

# Identification of Individual Cultured Delta Smelt Using Visual and Automated Analysis of Natural Marks

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# Conclusions

- The percentage of correct visual matching in the 2013 sessions was higher than the 2014 sessions. This could be due to the number of days between sessions (nearly 56 days in 2013 and 90 days in 2014).
- The pigmentation patterns changed more as the fish matured, making it easier to make accurate matches as their spots stabilized as they get older and reached maturity.
- TinEye automated matching was not as accurate as visual matching, but had the benefit of being far less time consuming and had the ability to do comparisons among a larger data pool.
- Pigmentation generally became less apparent under the high light treatment, leading to a marginally lower percent of automated recognition relative to fish under low light.

### Methods

- Conducted 3 photo sessions in 2 fish groups (Jan-May 2013 and Oct-Apr 2014/15, hereafter 2013 and 2014 sessions). First photo session included adults in 2013 and subadults in 2014. Tested effect of low and high light treatments for matching in the 2014 sessions.
- Used the dorsal head area to evaluate natural marks using visual (naked eye) and automated image recognition (TinEye's Match Engine API).
- Photos for visual matching were unedited dorsal images (UDI; Fig. 1A). Photos used for TinEye were cropped (Figs. 1B, 1C and 1D).
- Evaluated whether the cropped area-of-interest (Fig. 1C) would improve automated matching relative to DHA (Fig.1B) and AOI5 (Fig. 1D).







Figure 1. Areas used for photo matching: (A) UDI: AOIA, B and C and areas behind the head; (B) DHA: AOI A, B, C); (C) cropped AOI: cropped AOI A, B, C; and (D) AOI5: cropped AOI B and C.

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Sessior 1-2 Session 2-3 Session 1-3

for both testers.



# Data/Results

Shorter intervals between photo sessions (nearly 56 days in 2013 and 90 days in 2014) resulted in higher percent correct matching for both visual recognition (100% in 2013 and 70-100% in 2014; Table 1) and automated recognition (59-89% in 2013 and 19-33% in 2014; Figure 2).

Pigmentation generally became less apparent under the high light treatment, leading to a marginally lower percent of automated recognition relative to fish under low light (Tables 3 and 4).

• TinEye correct matching ranged from 13.3% to 92.9% while visual matching ranged from 70-100%.

TinEye match rate was higher for AOI5 (93.3%) than for cropped AOI (80%) for Session 1 vs. 2, but similar match rates were found for Session 2 vs. 3, (Table 2).

### Table 1. Percent correct visual matching for 2013 and 2014.

	2013	2014
าร	100%	83%
IS	100%	100%
าร	100%	70%*

\*Data from one tester. All other scores are

in 2013 and 2014 sessions using automated matching based on AOI5.

### Table 2. Comparisons between DHA, cropped AOI, and AOI5 and bad photos using TinEye.

2013	2013 Session 1 vs.		2013 Session 2 vs.	
2013	Session 2		Session 3	
	Cropped AOI	AOI5	Cropped AOI	AOI5
# sample compared	30	30	30	30
# sample matched	24	28	29	28
# wrong match	0	0	0	0
# unmatched	6	2	1	2
% matched	80.0%	93.3%	96.7%	93.3%
% wrong match	0.0%	0.0%	0.0%	0.0%
% unmatched	20.0%	6.7%	3.3%	6.7%
2014	2014 Ses	sion 1 vs.	2014 Sess	sion 1 vs.
2014	2014 Ses Sess	sion 1 vs. sion 2	2014 Sess 2 (bad p	sion 1 vs. ictures)
<b>2014</b> 15 High light and 15 low light photos	2014 Ses Sess DHA	sion 1 vs. sion 2 Cropped AOI	2014 Sess 2 (bad p Cropped AOI	<b>sion 1 vs.</b> i <b>ctures)</b> AOI5
2014 15 High light and 15 low light photos # sample compared	2014 Ses Sess DHA 30	sion 1 vs. sion 2 Cropped AOI 30	2014 Sess 2 (bad p Cropped AOI 30	<b>sion 1 vs.</b> ictures) AOI5 30
<b>2014</b> 15 High light and 15 low light photos # sample compared # sample matched	2014 Sess Sess DHA 30 10	sion 1 vs. sion 2 Cropped AOI 30 6	2014 Sess 2 (bad p Cropped AOI 30 14	sion 1 vs. ictures) AOI5 30 7
<b>2014</b> 15 High light and 15 low light photos # sample compared # sample matched # wrong match	2014 Sess Sess DHA 30 10 0	sion 1 vs. sion 2 Cropped AOI 30 6 0	2014 Sess 2 (bad p Cropped AOI 30 14 0	sion 1 vs. ictures) AOI5 30 7 0
<b>2014</b> 15 High light and 15 low light photos # sample compared # sample matched # wrong match # unmatched	2014 Sess Sess DHA 30 10 0 20	sion 1 vs. ion 2 Cropped AOI 30 6 0 24	2014 Sess 2 (bad p) Cropped AOI 30 14 0 16	sion 1 vs. ictures) AOI5 30 7 0 23
2014 15 High light and 15 low light photos # sample compared # sample matched # wrong match # unmatched % matched	2014 Sess Sess DHA 30 10 10 20 33.3%	sion 1 vs. ion 2 Cropped AOI 30 6 0 24 20.0%	2014 Sess 2 (bad p) Cropped AOI 30 14 0 16 46.7%	sion 1 vs. ictures) AOI5 30 7 0 23 23.3%
2014 15 High light and 15 low light photos # sample compared # sample matched # wrong match # unmatched % matched % wrong match	2014 Sess Sess DHA 30 10 0 20 33.3% 0.0%	sion 1 vs. ion 2 Cropped AOI 30 6 0 24 20.0% 0.0%	2014 Sess 2 (bad p) Cropped AOI 30 14 0 16 46.7% 0.0%	sion 1 vs. ictures) AOI5 30 7 0 23 23.3% 0.0%

