 1001.3 | 37.5 | 0.5 | 0.0 | 0.0 | 4579.5 |
| 1969 | 20.8 | 6075.0 | 1286.3 | 31.7 | 0.0 | 0.0 | 0.0 | 7413.8 |
| 1970 | 50.2 | 3279.9 | 2280.0 | 36.1 | 0.0 | 0.0 | 0.0 | 5646.1 |
| 1971 | 21.6 | 5761.1 | 1955.5 | 181.8 | 4.1 | 0.0 | 0.0 | 7924.1 |
| 1972 | 19.1 | 3047.7 | 1733.5 | 88.5 | 4.0 | 0.0 | 0.0 | 4893.0 |
| 1973 | 49.9 | 3033.0 | 1107.0 | 99.6 | 1.3 | 0.0 | 0.0 | 4290.8 |
| 1974 | 1.4 | 3846.8 | 1471.7 | 59.1 | 0.0 | 0.0 | 0.0 | 5378.9 |
| 1975 | 108.8 | 2440.5 | 1499.2 | 461.8 | 0.2 | 0.0 | 0.0 | 4510.5 |
| 1976 | 0.0 | 4591.4 | 1373.9 | 203.9 | 0.0 | 0.0 | 0.0 | 6169.3 |
| 1977 | 0.0 | 4660.0 | 1331.7 | 110.4 | 5.6 | 0.0 | 0.0 | 6107.7 |
| 1978 | 0.0 | 6787.4 | 2742.0 | 52.7 | 5.2 | 0.0 | 0.0 | 9587.4 |
| 1979 | 0.0 | 4701.2 | 2877.2 | 337.2 | 6.1 | 0.8 | 0.0 | 7922.4 |
| 1980 | 65.9 | 3409.4 | 3261.1 | 436.2 | 46.3 | 1.6 | 0.0 | 7220.4 |
| 1981 | 0.0 | 5750.5 | 1424.9 | 329.4 | 29.7 | 3.3 | 1.2 | 7539.1 |
| 1982 | 0.0 | 5146.7 | 3302.0 | 503.5 | 58.5 | 2.1 | 1.7 | 9014.5 |
| 1983 | 0.0 | 4685.7 | 3809.2 | 382.6 | 23.8 | 1.3 | 0.0 | 8902.7 |
| 1984 | 0.0 | 7749.6 | 2881.5 | 438.4 | 49.0 | 0.7 | 0.0 | 11119.2 |
| 1985 | 0.0 | 8682.7 | 2498.6 | 233.7 | 36.5 | 0.0 | 0.0 | 11451.6 |
| 1986 | 0.0 | 4276.0 | 4892.0 | 174.9 | 25.8 | 1.0 | 0.0 | 9369.7 |
| 1987 | 0.0 | 6699.5 | 3975.6 | 427.8 | 12.5 | 0.0 | 0.0 | 11115.3 |
| 1988 | 0.0 | 5337.7 | 2581.4 | 151.5 | 18.0 | 0.0 | 0.0 | 8088.5 |
| 1989 | 0.0 | 5550.4 | 1622.0 | 67.0 | 2.1 | 0.0 | 0.0 | 7241.5 |
| 1990 | 0.0 | 3889.2 | 1785.0 | 136.2 | 13.1 | 0.3 | 0.4 | 5824.4 |
| 1991 | 0.0 | 2217.5 | 2339.9 | 215.6 | 28.2 | 2.5 | 0.0 | 4803.7 |
| 1992 | 0.0 | 2187.3 | 1505.8 | 197.1 | 24.2 | 1.7 | 0.2 | 3916.2 |
| 1993 | 0.0 | 3492.8 | 1532.9 | 193.5 | 15.7 | 2.8 | 0.2 | 5237.9 |
| 1994 | 0.0 | 3627.6 | 3195.6 | 441.2 | 49.0 | 3.7 | 0.0 | 7317.0 |
| 1995 | 0.0 | 1369.2 | 2423.4 | 99.7 | 3.9 | 0.2 | 0.0 | 3896.3 |
| 1996 | 0.0 | 1784.2 | 2513.7 | 251.1 | 16.8 | 0.9 | 0.0 | 4566.8 |
| 1997 | 0.0 | 3235.6 | 2398.8 | 276.1 | 38.2 | 1.3 | 0.0 | 5950.0 |
| 1998 | 0.0 | 1804.8 | 2587.1 | 189.7 | 15.2 | 1.6 | 0.0 | 4598.4 |
| 1999 | 0.0 | 3368.8 | 2393.0 | 416.9 | 19.7 | 0.0 | 0.0 | 6198.3 |
| 2000 | 0.0 | 2029.8 | 3164.5 | 347.7 | 62.5 | 3.4 | 0.0 | 5607.9 |
| 2001 | 0.0 | 987.7 | 2654.2 | 290.2 | 18.9 | 0.8 | 0.0 | 3951.7 |
| 2002 | 0.0 | 1585.6 | 2863.1 | 534.0 | 17.1 | 0.0 | 0.0 | 4999.8 |
| 2003 | 0.0 | 1910.1 | 3011.7 | 339.6 | 13.4 | 0.0 | 0.0 | 5274.7 |
| 2004 | 0.0 | 2799.4 | 1764.0 | 400.3 | 37.6 | 0.0 | 0.0 | 5001.3 |

model's explanatory variables were year, month, area, and gear; and the response variable - catch-per-unit-effort - was assumed distributed with delta-lognormal error structure (Lo et al., 1992; Maunder and Punt, 2004). This structure models the proportion of positive catches with binomial error, and catch-per-unit-effort of successful trips with lognormal error. Annual coefficients of variation were estimated by empirical bootstrap with 1000 replicates (Efron and Tibshirani, 1993).

### 2.3. Life-history information

The assessment model included life-history information on growth, maturity, fecundity, and natural mortality. We modeled growth in fork length using the von Bertalanffy equation, with year-specific parameters estimated from biostatistical data of the reduction fishery. Using these same data, we estimated yearspecific parameters ( $\alpha_{t}$ and $\beta_{t}$ ) of the weight-length relationship,
$w_{a, t}=\alpha_{t} l_{a, t}^{\beta_{t}}$, where $w_{a, t}$ is weight $(\mathrm{g})$ at age and $l_{a, t}$ is fork length $(\mathrm{mm})$ at age in the middle of year $t$. Although length and weight at age varied annually, they showed no particular trends across years.

