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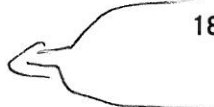
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case





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CAP

SCRO?

maybe

"SCR and unknown  $N$ "

"Example:..."

"Example:..."

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$\rightarrow$  slightly different from 1.3.1

see above: "Example..."?

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# Spatial Capture-Recapture

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