

Using Heifer Data to Make Better Culling Decisions

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Topics to Cover and Discuss

- Can we use data contained in the record system (DC305) to make good culling decisions?
 - What data are useful predictors?
 - What impact does culling heifers have on the cost of raising for the ones that successfully complete the raising process and calve?
 - What is the value of using data during the heifer raising period to cull heifers at high risk for poor first lactation performance?

Herd Data Analysis

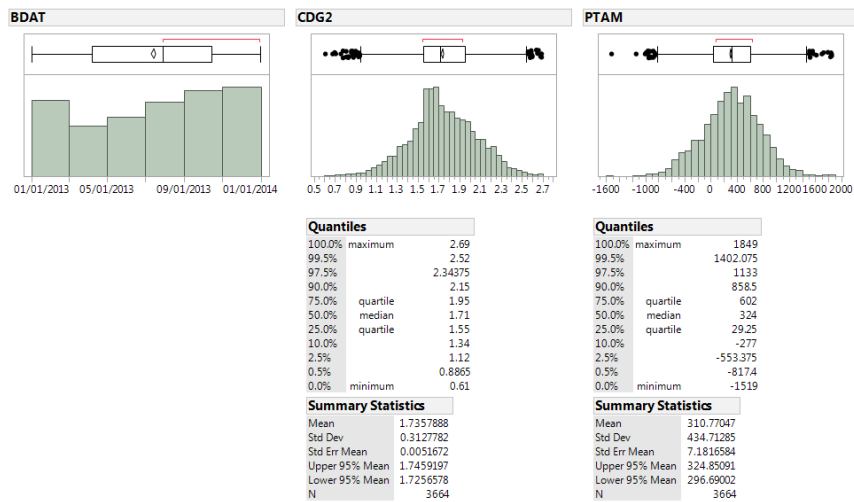
- Two large dairy herds from two geographically diverse areas of US
- Heifers born during 2013 were evaluated using records from DC305
- Backups were dated July 26, 2016
- Goals:
 - Determine if potential culling candidates can be accurately identified during the heifer rearing process
 - What is the value of using this approach if there are more heifers than needed in the pipeline?



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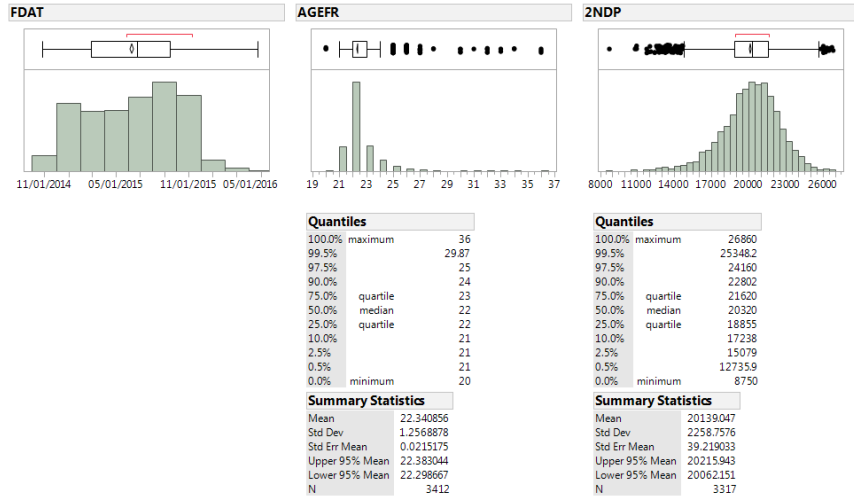
Descriptive Data – All Heifers that Had Current Dairy Gain 2 (CDG2), Predicted Transmitting Ability – Milk (PTAM), and Current Dairy Gain 3 (CDG3) Recorded



Knowledge Solutions

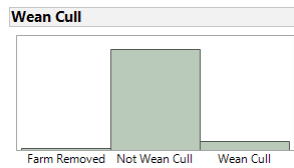
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Descriptive Data – All Heifers that Had CDG2, PTAM, and CDG3 Recorded