Maturity and fecundity information were provided by Lewis and Roithmayr (1981). Maturity at age was estimated to be knife-edge, with full maturity occurring at age-2 (Table 3). Annual fecundity at age $\left(\psi_{a, t}\right)$ was computed from length at age, $\psi_{a, t}=0.0000516 \times l_{a, t}^{3.8775}$, using lengths at the beginning of each calendar year.

Age-specific natural mortality rates $\left(M_{a}\right)$ were assumed to decline with increasing weight, following the method of Boudreau and Dickie (1989). These age-specific rates were then scaled to adult natural mortality using estimates from tagging data (Ahrenholz, 1981). Ahrenholz (1981) reported a mean, upper, and lower estimate of adult natural mortality (Table 3).

Table 3
Age-specific natural mortality rate and proportion of mature females

| Age | Natural mortality rate |  |  |  | Proportion females mature |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Scaled to lower value | Scaled to mean value | Scaled to upper value | Constant | Knife-edge | Gradual |
| 0 | 1.34 | 2.10 | 3.06 | 1.10 | 0.00 | 0.00 |
| 1 | 0.97 | 1.53 | 2.23 | 1.10 | 0.00 | 0.20 |
| 2 | 0.81 | 1.27 | 1.84 | 1.10 | 1.00 | 1.00 |
| 3-6+ | 0.70 | 1.10 | 1.60 | 1.10 | 1.00 | 1.00 |

Base model used natural mortality rate scaled to mean value and knife-edge female maturity. Age-dependent natural mortality rates estimated using the method of Boudreau and Dickie (1989), rescaled to tagging estimates from Ahrenholz (1981).

### 2.4. Assessment model

The statistical catch-age model (detailed in Table 4) was fit by maximum likelihood to the data-juvenile abundance index, fishery landings, and age compositions-beginning in 1964, the first year of biostatistical sampling. Estimated quantities included a spawner-recruit relationship, a scaling parameter of the juvenile abundance index, fishery selectivities, annual fishing mortality rate, and annual population fecundity. Separate selectivities were estimated for two periods, 1964-1975 and 1976-2004, to account for an apparent change in the fishery. As recognized by Vaughan et al. (1996), the catch matrix in the earlier period comprised age classes $0-3$, and in the later period, age classes $1-4+$. This shift may have occurred due to changes in ageing techniques, mesh size, or fishing locations.

The spawner-recruit relationship was quantified using the Beverton-Holt model (Beverton and Holt, 1957) with lognormal deviation to predict recruitment from population fecundity. In many assessments, reliable information on population fecundity is unavailable, and spawning stock biomass gets used in its place, under the evidence or assumption that egg production scales linearly with body weight. When it does not, use of spawning stock biomass introduces error to the spawner-recruit model (Rothschild and Fogarty, 1989). In gulf menhaden, egg production at age increases more quickly than body weight at age, and thus spawning stock biomass would underplay reproductive capacity. This source of error was avoided altogether, by using population fecundity directly.

Uncertainty in estimates of management quantities-fishing mortality rate and population fecundity-was computed from the inverse Hessian matrix. This approach is common in assessment models fit by maximum likelihood (Booth and Quinn, 2006). It assumes that parameter values are asymptotically normally distributed and does not include uncertainty in model specification.

We defined a base model assuming knife-edge maturity (Table 3 ), mean natural mortality (Table 3), and the Beverton-Holt spawner-recruit relationship. Effects of these assumptions and retrospective error on estimated stock status were examined via sensitivity and retrospective analyses.

### 2.5. Sensitivity and retrospective analyses

Sensitivity and retrospective analyses were implemented as variations of the base model. Sensitivity analyses were used
to quantify the influences of biological inputs, including the spawner-recruit relationship (Beverton-Holt or Ricker), the natural mortality schedule ( $M_{a}$ scaled high, medium, or low; or constant across age), and the maturity schedule (knife-edge or gradual). Retrospective analyses were used to quantify potential error in terminal-year estimates (Cadrin and Vaughan, 1997), examined by sequentially truncating the last year of data (2003, 2002, 2001, 2000). Overall, we fit 10 different models (Table 5) to estimate status of stock and fishery.

### 2.6. Biological reference points

Biological reference points are benchmarks against which to measure stock or fishery status. They usually serve as targets or limits, where a target represents a long-term management goal, and a limit is a value to be avoided. The distance between target and limit acts as a buffer to prevent frequent overexploitation.

Reference points have not previously been applied to management of gulf menhaden. We therefore propose target and limit reference points, based here on per recruit analysis (Sissenwine and Shepherd, 1987; Gabriel et al., 1989; Caddy and Mahon, 1995). Per-recruit reference points have been found useful proxies for MSY-based values when the spawner-recruit relationship shows considerable noise, as with gulf menhaden (Vaughan et al., 2000).

The proposed reference points (Table 4) are similar to those used for management of Atlantic menhaden (ASMFC, 2004). They represent targets and limits of fishing mortality rate and population fecundity. (We use the term population fecundity synonymously with total egg production.) Following ASMFC (2004), we computed the fishing mortality target ( $F_{\text {Target }}$ ) as the fishing mortality rate corresponding to the 75th percentile of annual fecundity potential ratio (FPR), defined as equilibrium fecundity per recruit relative to that at $F=0$. Likewise, we computed the fishing mortality limit ( $F_{\text {Limit }}$ ) as the fishing mortality rate corresponding to the median of annual FPR. Thus, $F_{\text {Limit }}$ is analogous to the common limit reference point $F_{\text {med }}$, also called $F_{\text {rep }}$, defined as the fishing mortality rate with stock replacement in $50 \%$ of years (Sissenwine and Shepherd, 1987; Caddy and Mahon, 1995). Given these percentiles (75th or median) of annual FPR, values of $F$ were calculated from a single FPR curve that assumed mean egg production. We then computed the population fecundity target ( $\Psi_{\text {Target }}$ ) as the median fecundity per recruit multiplied by the median annual recruitment, and the population fecundity limit ( $\Psi_{\text {Limit }}$ ) as one-half of $\Psi_{\text {Target }}$ (Restrepo

