

# Functional Flows Australia (FFAus) documentation

# Luke R. Lloyd-Jones, Ashmita Sengupta and Danial Stratford

A technical document for the Monitoring, Evaluation and Research Basin-Scale Modelling Theme

Commercial In Confidence

**CSIRO DATA61** 

Ecosciences precinct

41 Boggo Road Dutton Park QLD, Australia

Telephone: 1300 363 400

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#### 1 Introduction

To summarise flow we customised the functional flows (FF) approach of Yarnell et al. (2015) to the Australian context. FF focus on retaining specific process-based components of the flow hydrograph, or functional flows, rather than attempting to mimic the full natural flow regime. Key functional components include magnitude, timing and duration of the wet-season initiation flows, wet-season base flows, peak magnitude flows, recession flows, dry-season low flows, and interannual variability.

We re-wrote the functional flows Python code (available at https://github.com/leogoesger/funcflow) to the R programming language to integrate with other components of the Flow-MER modelling Theme's workflow. This required conversion of the primary functions that compute the within-year functional flows metrics from the data. The FF code was initially translated to mimic and recreate the output from the University of California, Davis team's test data and then modified heavily to account for the variability in gauge profiles across the Murray-Darling Basin (MDB). This document details the calculations in the Functional Flow Australia (FFAus) R programming implementation and please note that a large proportion of the concepts embedded in the code is attributed to the University of California, Davis team and intellectual credit should be paid to the original team. The code has been implemented in an R package title ffaus.

Globally the code is designed to take in daily streamflow (e.g., mega litres per day (ML/day)) information in a two-column format (Date, Flow). The code uses original helper functions to first format daily stream flow information into a by-water-year format (water year is defined by the user). The default water year start date is July 1, which coincides with hydrology reporting within the Murray-Darling Basin. These formatted data are passed to a master function with key input parameters and then FF hydrometrics are reported back to the user. The hydrometrics are reported for each year by column and a final column reports the average values over the watering years. It is best to input complete year data so imputing any missing data with the previous or following days flow is recommended if missingness is low or else the code with remove these non-complete years. A global table of the metrics computed using the ffaus package is presented in Table 2.1.

#### 2 Detailed FFAus metric descriptions

The code is integrated with a set of exceedance metrics, which are a priority output for components of the Flow-MER modelling undertaken within the MDB.

## Simple annual metrics

These metrics are computed using the calcAllYear function in the all\_year.R R programming source file.

- Avg\_Ann Average annual flow For each water year the arithmetic mean over the flow values is computed. For the final column All\_Years\_Avg column in the metrics output file the arithmetic mean is taken over the full flow vector spanning the years analysed rather than the mean over the yearly means.
- SD\_Ann Standard deviation of annual flow For each water year the standard deviation over the flow values is computed. Similar to the above annual average the All\_Years\_Avq column for the standard deviation uses all values.

• CV\_Ann - Coefficient of variation of annual flow - For each water year the annual water year flow standard deviation is divided by the annual water year flow average. For the All\_Years\_Avg column the values for the SD and average are taken from the All\_Years\_Avg column.

#### **Troubleshooting**

These metrics should be very robust with no instances of NA expected.

### 2.2 Annual percentile exceedance metrics

We report for each watering year summaries of magnitude, timing, frequency, and duration that coincide with exceedances of the (10, 25, 50, 75, 90) percentiles. These metrics are computed using the calcAllYear function in the all\_year.R R programming source file.

To initiate the computation of these metrics we compute the (10, 25, 50, 75, 90) **percentiles over flow vector for all years passed** to the function. The magnitudes corresponding to these percentiles are then used as the within-year thresholding values except for the within-year magnitude percentiles, which are calculated again within water year.

Within year the number of flow events that exceed the all-years percentiles are computed and the timing, duration and frequency are summarised. The use of \* in the following definitions is used as a placeholder for the elements of the (10, 25, 50, 75, 90) percentile vector.

- Q\*\_Mag Percentile magnitude For each water year, the (10, 25, 50, 75, 90) percentiles
  are computed using sample quantiles. For the All\_Years\_Avg column the percentiles
  over all years are reported.
- Q\*\_Tim Percentile timing For all flow events that exceed the \* magnitude percentile the
  weighted average of the start date of each of these events is reported. The weights used
  are the durations of each of the exceedance events. The computation is

$$T_{Q*} = \frac{\sum_{e=1}^{E} S_e \times D_e}{\sum_{e=1}^{E} D_e}$$

where  $T_{Q*}$  is the timing for quantile \* e.g., Q50, e indexes over the total number of withinyear events E,  $S_e$  is the water year start date index for event e and  $D_e$  is the duration in days of event e i.e., the number of days that flow exceeded the all-year percentile value. The weighted average is used to preference the timing of the largest duration event.

- Q\*\_Fre Percentile frequency The number of unique events where flow exceeded the all years \* magnitude percentile. Gaps between events must be greater than three days to be a unique event and the minimum duration is 1 day.
- Q\*\_Dur Percentile duration The number of total water-year days that flow exceeded the all-years \* magnitude percentile.

To distinguish the longest duration exceedance event in water year days we summarise for each percentile the magnitude, timing, season, and duration of this flow event. The magnitude thresholds used to define the events are again the (10, 25, 50, 75, 90) percentiles computed over all years of data.

- Q\*\_Mag\_Lng\_Evt Peak magnitude of flow for the days of longest Q\* flow event.
- Q\*\_Strt\_Tim\_Lng\_Evt The initiation day of the water year for the longest Q\* flow event.
- Q\*\_Strt\_Sea\_Lng\_Evt The season in which the longest Q\* event initiated. Reported as

summer sum, autumn aut, winter win, or spring spr.