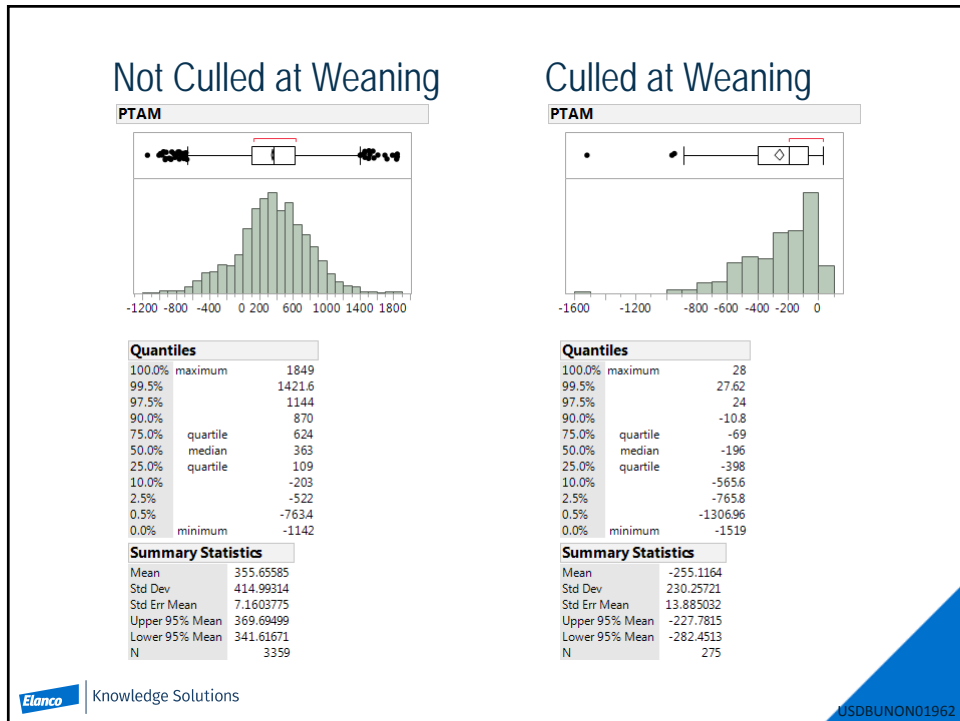
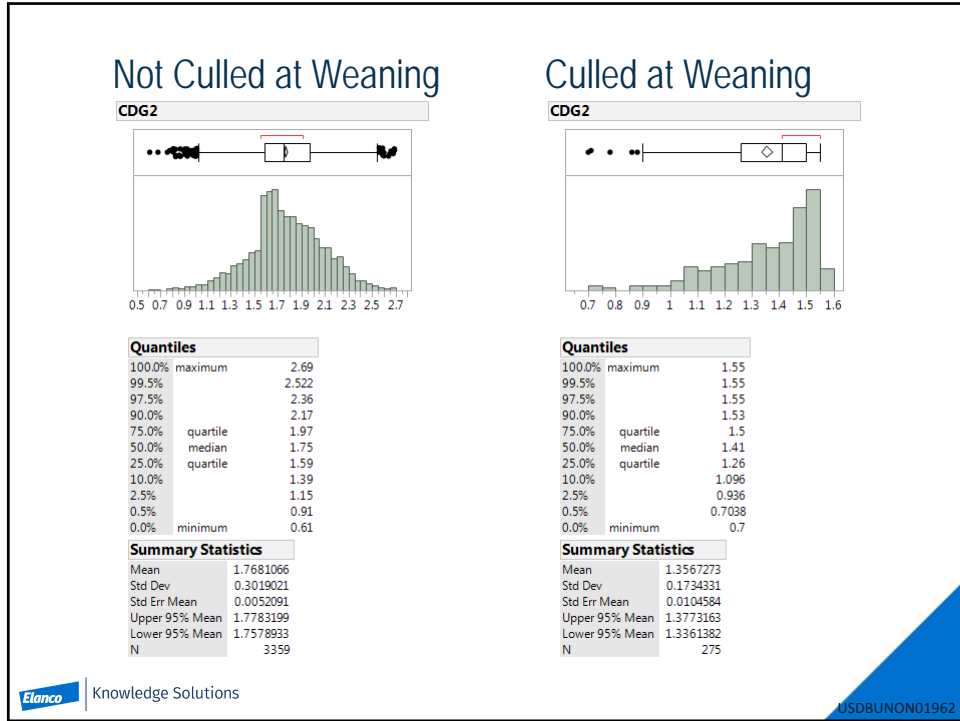