Table 4
General descriptions and definitions of the catch-age model

| Definition | Symbol | Description or equation |
| :---: | :---: | :---: |
| General |  |  |
| Index of years | $t$ | $t=\{1958, \ldots, 2004\}$, including an initialization period (1958-1963) prior to the first year of data (1964) |
| Index of time periods | $t^{\prime}$ | $t^{\prime}=\{1,2\}$, where 1 represents 1964-1975 and 2 represents 1976-2004 |
| Index of ages | $a$ | $a=\{0, \ldots, A\}$, where $A=6+$ |
| Input data |  |  |
| Weight at age | $w_{a, t}$ | Annual mean weight (g) at age of fish landed in year $t$ (midpoint of year) |
| Maturity at age | $m_{a}$ | Proportion of individuals mature at age $a$ |
| Eggs at age | $\psi_{a, t}$ | Eggs produced per individual at age $a$ in year $t$ |
| Observed index of juvenile abundance | $U_{t}$ | Based on delta-lognormal model applied to data from LA, MS, and TX |
| Coefficient of variation of $U_{t}$ | $c_{t}^{U}$ | Estimated by bootstrap ( $N=1000$ ) of delta-lognormal model |
| Observed landings | $L_{t}$ | Reported landings in weight (1000t) from reduction and bait fisheries combined |
| Coefficient of variation of $L_{t}$ | $c_{t}^{L}$ | Assumed $c_{t}^{L}=0.04$ for all years |
| Observed age compositions | $p_{a, t}$ | Proportion of individuals at age $a$ in year $t$ from the reduction fishery |
| Effective sample sizes of age compositions | $n_{t}$ | Number of samples in year $t$ |
| Age-dependent natural mortality rate | $M_{a}$ | Based on the method of Boudreau and Dickie (1989), rescaled according to results of Ahrenholz (1981) |
| Population model |  |  |
| Fishery selectivity | $s_{a, t^{\prime}}$ | $s_{a, t^{\prime}}=1 /\left(1+\exp \left\{-\hat{\eta}_{t^{\prime}}\left(a-\hat{\alpha}_{t^{\prime}}\right)\right\}\right)$ |
| Fishing mortality rate | $F_{a, t}$ | $F_{a, t}=s_{a, t} \hat{F}_{t}$, where $\hat{F}_{t}$ are estimated, fully selected fishing mortality rates and $s_{a, t}=s_{a, t^{\prime}}$ for $t$ in years represented by $t^{\prime}$. In the initialization period, $F_{t}=F_{1964}$ and $s_{a, t}=s_{a, t^{\prime}=1}$ |
| Total mortality rate | $Z_{a, t}$ | $Z_{a, t}=M_{a}+F_{a, t}$ |
| Eggs per recruit at $F=0$ | $\phi_{0, t}$ | $\phi_{0, t}=\sum_{a} 0.5 N_{a}^{\prime} m_{a} \psi_{a, t}$, where $N_{a}^{\prime}$ is number per recruit at age $a$ according to the stable age structure under natural mortality alone |
| Population fecundity | $\Psi_{t}$ | $\Psi_{t}=\sum_{a} 0.5 N_{a, t} m_{a} \psi_{a, t}$, where $0.5 N_{a, t}$ is abundance of females at age in year $t$, assuming a 50:50 sex ratio |
| Abundance at age in initial year (1958) | $N_{a, t}$ | $N_{a+1,1958}=N_{a, 1958} \exp \left(-Z_{a, 1958}\right), N_{A, 1958}=$ <br> $N_{A-1,1958} \exp \left(-Z_{A-1,1958}\right) /\left[1-\exp \left(-Z_{A, 1958}\right)\right]$, where $\hat{N}_{0,1958}$ is estimated initial recruitment |
| Abundance at age in other years (1959-2004) | $N_{a, t}$ | $N_{0, t}=0.8 \hat{R}_{0} \hat{h} \Psi_{t} /\left[0.2 \hat{R}_{0} \phi_{0, t}(1-\hat{h})+(\hat{h}-0.2) \Psi_{t}\right]+\hat{\varepsilon}_{t}, N_{a+1, t+1}=$ <br> $N_{a, t} \exp \left(-Z_{a, t}\right), N_{A, t+1}=N_{A-1, t} \exp \left(-Z_{A-1, t}\right)+N_{A, t} \exp \left(-Z_{A, t}\right)$, where $\hat{R}_{0}$ (virgin recruitment) and $\hat{h}$ (steepness) are estimated parameters of the Beverton-Holt spawner-recruit model, and $\hat{\varepsilon}_{t}$ are estimated residuals of annual recruitment |
| Predicted catch at age | $C_{a, t}$ | $C_{a, t}=\left(F_{a, t} / Z_{a, t}\right) N_{a, t}\left[1-\exp \left(-Z_{a, t}\right)\right]$ |
| Predicted landings | $\breve{L}_{t}$ | $\breve{L}_{t}=\sum_{a} C_{a, t} w_{a . t}$ |
| Predicted age composition | $\breve{p}_{a, t}$ | $\breve{p}_{a, t}=C_{a, t} / \sum_{a} C_{a, t}$ |
| Predicted index of juvenile abundance | $\breve{U}_{t}$ | $\widetilde{U}_{t}=\hat{q} N_{0, t}$, where $\hat{q}$ is estimated catchability of age-0 fish |
| Negative log-likelihood |  |  |
| Multinomial age composition | $\Lambda_{1}$ | $\Lambda_{1}=-\sum_{t=1964}^{2004} n_{t} \sum_{a} p_{a, t} \ln \left(\breve{p}_{a, t}\right)-p_{a, t} \ln \left(p_{a, t}\right)$ |
| Lognormal index | $\Lambda_{2}$ | $\Lambda_{2}=\sum_{t=1967}^{2004}\left[\ln \left(U_{t} / \breve{U}_{t}\right)\right]^{2} / 2\left(c_{t}^{U}\right)^{2}$ |
| Lognormal landings | $\Lambda_{3}$ | $\Lambda_{3}=\sum_{t=1964}^{2004}\left[\ln \left(L_{t} / \breve{L}_{t}\right)\right]^{2} / 2\left(c_{t}^{L}\right)^{2}$ |
| Recruitment constraint | $\Lambda_{4}$ | $\Lambda_{4}=\sum_{t=1959}^{2004}\left(\hat{\varepsilon}_{t}\right)^{2}$ |
| Total log-likelihood | $\Lambda$ | $\Lambda=\sum_{i=1}^{4} \Lambda_{i}$, objective function minimized by the assessment model |
| Biological reference points |  |  |
| Annual fecundity per recruit | $\phi_{F_{t}}$ | $\phi_{F_{t}}=\sum_{a} 0.5 N_{a}^{\prime} m_{a} \psi_{a, t}$, where $N_{a}^{\prime}$ is the number per recruit at age $a$ according to the stable age structure under $Z_{a, t}$ |
| Annual fecundity potential ratio | $\Phi_{t}$ | $\Phi_{t}=\phi_{F_{t}} / \phi_{0, t}$ |
| Curve of mean fecundity potential ratio | $\Phi_{\mu}(F)$ | Fecundity potential ratio as a function of $F$. Based on mean egg production $\bar{\psi}_{a}$, computed from period $t^{\prime}=2$ |
| Fishing mortality target | $F_{\text {Target }}$ | $F$ from $\Phi_{\mu}(F)$ curve corresponding to the 75th percentile of $\Phi_{t}$ |
| Fishing mortality limit | $F_{\text {Limit }}$ | $F$ on the $\Phi_{\mu}(F)$ curve corresponding to the median $\Phi_{t}$ |
| Population fecundity target | $\Psi_{\text {Target }}$ | Median $\phi_{F_{t}}$ multiplied by median $N_{0, t}$ |
| Population fecundity limit | $\Psi_{\text {Limit }}$ | One-half $\Psi_{\text {Target }}$ |