Table 3. High light treatment comparison between visual and TinEye matching for the 2014 sessions.

0044	Session 1 vs. Session 2			
2014	Session 1 vs. Session 2			
High	Tester-G	TinEye	I ester-IVI	TinEye
Light	(UDI)	(Cropped	(UDI)	(Cropped
Light		AOI)		AOI)
# sample	15	15	15	15
compared				
# sample	13	4	13	2
matched				
# wrong	2	0	2	0
match				
#	0	11	0	13
unmatched				
% matched	86.7%	26.7%	86.7%	13.3%
% wrong	13.3%	0.0%	13.3%	0.0%
match				
%	0.0%	73.3%	0.0%	86.7%
unmatched				
	Session 2 vs. Session 3			
# sample	15	15	15	15
compared				
# sample	15	12	15	11
matched				
# wrong	0	0	0	0
match				
#	0	3	0	4
unmatched				
% matched	100.0%	80.0%	100.0%	73.3%
% wrong	0.0%	0.0%	0.0%	0.0%
match				
%	0.0%	20.0%	0.0%	26.7%
unmatched				

# **Implications/Recommendations**

- sub-adult to adult stage.

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Table 4. Low light treatment
comparison between visual and
TinEye matching for the 2014
sessions.

2014	Session 1 vs. Session 2			
Low Light	Tester-G (UDI)	TinEye (Cropped AOI)	Tester-M (UDI)	TinEye (Cropped AOI)
# sample compared	15	15	15	15
# sample matched	12	5	12	5
# wrong match	3	0	3	1
# unmatched	0	10	0	9
% matched	80.0%	33.3%	80.0%	33.3%
% wrong match	20.0%	0.0%	20.0%	6.7%
% unmatched	0.0%	66.7%	0.0%	60.0%
	Session 2 vs. Session 3			
# sample compared	15	14	15	14
# sample matched	15	12	15	13
# wrong match	0	0	0	0
# unmatched	0	2	0	1
% matched	100.0%	85.7%	100.0%	92.9%
% wrong match	0.0%	0.0%	0.0%	0.0%
% unmatched	0.0%	14.3%	0.0%	7.1%

Our results suggest natural marks may be more reliable to track cultured Delta Smelt at the adult stage than from the

Natural marks could be beneficial to identify and track Delta Smelt in the wild, and be far less invasive than tagging. • TinEye did not match as many fish and was not as accurate as visual matching, but did reveal better results as the fish got older and reached maturity. TinEye is much more

efficient and can run through thousands of photographs in seconds versus the time consuming visual methods that may take hours to match individuals. Tineye was also able to match poor quality photos (bad photos), while the visual matchers had a difficult time.

Applications of natural marks in wild fish requires further testing as preliminary observations revealed significantly lower DHA pigmentation in field-caught adult Delta Smelt, suggesting higher light exposure in the Estuary.