Created Culling Criteria for Post-Weaning Evaluation

- First, eliminated the heifers that died/were sold by dairies prior to 63 days of age
- Then, if below the lower quartile for both CDG2 (1.55) AND PTAM (29), identified them as "Wean Cull"



Level	Count	Prob
Farm Removed	30	0.00819
Not Wean Cull	3359	0.91676
Wean Cull	275	0.07505
Total	3664	1.00000



Developed Three Different Models to Assess for Consideration in Selecting the "Wean Culls"

- Original Approach – Below the lower quartile cut points for CDG2 and PTAM
- More Selective: Below the same cut point AND had Pneumonia recorded by 60 d of age
- Less Selective: Below the same cut point OR had Pneumonia recorded by 60 d of age



Knowledge Solutions

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Created A Model To Predict 2nd305 Milk Using Variables Available At The Time Of Weaning

Original Approach:

Effect Summary

Source	LogWorth	PValue
Birth Month[Herd2]	34.381	0.00000
Wean Cull	14.303	0.00000
Herd2	3.262	0.00055 ^

Summary of Fit

RSquare	0.089305
RSquare Adj	0.082666
Root Mean Square Error	2163.383
Mean of Response	20139.05
Observations (or Sum Wgts)	3317

Wean Cull

Least Squares Means Table

Level	Least		
	Sq Mean	Std Error	Mean
Not Wean Cull	20261.560	41.33466	20236.7
Wean Cull	19127.840	140.76887	18941.3



Knowledge Solutions

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Created A Model To Predict 2nd305 Milk Using Variables Available At The Time Of Weaning

More Selective:
Below cut points
AND pneumonia
prior to 60 days

Effect Summary

Source	LogWorth	PValue
Birth Month[Herd2]	35.893	0.00000
Herd2	4.499	0.00003 ^
Wean Cull w/Pneu	4.101	0.00008

Summary of Fit

RSquare	0.076576
RSquare Adj	0.069843
Root Mean Square Error	2178.45
Mean of Response	20139.05
Observations (or Sum Wgts)	3317

Wean Cull w/Pneu

Least Squares Means Table

Level	Least		
	Sq Mean	Std Error	Mean
Not Wean Cull	20203.893	40.74502	20159.2
Wean Cull	18955.677	314.63083	18794.3

Created A Model To Predict 2nd305 Milk Using Variables Available At The Time Of Weaning

Less selective:
Below cutpoints OF
pneumonia prior to
60 days

Effect Summary

Source	LogWorth	PValue
Birth Month[Herd2]	35.695	0.00000
Wean Cull +/- Pneumonia	12.571	0.00000 ^
Herd2	2.149	0.00710 ^

Summary of Fit

RSquare	0.087134
RSquare Adj	0.080478
Root Mean Square Error	2165.961
Mean of Response	20139.05
Observations (or Sum Wgts)	3317

Wean Cull +/- Pneumonia

Least Squares Means Table

Level	Least		
	Sq Mean	Std Error	Mean
Not a Wean Cull	20306.172	43.392436	20286.8
Wean Cull	19547.492	96.211535	19460.4

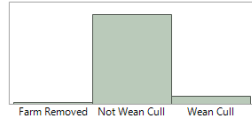
Also Considered Two Additional Different Approaches for Selecting "Wean Culls"

Original Approach

More Selective: Below Cut Points AND Pneumonia by 60 d

Less Selective: Below Cut Points OR Pneumonia by 60 d

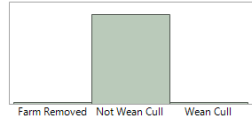
Wean Cull



Frequencies

Level	Count	Prob
Farm Removed	30	0.00819
Not Wean Cull	3359	0.91676
Wean Cull	275	0.07505
Total	3664	1.00000

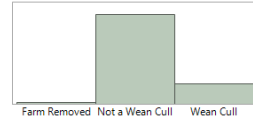
Wean Cull w/Pneu



Frequencies

Level	Count	Prob
Farm Removed	30	0.00819
Not Wean Cull	3581	0.97735
Wean Cull	53	0.01447
Total	3664	1.00000

Wean Cull +/- Pneumonia



Frequencies

Level	Count	Prob
Farm Removed	30	0.00819
Not a Wean Cull	2980	0.81332
Wean Cull	654	0.17849
Total	3664	1.00000