Hat notation ( $\hat{x}$ ) indicates parameters estimated by the assessment model, and breve notation $(\widehat{x})$ indicates computed quantities whose fit to data form the objective function.

Table 5
Base model and sensitivity runs

| Model | Egg-recruit function | Terminal year | Natural mortality rate $^{\text {a }}$ |
| :--- | :--- | :--- | :--- |

${ }^{\text {a }}$ Values shown in Table 3.
et al., 1998). All percentiles were based on annual estimates from the assessment period 1964-2004.

For comparison with the proposed $F_{\text {Target }}$ and $F_{\text {Limit }}$, we computed other common reference points, namely $F_{\max }, F_{0.1}$, and $F_{\% \mathrm{FPR}}$. Both $F_{\max }$ and $F_{0.1}$ stem from analysis of yield per recruit: $F_{\max }$ maximizes yield per recruit, and $F_{0.1}$ is the $F$ where slope of the yield per recruit curve is $10 \%$ of its value at the origin. $F_{\% \text { FPR }}$ is the $F$ that corresponds to a particular FPR expressed as a percentage, \%FPR (Goodyear, 1993; Caddy and Mahon, 1995). We chose $F_{45 \%}$ and $F_{55 \%}$.

## 3. Results

### 3.1. Base model

In general, the model fit the data well. Predicted and observed landings were in close agreement (Fig. 1), as were predicted and observed age compositions (Fig. 2). Predicted juvenile abundance did not reproduce all extrema in the index, but did track observed trends (Fig. 3).

Estimated selectivity curves for the two periods showed partial selection of age-1 fish and full selection of age-2+ fish (Fig. 4). In the early period (1964-1975), estimated selection


Fig. 1. Observed (circles) and predicted (line) annual landings. Predictions from the base model (M1).
of age- 1 fish was approximately 0.31 , and in the current period (1976-2004), approximately 0.19 .

Estimates of fully selected fishing mortality rate were variable prior to 1990, fluctuating between values near $F=1.0$ and $F>2.0$ (Fig. 5A). Since 1990, estimates have been lower and less variable, likely effects of industrial consolidation and fleet reduction (Table 1). During the most recent years, estimates have increased from $F=0.48$ in 2001 to $F=1.09$ in 2004.

As with $F$, estimates of population fecundity $(\Psi)$ varied substantially (Fig. 5B). Estimates were lowest in the 1960s, relatively stable in the 1970s and 1980s, generally increasing in the 1990 s, and decreasing in the 2000s. After peaking at $\Psi=$ $165 \times 10^{12}$ in 2000 , estimated population fecundity declined to $\Psi=64 \times 10^{12}$ in 2004. The trends in population fecundity are quite similar to those of age- $2+$ abundance (figure not shown).

Estimated recruits at age-0 ranged between $74 \times 10^{9}$ (1965) and $542 \times 10^{9}$ (1984) (Fig. 5C). Peaks in estimated recruits occurred two years prior to those in estimated population fecundity, reflecting time to reach maturity. During recent years, estimated recruits have generally declined, from about $464 \times 10^{9}$ in 1998 to $187 \times 10^{9}$ in 2004.

### 3.2. Sensitivity and retrospective analyses

Choice of spawner-recruit model—Beverton-Holt or Ricker-had little effect on estimated time series (Fig. 5). In retrospect, this result is not surprising, given that the spawner-recruit model was used to generate expected annual recruitment, to which estimated lognormal deviations were added (Table 4). These deviations, lightly constrained, absorbed any potential difference between predictions from the two models.

Models with altered schedules of maturity or natural mortality produced estimated trends similar to those of the base model (Fig. 6). These sensitivity runs, however, displayed notable differences of scale. Estimates of $F$ were inversely related to the magnitude of natural mortality rate. In contrast, estimates of recruits shifted in the same direction as changes in natural mortality of juveniles. Population fecundity reflected those shifts of estimated recruits in the cases of altered natural mortality, and it reflected the presence of age- 1 adults in the case of altered maturity.


Fig. 2. Observed (circles) and predicted (line) annual age composition of landings. Predictions from the base model (M1).


Fig. 3. Observed (circles) and predicted (line) index of juvenile abundance. Predictions from the base model (M1).


Fig. 4. Estimated selectivity curves from early (1964-1975; dashed) and current (1976-2004; solid) time periods. Estimates from the base model (M1).


Fig. 5. Estimated time series from the base model (M1; closed circles, bold line) and the model with Ricker recruitment (M2; squares): (A) fully selected fishing mortality rate; (B) population fecundity; and (C) number of age-0 recruits. Estimates from M2 overlay those from M1.