Not Wean Cull minus Wean Cull (LS Means) 1134 lb

1248 lb

759 lb

Not Wean Cull minus Full Population (LS Means) 567 lb

624 lb

379 lb

Continued the analysis with the Original Approach

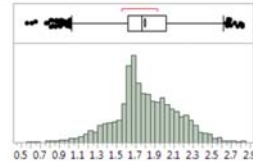


Knowledge Solutions

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Next, "Removed" the "Wean Cull" Heifers and the Farm-Removed Heifers Prior to 120-d and Re-Evaluated the Performance of the Remaining Heifers at 120 d of Age

CDG3



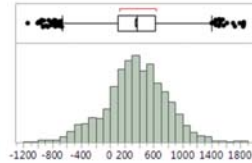
Quantiles

100.0%	maximum	2.82
99.5%		2.592
97.5%		2.43
90.0%		2.23
75.0%	quartile	2.02
50.0%	median	1.76
25.0%	quartile	1.62
10.0%		1.41
2.5%		1.16
0.5%		0.91
0.0%	minimum	0.56

Summary Statistics

Mean	1.8004853
Std Dev	0.3183688
Std Err Mean	0.0054932
Upper 95% Mean	1.8112556
Lower 95% Mean	1.7897149
N	3359

PTAM



Quantiles

100.0%	maximum	1849
99.5%		1421.6
97.5%		1144
90.0%		870
75.0%	quartile	624
50.0%	median	363
25.0%	quartile	109
10.0%		-203
2.5%		-522
0.5%		-763.4
0.0%	minimum	-1142

Summary Statistics

Mean	355.65585
Std Dev	414.99314
Std Err Mean	7.1603775
Upper 95% Mean	369.69499
Lower 95% Mean	341.61671
N	3359

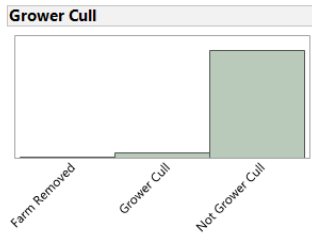


Knowledge Solutions

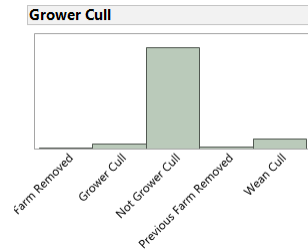
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Created Culling Criteria for Grower Evaluation

- If below the lower quartile for CDG2 (1.62) and PTAM (109), identified them as "Grower Cull"



Level	Count	Prob
Farm Removed	3	0.00089
Grower Cull	144	0.04287
Not Grower Cull	3212	0.95624
Total	3359	1.00000



Level	Count	Prob
Farm Removed	3	0.00082
Grower Cull	144	0.03930
Not Grower Cull	3212	0.87664
Previous Farm Removed	30	0.00819
Wean Cull	275	0.07505
Total	3664	1.00000

N Missing 6992
5 Levels



Knowledge Solutions

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Grower Cull – Predicted 2nd305M Performance Using Data Available at ~4 Months of Age

Effect Summary

Source	LogWorth	PValue
Birth Month[Herd2]	31.066	0.00000
Grower Cull	4.863	0.00001
Herd2	3.126	0.00075 ^
Dummy variable	0.019	0.95687

Summary of Fit

RSquare	0.075812
RSquare Adj	0.068215
Root Mean Square Error	2172.422
Mean of Response	20236.68
Observations (or Sum Wgts)	3067

Grower Cull

Least Squares Means Table

Level	Least		
	Sq Mean	Std Error	Mean
Grower Cull	19520.523	1105.3159	19327.1
Not Grower Cull	20359.426	1089.0788	20278.9



Knowledge Solutions

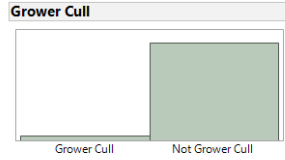
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Repeated the Three Different Selective Models as with the Weaning Evaluation

Original Approach

More Selective: Below Cut Points AND Pneumonia by 120 d

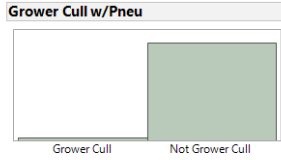
Less Selective: Below Cut Points OR Pneumonia by 120 d



Level	Count	Prob
Grower Cull	144	0.04287
Not Grower Cull	3215	0.95713
Total	3359	1.00000