Retrospective analysis revealed some trends in estimation (Fig. 7). Estimates of $F$ tended to be higher in a given year if terminal. Conversely, estimates of population fecundity tended to be lower. These results suggest possible, but small, biases in terminal-year estimates. Estimates of recruits, on the other hand, showed no consistent retrospective pattern, but instead matched precisely the terminal year of the juvenile abundance index. This result occurred because age-0 fish have not yet entered the fishery, and thus data sources other than the index did not influence terminal-year estimates of recruits.


Fig. 6. Estimated time series from the base model (M1; closed circles, bold line) and from models with natural mortality scaled to the upper value (M3; upward triangles), with natural mortality scaled to the lower value (M4; downward triangles), with natural mortality constant (M5; open circles), and with gradual female maturity (M6; squares): (A) fully selected fishing mortality rate; (B) population fecundity; and (C) number of age-0 recruits. In (C), estimates from M3 were divided by 10 .

### 3.3. Biological reference points and fishery status

Biological reference points estimated by the base model were $F_{\text {Target }}=0.94$ year $^{-1}, \quad F_{\text {Limit }}=1.46$ year $^{-1}, \quad \Psi_{\text {Target }}=68.68 \times$ $10^{12}$ eggs year $^{-1}, \quad$ and $\quad \Psi_{\text {Limit }}=34.34 \times 10^{12} \mathrm{eggs}^{2}$ year $^{-1}$ (Table 6; Fig. 8A). The point estimate of $F$ in the terminal year, $F_{2004}=1.09$, exceeded its target, indicating that $F$ may need to be reduced (Table 6; Fig. 9). The point estimate of population fecundity in the terminal year, $\Psi_{2004}=63.91 \times 10^{12}$,

Table 6
Biological reference points estimated by base model and sensitivity runs

| Model | Fishing mortality rate $\left(\right.$ year $\left.^{-1}\right)$ |  |  | Population fecundity $\left(10^{12}\right.$ eggs year $\left.^{-1}\right)$ |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  | $F_{\text {Target }}$ | $F_{\text {Limit }}$ | $F_{\text {Terminal }}$ | $\Psi_{\text {Target }}$ | $\Psi_{\text {Limit }}$ | $\Psi_{\text {Terminal }}$ |
| M1 (base) | 0.94 | 1.46 | 1.09 | 68.68 | 34.34 |  |
| M2 (Ricker) | 0.94 | 1.46 | 1.09 | 68.67 | 34.33 | 63.91 |
| M3 (high M) | 0.42 | 0.71 | 0.76 | 134.07 | 67.04 | 93.98 |
| M4 (low M) | 1.23 | 1.79 | 1.38 | 47.93 | 23.97 | 49.85 |
| M5 (constant M) | 0.98 | 1.58 | 1.12 | 63.22 | 31.61 | 61.34 |
| M6 (gradual maturity) | 0.86 | 1.46 | 1.09 | 97.80 | 48.90 | 86.22 |
| M7 (retrospective-2003) | 0.90 | 1.47 | 1.02 | 68.64 | 34.32 | 105.03 |
| M8 (retrospective-2002) | 0.93 | 1.45 | 1.05 | 68.96 | 34.48 | 108.54 |
| M9 (retrospective-2001) | 0.91 | 1.42 | 0.94 | 69.67 | 34.84 | 92.73 |
| M10 (retrospective-2000) | 0.90 | 1.40 | 0.80 | 69.27 | 34.64 | 143.26 |

[^3]

Fig. 7. Estimated time series from the base model (M1; closed circles, bold line) and from models with terminal year 2003 (M7), 2002 (M8), 2001 (M9), and 2000 (M10). Open circles indicate terminal year of models M7-M10. (A) Fully selected fishing mortality rate; (B) population fecundity; and (C) number of age-0 recruits.
was below its target for a healthy stock (Table 6; Fig. 9). Neither terminal-year estimate exceeded its limit.

By assessment standards, terminal-year estimates were relatively precise, with proportional standard error (PSE) of $F_{2004}$ near 0.1, and PSE of $\Psi_{2004}$ near 0.08. Assuming normality and standard errors as estimated, cumulative probability distributions show that each terminal-year estimate is quite likely between its target and limit (Fig. 10).

The alternative reference points estimated for fishing mortality were $F_{0.1}=3.12, F_{45 \%}=1.55$, and $F_{55 \%}=0.96$ (Fig. 8B). The yield per recruit curve did not have a maximum, and thus $F_{\text {max }}$ does not exist. For reference to $\%$ FRP values, the proposed limit corresponds to $F_{46.1 \%}$, and the proposed target to $F_{55.5 \%}$ (Fig. 8A).

Fishery status portrayed by sensitivity runs was in general consistent with that of the base model: terminal-year estimates of $F$ and $\Psi$ were between their targets and limits. Two exceptions occurred. Models with high natural mortality or gradual maturity estimated $F_{\text {Terminal }}$ to be slightly greater than its limit, and retrospective runs estimated $\Psi_{\text {Terminal }}$ to be well above its target.

## 4. Discussion

The database of gulf menhaden is among the best in the United States. Landings have been monitored comprehensively with rigorous biostatistical sampling since 1964. Additionally, accurate landings data exist back to 1946 because of full disclo-


Fig. 8. Per recruit analyses. (A) Fecundity potential ratio based on mean egg production. Circles represent annual estimates of fecundity potential ratio in 1964-2004. From these estimates were computed percentiles and corresponding biological reference points, $F_{\text {Target }}$ and $F_{\text {Limit }}$. (B) Yield per recruit, with alternative reference points ( $F_{0.1}, F_{45 \%}$, and $F_{55 \%}$ ) shown for comparison with $F_{\text {Target }}$ and $F_{\text {Limit }}$. The yield per recruit curve has no maximum.
sure from the industry. Inclusive sampling of the gulf menhaden fishery can be achieved for several reasons: landings dominated by a single user group, cooperative fishing industry, few active ports, and a relatively small number of vessels operated by few companies. Consequently, in addition to being accurate, these data are also precise, at least by fishery standards.

Although precise, the fishery data unavoidably contain some amount of uncertainty. Reduction-fishery landings include mea-


Fig. 9. Target and limit biological reference points (bold lines) from the base model (M1). Overlaid are annual estimates (circles) for 1985-2004, with first and last years indicated (closed circles).


Fig. 10. Precision of 2004 estimates from the base model (M1). (A) Cumulative normal distribution of fully selected fishing mortality rate, centered on $F_{2004}=0.94$ (0.11 S.E.). (B) Cumulative normal distribution of population fecundity, centered on $\Psi_{2004}=63.91 \times 10^{12}\left(4.88 \times 10^{12} \mathrm{~S} . \mathrm{E}.\right)$. Dashed lines represent 2004 estimates or biological reference points, as indicated.
surement error ( $\mathrm{CV}=4 \%$ ) associated with documenting vessel unloads. Bait landings, a minor component of the fishery (generally $<1 \%$ ), are lumped with those of the reduction fishery and assumed to have the same level of uncertainty. Ageing of gulf menhaden is believed to be accurate (Nicholson and Schaaf, 1978). Paired age assignments of recent scale samples ( $n=568$ ) showed $92 \%$ agreement of age-1 fish $(n=267)$ and $80 \%$ agreement of age- 2 fish ( $n=192$ ); hence, uncertainty in age composition stems mostly from sampling error, inversely related to effective sample size. Within the two-stage biostatistical sampling design, annual effective sample size $\left(n_{t}\right)$ is the number of 10 -fish samples ( 20 -fish samples in 1964-1971) taken during a year, which reflects the belief that all fish of a sample come from the same school and should therefore be treated as a single sampling unit. The large effective sample sizes (Table 1) and high agreement between age assignments imply good precision and accuracy of annual age compositions.

Less precise are the fishery-independent data. The juvenile abundance index included catch-per-unit-effort data collected by several sources, combined according to relative productivity of streams across the northern Gulf of Mexico. Variability in the juvenile abundance index was quantified by bootstrap (CVs range $10-20 \%$ ), which does not account for propagation of error from sampling or relative productivity of streams, and is therefore likely to overestimate precision.

The assessment model incorporates uncertainty via its likelihood. Thus, fits of the model reflect uncertainties associated
with data components. The model fits closely the landings and age composition data, which are sampled with high precision, and less closely the juvenile abundance index.

In the terminal year of data, stock status, as indicated by population fecundity, was estimated to be between its target and limit reference points. This result indicates that the stock is below an ideal level, but not alarmingly so. Likewise, fishing mortality rate in the terminal year was estimated to be between its target and limit, though close to the target. These results should be interpreted in light of retrospective analyses, which suggested that terminal population fecundity may be underestimated and terminal $F$ may be overestimated. With terminal year values near their targets, the gulf menhaden stock appears to be in good condition. However, if recent trends of decreased population fecundity and increased $F$ continue, the stock would approach its limit reference points.

Biological reference points proposed here are based on perrecruit analyses. The estimate of $F_{\text {Target }}$ corresponds roughly to $F_{55 \%}$, and the estimate of $F_{\text {Limit }}$ to $F_{45 \%}$. In a theoretical study, these values were found consistent with the fishing rate at maximum sustainable yield ( $F_{\mathrm{MSY}}$ ) for stocks similar to gulf menhaden (Williams and Shertzer, 2003). The value of $F_{0.1}=3.12$ would correspond to $\%$ FPR near $30 \%$. This $F$ seems to us quite risky, as $30 \% \mathrm{FPR}$ is below the values observed in all but two years (1965 and 1966) of the assessment period 1964-2004.

The proposed $F_{\text {Target }}$ is defined as the fishing mortality rate corresponding to the 75 th percentile of annual FPR, chosen because of its precedence in management of menhaden (ASMFC, 2004). Its value in this assessment provides a clear buffer between target and limit. In general, the size of that buffer reflects the degree of risk that resource managers are willing to accept, with risk defined here as probability of overexploitation. A higher $F_{\text {Target }}$ would increase risk, whereas a lower $F_{\text {Target }}$ would decrease risk. Either way, the relationship between FPR and $F$ (Fig. 8) could help inform resource managers should they choose a different $F_{\text {Target }}$. Alternatively, a target could be determined with a control rule, such as the Ratio Extended Probability Approach to Setting Targets, or REPAST (Prager et al., 2003). As detailed in Prager et al. (2003), the REPAST control rule is based on probability theory and computes a target from three quantifiable elements: precision of the assessment results, precision of realizing the target, and level of risk considered acceptable by managers.

The proposed $F_{\text {Limit }}$ is analogous to $F_{\text {rep }}$ (Sissenwine and Shepherd, 1987) and $F_{\text {med }}$ (Caddy and Mahon, 1995), but with slight modification to allow for annual variation in fecundity. We assume that our estimate of $F_{\text {Limit }}$ leads to replacement on average, justified in part by the long duration of data over which the stock has experienced wide-ranging environmental conditions. This limit reference point based on per-recruit analysis serves as a proxy for $F_{\text {MSY }}$ in the presence of a noisy spawner-recruit relationship (Vaughan et al., 2000).

Recruitment of gulf menhaden shows little, if any, relationship with stock size. Any potential relationship appears to be masked by other influences, such as environmental effects. Indeed, Govoni (1997) found a significant, negative correlation
between recruitment of gulf menhaden and Mississippi River discharge. That result underscores the value of a comprehensive and precise recruitment index. Such an index would undoubtedly improve the quality of stock assessment, and may even be applied directly to management of this recruitment-driven fishery, by adjusting fishing effort according to recruitment in previous years.

Relative to the recent rise in fishing mortality rate, it is worth noting the severity of the 2005 hurricane season in the northern Gulf of Mexico and its effect on the fishery. In August 2005, Hurricane Katrina struck eastern Louisiana and Mississippi as a strong category three storm, and weeks later, Hurricane Rita made landfall near the Texas-Louisiana border as a category three storm. Of the four menhaden plants, two (Cameron and Empire) closed due to severe damage, and did not reopen until after the start of the 2006 fishing season. The other two plants (Abbeville and Moss Point) reopened in 2005 with limited operation. For the 2005 fishing season, landings declined to their lowest ( $433,784 \mathrm{t}$ ) since 1992 and nominal fishing effort fell to its lowest ( $322,300 \mathrm{v}$-t-wks) since 1964 (Table 1). Our point in discussing these events after the terminal assessment year is that we expect $F$ in 2005 and 2006 to fall below the estimated $F_{\text {Target }}$.