Not Grower Cull minus Grower Cull (LS Means) 839 lb

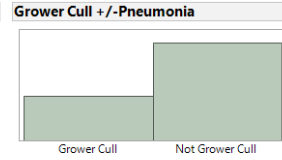
Not Grower Cull minus Full Population (LS Means) 478 lb



Level	Count	Prob
Grower Cull	60	0.01786
Not Grower Cull	3299	0.98214
Total	3359	1.00000

930 lb

660 lb



Level	Count	Prob
Grower Cull	1038	0.30902
Not Grower Cull	2321	0.69098
Total	3359	1.00000

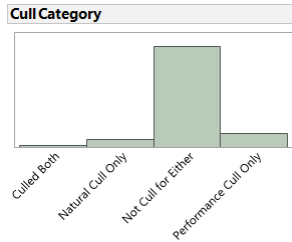
331 lb

253 lb

Continued the analysis with the Original Approach

Finally, Evaluated Which Heifers Survived Through Breeding and Gestation to Actually Calve Into the Herd

Final results were based on using the original models at weaning and at 120 d



Level	Count	Prob
Culled Both	16	0.00437
Natural Cull Only	224	0.06114
Not Cull for Either	3021	0.82451
Performance Cull Only	403	0.10999
Total	3664	1.00000

- "Culled Both" and "Natural Cull Only" did not actually calve – so, no milk weights
- "Performance Culls":
 - Predicted to produce 1064 lb less 2nd305 Milk (p<0.01)
 - 1.33 X higher culling risk by 300 DIM (p=0.055)
 - 6% less likely to become pregnant by 300 DIM (p=0.32)
- "Not Performance Cull" heifers predicted to produce 286 lb more 2nd305 milk relative to whole populations LS Means

Assuming that We Can Predict Which Heifers will be of Lower Value, What is the Impact on the Cost of Raising?

- To examine this question, created three scenarios:
 - Cull selected heifers post-weaning
 - Cull selected heifers post-weaning and post-grower
 - Cull selected heifers post-weaning and at springer stage

- Assumptions used:
 - Housing costs are fixed: i.e., with additional selective culling, cost/remaining heifer for cost of housing increases
 - Labor costs are partially fixed: i.e., with additional selective culling, cost/remaining heifer are treated as 50% fixed, 50% vary based on # of heifers



Knowledge Solutions

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Cost of Raising Heifers (\$/Heifer Calving) Scenario 1: Cull Selected Heifers at Post-Weaning

- Assumed that a 70-d old heifer is sold for \$350:

Baseline scenario

		Proportional mortality adjustment						
		25%	50%	75%	100%	125%	150%	200%
Weight at 1st service, lbs	750	1,989	1,999	2,010	2,020	2,030	2,041	2,063
	770	2,018	2,028	2,039	2,049	2,059	2,070	2,092
	790	2,048	2,058	2,068	2,078	2,089	2,099	2,122
	810	2,077	2,088	2,098	2,108	2,119	2,129	2,152
	830	2,108	2,118	2,128	2,139	2,149	2,160	2,182
	850	2,138	2,148	2,159	2,169	2,180	2,191	2,213
	870	2,169	2,180	2,190	2,201	2,211	2,222	2,245

Culling scenario

		Proportional mortality adjustment						
		25%	50%	75%	100%	125%	150%	200%
Weight at 1st service, lbs	750	2,029	2,040	2,052	2,063	2,074	2,086	2,111
	770	2,058	2,069	2,081	2,092	2,104	2,116	2,141
	790	2,088	2,099	2,111	2,122	2,134	2,146	2,171
	810	2,118	2,129	2,141	2,152	2,164	2,176	2,201
	830	2,148	2,160	2,171	2,183	2,195	2,207	2,232
	850	2,179	2,191	2,202	2,214	2,226	2,238	2,263
	870	2,210	2,222	2,234	2,246	2,257	2,270	2,295



Knowledge Solutions

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Cost of Raising Heifers (\$/Heifer Calving) Scenario 1: Cull Selected Heifers at Post-Weaning (70-d old)