Environmental effects may also contribute to the recent rise in fishing mortality rates. Increasingly, extensive areas (up to $20,000 \mathrm{~km}^{2}$ ) off the coasts of Louisiana and Texas are marked by low dissolved oxygen in bottom waters, the so-called "dead zone," a combined effect of high summer water temperatures, strong salinity-based water column stratification, periods of reduced mixing, and increased nutrient loads from riverine influx (Rabalais and Turner, 2001). Rather than suffer hypoxia, gulf menhaden probably migrate from areas of low dissolved oxygen, as suggested by the poor or zero catches off central Louisiana when the dead zone impinges close to the shoreline (Smith, 2001). Such displacement is likely to concentrate menhaden schools into narrow coastal corridors making them more susceptible to exploitation, as is suspected of penaeid shrimp (Zimmerman and Nance, 2001). If true, this increased susceptibility, along with decreased recruitment, could account for the recent rise in $F$.

The rise in $F$ may at first seem puzzling given the coinciding decrease in landings; however, this pattern is consistent with a decrease in abundance (portrayed by population fecundity), which follows declining recruitment. As mentioned previously, fishing effort in 2005 declined because of an active hurricane season, an effect likely to carry over in 2006. Regardless, fishing effort should continue to be monitored and reduced if $F$ approaches its limit.

## Acknowledgements

This work depended on the support of NOAA's National Marine Fisheries Service, in particular the Southeast Fisheries Science Center and the NOAA Beaufort Laboratory. Fisheryindependent data were graciously provided by M. Fisher (Texas Parks and Wildlife Department), V. Guillory (Louisiana Department of Wildlife and Fisheries), and L. Hendon (Gulf Coast Research Laboratory, University of Southern Mississippi). The
authors are grateful to D. Ahrenholz, M. Prager, E. Williams, and anonymous reviewers for comments on the manuscript, to the numerous port samplers who have collected biostatistical data from the menhaden fishery, and to the menhaden industry for supplying landings data and other pertinent information. Opinions expressed are those of the authors and do not necessarily reflect policies or findings of any government agency.

## References

Ahrenholz, D.W., 1981. Recruitment and exploitation of gulf menhaden, Brevoortia patronus. Fish. Bull. 79, 325-335.
Ahrenholz, D.W., 1991. Population biology and life history of the North American Menhadens, Brevoortia spp. Mar. Fish. Rev. 53 (4), 3-19.
Ahrenholz, D.W., Guthrie, J.F., Krouse, C.W., 1989. Results of abundance surveys of juvenile Atlantic and gulf menhaden, Brevoortia tyrannus and B. patronus. NOAA Tech. Rep. NMFS 84, 1-14
Atlantic States Marine Fisheries Commission (ASMFC), 2004. Atlantic menhaden stock assessment report for peer review. ASMFC, Stock Assessment Report No. 04-01 (Suppl.), 1-145.
Beverton, R.J.H., Holt, S.J., 1957. On the Dynamics of Exploited Fish Populations. Chapman and Hall, London. Facsimile reprint, 1993.
Booth, A.J., Quinn II, T.J., 2006. Maximum likelihood and Bayesian approaches to stock assessment when data are questionable. Fish. Res. 80, 169-181.
Boudreau, P.R., Dickie, L.M., 1989. Biological model of production based on physiological and ecological scaling of body size. Can. J. Fish. Aquat. Sci. 46, 614-623.
Caddy, J.F., Mahon, R., 1995. Reference points for fisheries management. FAO Fish. Tech. Paper 347, 1-83.
Cadrin, S.X., Vaughan, D.S., 1997. Retrospective analysis of virtual population estimates for Atlantic menhaden stock assessment. Fish. Bull. 95, 445-455.
Chapoton, R.B., 1970. History and status of the Gulf of Mexico's menhaden purse seine fishery. J. Elisha Mitch. Sci. Soc. 86, 183-184.
Chapoton, R.B., 1971. The future of the gulf menhaden, the United States' largest fishery. Proc. Gulf Carib. Fish. Inst. 24, 134-143.
Chester, A.J., 1984. Sampling statistics in the Atlantic menhaden fishery. NOAA Tech. Rep. NMFS-TR-9, 1-16.
Christmas, J.Y., Etzold, D.J., Simpson, L.B., 1988. The menhaden fishery of the Gulf of Mexico, United States: a regional management plan. Gulf States Mar. Fish. Comm. Rep. 18.
Deriso, R.B., Quinn II, T.J., Neal, P.R., 1985. Catch-age analysis with auxiliary information. Can. J. Fish. Aquat. Sci. 42, 815-824.
Efron, B., Tibshirani, R.J., 1993. An Introduction to the Bootstrap. Chapman and Hall, New York.
Friedland, K.D., 1985. Functional morphology of the branchial basket structures associated with feeding in the Atlantic menhaden, Brevoortia tyrannus (Pisces: Clupeidae). Copeia, 1018-1027.
Gabriel, W.L., Sissenwine, M.P., Overholtz, W.J., 1989. Analysis of spawning stock biomass per recruit: an example for Georges Bank haddock. N. Am. J. Fish. Manage. 9, 383-391.

Goodyear, C.P., 1993. Spawning stock biomass per recruit in fisheries management: foundation and current use. In: Smith, S.J., Hunt, J.J., Rivard, D. (Eds.), Risk Evaluation and Biological Reference Points for Fisheries Management, 120. Can. Spec. Publ. Fish. Aquat. Sci., pp. 67-81.

Govoni, J.J., 1997. The association of the population recruitment of gulf menhaden, Brevoortia patronus, with Mississippi River discharge. J. Mar. Sys. 12, 101-108.
Hardin, J., Hilbe, J., 2001. Generalized Linear Models and Extensions. Stata Press, College State, TX.
Lewis, R.M., Roithmayr, C.M., 1981. Spawning and sexual maturity of Gulf menhaden, Brevoortia patronus. Fish. Bull. 78, 947-951.
Lo, N.C., Jacobson, L.D., Squire, J.L., 1992. Indices of relative abundance from fish spotter data based on delta-lognormal models. Can. J. Fish. Aquat. Sci. 49, 2515-2526.
Maunder, M.N., Punt, A.E., 2004. Standardizing catch and effort data: a review of recent approaches. Fish. Res. 70, 141-159.