Cost = Culling Scenario - Baseline scenario

Heifer calf value at birth, \$/hd	Vol cull, \$/hd culled						
	\$200	\$250	\$300	\$350	\$400	\$450	\$500
\$100	\$48	\$43	\$39	\$34	\$29	\$24	\$20
\$150	\$53	\$48	\$44	\$39	\$34	\$29	\$25
\$200	\$58	\$54	\$49	\$44	\$39	\$35	\$30
\$250	\$64	\$59	\$54	\$49	\$44	\$40	\$35
\$300	\$69	\$64	\$59	\$54	\$50	\$45	\$40
\$350	\$74	\$69	\$64	\$59	\$55	\$50	\$45
\$400	\$79	\$74	\$69	\$65	\$60	\$55	\$50

Cost of Raising Heifers (\$/Heifer Calving) Scenario 2: Cull Selected Heifers at Post-Weaning AND at Post-Grower Phase

- Assumed that a 70-d old heifer is sold for \$350 and a 130-d old heifer is sold for \$450:

Baseline scenario

Weight at 1st service, lbs	Proportional mortality adjustment						
	25%	50%	75%	100%	125%	150%	200%
750	1,989	1,999	2,010	2,020	2,030	2,041	2,063
770	2,018	2,028	2,039	2,049	2,059	2,070	2,092
790	2,048	2,058	2,068	2,078	2,089	2,099	2,122
810	2,077	2,088	2,098	2,108	2,119	2,129	2,152
830	2,108	2,118	2,128	2,139	2,149	2,160	2,182
850	2,138	2,148	2,159	2,169	2,180	2,191	2,213
870	2,169	2,180	2,190	2,201	2,211	2,222	2,245

Culling scenario

Weight at 1st service, lbs	Proportional mortality adjustment						
	25%	50%	75%	100%	125%	150%	200%
750	2,052	2,063	2,076	2,088	2,100	2,114	2,140
770	2,081	2,093	2,105	2,118	2,130	2,143	2,170
790	2,111	2,123	2,135	2,148	2,160	2,174	2,200
810	2,141	2,153	2,166	2,178	2,190	2,204	2,231
830	2,172	2,184	2,196	2,209	2,221	2,235	2,262
850	2,203	2,215	2,228	2,240	2,252	2,266	2,294
870	2,234	2,246	2,259	2,272	2,284	2,298	2,325

Cost of Raising Heifers (\$/Heifer Calving) Scenario 2: Cull Selected Heifers at Post-Weaning AND at Post-Grower Phase

- Assumed that a 70-d old heifer is sold for \$350 and a 130-d old heifer is sold for \$450:

Value = Culling Scenario - Baseline scenario

		Performance Culls, \$/hd culled						
		\$200	\$250	\$300	\$350	\$400	\$450	\$500
Heifer calf value at birth, \$/hd	\$100	\$69	\$64	\$59	\$54	\$49	\$44	\$39
	\$150	\$77	\$72	\$67	\$62	\$57	\$52	\$47
	\$200	\$85	\$80	\$75	\$70	\$65	\$60	\$55
	\$250	\$93	\$88	\$83	\$78	\$73	\$68	\$63
	\$300	\$101	\$96	\$91	\$86	\$81	\$76	\$71
	\$350	\$109	\$105	\$100	\$95	\$90	\$85	\$80
	\$400	\$118	\$113	\$108	\$103	\$98	\$93	\$88

Scenario 3: Cull Selected Heifers at Post-Weaning AND at Springer Phase

- Assumed that a 70-d old heifer is sold for \$350 and a springer (45 days from calving) is sold for \$2000:

Baseline scenario

		Proportional mortality adjustment						
		25%	50%	75%	100%	125%	150%	200%
Weight at 1st service, lbs	750	1,989	1,999	2,010	2,020	2,030	2,041	2,063
	770	2,018	2,028	2,039	2,049	2,059	2,070	2,092
	790	2,048	2,058	2,068	2,078	2,089	2,099	2,122
	810	2,077	2,088	2,098	2,108	2,119	2,129	2,152
	830	2,108	2,118	2,128	2,139	2,149	2,160	2,182
	850	2,138	2,148	2,159	2,169	2,180	2,191	2,213
	870	2,169	2,180	2,190	2,201	2,211	2,222	2,245