Martinez-Andrade, F., Campbell, P., Fuls, B., 2005. Trends in Relative Abundance and Size of Selected Finfishes and Shellfishes along the Texas Coast: November 1975-December 2003. Management Data Series Number 232. Texas Parks and Wildlife Department, Coastal Fisheries Division, Austin, Texas.
National Marine Fisheries Service (NMFS), 2005. Fisheries of the United States, 2004. U.S. Dep. Commer., Current Fish. Stat. No. 2004.

Nelson, W.J., Ahrenholz, D.W., 1986. Population and fishery characteristics of gulf menhaden, Brevoortia patronus. Fish. Bull. 84, 311-325.
Nicholson, W.R., 1978. Gulf menhaden, Brevoortia patronus, purse seine fishery: catch, fishing activity, and age and size composition, 1964-1973. NOAA Tech. Rep. NMFS SSRF-722, 1-8.
Nicholson, W.R., Schaaf, W.E., 1978. Ageing of gulf menhaden, Brevoortia patronus. Fish. Bull. 76, 315-322.
Perret, W.S., Barrett, B.B., Latapie, W.R., Pollard, J.F., Mock, W.R., Adkins, G.G., Gaidry, W.J., White, C.J., 1971. Cooperative Gulf of Mexico Estuarine Inventory and Study, Louisiana. Phase I, Area Description and Phase IV, Biology. La. Wildlife and Fisheries Commission, New Orleans.
Prager, M.H., Porch, C.E., Shertzer, K.W., Caddy, J.F., 2003. Targets and limits for management of fisheries: a simple probability-based approach. N. Am. J. Fish. Manage. 23, 349-361.

Pristas, P.J., Levi, E.J., Dryfoos, R.L., 1976. Analysis of returns of tagged gulf menhaden. Fish. Bull. 74, 112-117.
Quinn II, T.J., Deriso, R.B., 1999. Quantitative Fish Dynamics. Oxford University Press, New York.
Rabalais, N.N., Turner, R.E., 2001. Hypoxia in the northern Gulf of Mexico: description, causes and change. In: Rabalais, N.N., Turner, R. (Eds.), Coastal Hypoxia: Consequences for Living Resources and Ecosystems. American Geophysical Union, Washington, DC, pp. 1-36.
Reintjes, J.W., 1969. Synopsis of biological data on Atlantic menhaden, Brevoortia tyrannus. Fish Wildl. Serv. Circ. 320, 1-30.
Restrepo, V.R., et al., 1998. Technical guidance on the use of precautionary approaches to implementing National Standard 1 of the Magnuson Stevens Fishery Conservation and Management Act. NOAA Technical Memorandum NMFS-F/SPO-31, 1-54.
Roithmayr, C.M., Waller, R.A., 1963. Seasonal occurrence of Brevoortia patronus in the northern Gulf of Mexico. Trans. Am. Fish. Soc. 92, 301-302.

Rothschild, B.J., Fogarty, M.J., 1989. Spawning-stock biomass: a source of error in recruitment/stock relationships and management advice. J. Cons. Int. Explor. Mer. 45, 131-135.
Sissenwine, M.P., Shepherd, J.G., 1987. An alternative perspective on recruitment overfishing and biological reference points. Can. J. Fish. Aquat. Sci. 44, 913-918.
Smith, J.W., Levi, E.J., Vaughan, D.S., Hall, E.A., 1987. Gulf menhaden, Brevoortia patronus, purse seine fishery, 1974-1985, with a brief discussion of age and size composition of the landings. NOAA Tech. Rep. NMFS 60, 1-8.
Smith, J.W., 1991. The Atlantic and gulf menhaden fisheries: origins, harvesting technologies, biostatistical monitoring, recent trends in fisheries statistics, and forecasting. Mar. Fish. Rev. 53 (4), 28-39.
Smith, J.W., 2001. Distribution of catch in the gulf menhaden, Brevoortia patronus, purse-seine fishery in the northern Gulf of Mexico from logbook information: are there relationships to the hypoxic zone? In: Rabalais, N.N., Turner, R. (Eds.), Coastal Hypoxia: Consequences for Living Resources and Ecosystems. American Geophysical Union, Washington, DC, pp. 311-320.
Smith, J.W., Hall, E.A., McNeill, N.A., O'Bier, W.B., 2002. The distribution of purse-seine sets and catches in the gulf menhaden fishery in the northern Gulf of Mexico, 1994-1998. Gulf Mex. Sci. 2002, 12-24
Vanderkooy, S.J., Smith, J.W. (eds.), 2002. The menhaden fishery of the Gulf of Mexico, United States: a regional management plan, 2002 revision. Gulf States Mar. Fish. Comm. Rep. No. 99.
Vaughan, D.S., 1987. Stock assessment of the gulf menhaden, Brevoortia patronus, fishery. NOAA Tech. Rep. NMFS 58, 1-18.
Vaughan, D.S., Levi, E.J., Smith, J.W., 1996. Population characteristics of gulf menhaden, Brevoortia patronus. NOAA Tech. Rep. NMFS 125, 1-18.
Vaughan, D.S., Prager, M.H., Smith, J.W., 2000. Population characteristics of gulf menhaden, Brevoortia patronus. NOAA Tech. Rep. NMFS 149, 1-19.
Williams, E.H., Shertzer, K.W., 2003. Implications of life-history invariants for biological reference points used in fishery management. Can. J. Fish. Aquat. Sci. 60, 710-720.
Zimmerman, R.J., Nance, J.M., 2001. Effects of hypoxia on the shrimp fishery of Louisiana and Texas. In: Rabalais, N.N., Turner, R. (Eds.), Coastal Hypoxia: Consequences for Living Resources and Ecosystems. American Geophysical Union, Washington, DC, pp. 293-310.


[^0]:    * Corresponding author. Tel.: +1 252728 8761; fax: +1 2527288619.

    E-mail address: Doug.Vaughan@noaa.gov (D.S. Vaughan).

[^1]:    ${ }^{1}$ Kutkuhn, J.H. 1966. Verification of menhaden conversion factor. Unpublished report. NOAA Beaufort Laboratory, 4 pp .

[^2]:    ${ }^{2}$ Unpublished data, Monitoring and Assessment of Mississippi’s Interjurisdictional Marine Resources, Gulf Coast Research Laboratory, University of Southern Mississippi, October 1973-present.

[^3]:    Models details are indicated and described more fully in Table 5. Terminal-year estimates are included for comparison to reference points.