Culling scenario

		Proportional mortality adjustment						
		25%	50%	75%	100%	125%	150%	200%
Weight at 1st service, lbs	750	2,024	2,036	2,048	2,060	2,072	2,084	2,110
	770	2,055	2,066	2,078	2,090	2,102	2,115	2,141
	790	2,085	2,097	2,109	2,122	2,134	2,146	2,172
	810	2,117	2,129	2,141	2,153	2,165	2,178	2,204
	830	2,149	2,161	2,173	2,185	2,197	2,210	2,237
	850	2,181	2,193	2,205	2,218	2,230	2,243	2,270
	870	2,213	2,226	2,238	2,251	2,263	2,276	2,303

Scenario 3: Cull Selected Heifers at Post-Weaning AND at Springer Phase

- Assumed that a 70-d old heifer is sold for \$350 and a springer (45 days from calving) is sold for \$2000:

Cost = Culling Scenario - Baseline scenario

		Performance Culls, \$/hd culled						
		\$200	\$250	\$300	\$350	\$400	\$450	\$500
Heifer calf value at birth, \$/hd	\$100	\$43	\$38	\$33	\$28	\$23	\$18	\$13
	\$150	\$51	\$46	\$41	\$36	\$31	\$26	\$21
	\$200	\$60	\$55	\$50	\$45	\$40	\$35	\$30
	\$250	\$68	\$63	\$58	\$53	\$48	\$43	\$38
	\$300	\$77	\$72	\$67	\$62	\$57	\$52	\$47
	\$350	\$85	\$80	\$75	\$70	\$65	\$60	\$55
	\$400	\$93	\$88	\$83	\$78	\$73	\$68	\$63

What is the Predicted Value of the Calving Heifers? (based on modeled least square means results)

Modeled differences between heifers at different evaluation points						
Category	P305, lbs	Chg, lbs	Chg, % ¹	NPV, \$ ²	Chg, \$	
Least sq means for all heifers (baseline for wean cull comparison):						
	19,695	Base		2100		
Wean Cull Scenario						
CDG2 and PTAM model: Not culled	20,262	567	103%	2285	185	
CDG2 and PTAM model: Performance culled	19128	(567)	97%	1916	-184	
Least sq means for all heifers (baseline for grower cull comparison):						
	19881	Base		2100		
Grower Cull Scenario						
CDG3 and PTAM model: Not culled	20301	420	102%	2236	136	
CDG3 and PTAM model: Performance culled	19462	-419	98%	1963	-137	
Least sq means for all heifers (baseline for full model comparison, includes new model variables):						
	19932	Base		2100		
Full model (both wean and grower culling)						
Not Culled	20354	422	102%	2236	136	
Performance Culled	19509	-423	98%	1963	-137	

¹ Percent difference applied to all parties

² Economic model was calibrated such that NPV for base scenario equals \$2,100

Estimated Value Minus Raising Cost for Each Scenario (using modeled least square means estimates)

	Scenario 1: Cull Selected Heifers at Post-Weaning			Scenario 2: Cull Selected Heifers at Post-Weaning and Post-Grower			Scenario 3: Cull Selected Heifers at Post-Weaning and at Springer Stage		
	Baseline	Scenario	Net	Baseline	Scenario	Net	Baseline	Scenario	Net
Total Raising Cost per Heifer Calving	\$2,108	\$2,152	\$44	\$2,108	\$2,178	\$70	\$2,108	\$2,153	\$45
Predicted Value per Heifer Calving	\$2,100	\$2,285	\$185	\$2,100	\$2,236	\$136	\$2,100	\$2,236	\$136
Net Benefit (or Cost) of Scenario			\$141			\$66			\$91

Outcomes of Heifers in Modeled Exercise

	Actual Results		Performance Culling	
Total Heifers Starting			3664	
Heifers Culled after Weaning			275	8%
Heifers Culled after Grower			144	4%
Heifers Sold/Died by Farm	243	7%	243	7%
Total Heifers Actually Calving	3421	93%	3002	82%

- Very low actual culling level:
 - 93% of heifers in system calved
- With performance culling:
 - 82% of heifers in system calved
 - Must have extra heifers (or be willing to purchase heifers) to make this approach work

Summary

- This early-stage modeling exercise demonstrates that with good data and careful analyses, selective pressure can be applied to replacement programs to improve the quality of heifers calving
- MUST have extra heifers for this program to work
- MUST have good records to make more accurate decisions
- This approach needs to be repeated across herds to validate the process
- Highly unlikely that a single modeling approach will work across all herds
 - Will need to develop customized approaches for each herd

Thanks For Your Attention!



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