Q\*\_Dur\_Lng\_Evt - The number of total water-year days of the longest Q\* event.

#### **Troubleshooting**

These metrics are subject to instances of NA. When might these arise and for what reasons?

- There may be instances, particularly for Q75 and Q90 metrics, where within a watering year the flow exceeds the all-years percentile magnitudes. In essence, there are no exceedances for that year. In these cases, NAs are reported.
- For instances where all flow values exceed the Q\* threshold then a summary of the whole year's flow is reported e.g., duration would be 365/366 and frequency 1.

#### 2.3 Flow initiation

This component represents the first major storm event following the dry season and signals the transition from dry to wet season and serves important functions, such as moving nutrients downstream, improving streamflow water quality, and signalling species to migrate or spawn. The flow initiation typically is distinct from the wet-season start but may not be distinguishable in some years depending on climate conditions. The metrics calculated for flow initiation include the timing, magnitude, and duration of the initiation flow event and typically occur in winter or spring across the MDB. The core function that implements the algorithm/s below in the ffaus R package is flow\_initiation.R.

The fall pulse flow describes a peak in the annual hydrograph created by the first significant increase in flow following dry season low flows. The fall pulse flow is the first date between October 1st to December 15th in which flow exceeds a pulse threshold, which is defined as twice the magnitude of the previous dry season's base flow or 1 cfs, whichever is greater. This pulse flow often takes the form of a storm event that introduces a rapid input of flow into the stream system. The fall pulse typically occurs each year but may not occur in some years depending on climate conditions. The metrics calculated for fall pulse include the timing, magnitude, and duration of the fall pulse flow event.

The fall pulse flow magnitude is set as the peak magnitude of flow during the pulse flow event. For more information on the fall pulse flow timing metric, which drives the fall pulse flow magnitude, see the section on fall pulse flow timing. This metric is measured in units of cfs.

Determine the timing of the fall pulse flow. See the subsection on Fall Pulse Flow Timing for steps to calculate the timing of the fall pulse flow. Assign the magnitude of the fall pulse flow as the peak magnitude of the fall pulse flow event.

Loosely the flow initiation/pulse event requires that a peaks of the water year fulfils the following requirements:

- Timing is before the wet season start date or before a user-defined value
- Duration of the rising limb, which is calculated as the number of days from the beginning
  of the flow event until the flow event peak, of the pulse flow is under 20 days (ensures the
  peak is flashy enough). Also referred to as the half-duration.
- The peak itself, from bottom of the rising limb on either side to the top of the peak, is above

a relative percent of 30%. This also ensures that the peak is flashy enough. There are four cases below that that ensure the flashiness of the initial peak and cover scenarios that arise.

Relative magnitude is above the median baseflow magnitude threshold. The value of this
threshold varies depending on the magnitude of the baseflow. The threshold is usually set
as 2 times the previous dry season's baseflow, unless the baseflow is exceptionally high,
in which case the threshold is set as 1.5 times the baseflow.

#### 2.3.1 Detailed algorithm steps

- 1. Separate out flow data for each watering year
- 2. For each watering year compute the dry-season start date see description below for details.
- 3. Append data from prior year's dry season. This assists with the smoothing algorithm, where problems usually arise at edges of the smoothed hydrograph. If no dry-season is available then just the current years data are used and edge problems are accepted.
- 4. Compute three layers of smoothed data using the sm.regression function. This is a Gaussian Kernel smoothing approach and  $\sigma$  determines how close a fit to the observed data is expected. Low values of  $\sigma$  give a close fit with higher values a smoother fit.
  - Wet season filter data. Default smooth of  $\sigma=4$ , which is a mid-range smooth.
  - Slope detection data. Default  $\sigma=2$ , which leads to a smooth close to the observed data.
  - Broad filter data filter. Default  $\sigma=15$ , which is a heavy smooth i.e., summarises major peaks of the flow hydrograph.
- 5. Calculate the return to wet date, which signals the start of the wet season. To calculate this we perform the following steps
  - (a) Compute the peaks of the wet-season filter data. Note the largest peak magnitude  $Q_{\max}$ . Compute the  $Q_{\min}$  as the minimum value of flow from the first day of the water year up to the date of  $Q_{\max}$ .
  - (b) Use the splinefun function to perform cubic (or Hermite) spline interpolation on the slope detection data.
  - (c) Calculate the first derivative of the spline function, which is easily performed once we have a spline function of Hermite type.
  - (d) Cycle over the peaks p from start of flow hydrograph to  $Q_{\text{max}}$  and calculate

$$(Q_p - Q_{\min})/(Q_{\max} - Q_{\min})$$
.

If this ratio is greater than 0.3 then set this to be the maximum search index. Looking to find the first peak that is 30% of the maximum peak height from the minimum flow.

- (e) From this 30% peak cycle in reverse over the daily flow data and compute
  - The daily d value ratio of the maximum  $R_1 = (Q_d Q_{min})/(Q_{max} Q_{min}))$
  - $R_2 = Q_{\rm max}/{\rm slope\_sensitivity}$ . Default slope\_sensitivity = 300. Cap on the rate of change, which is dependent on maximum flow.

- (f) When  $R_{1d} < 0.2 \& R_2 < f'(d)$  then set d to be the start date of the water year. f'(d) is the first derivative of the spline function above evaluate for index d. Looks for value that is 20% of the maximum and slope is changing such you would reach maximum in 300 days.
- (g) Report wet-season start date as the day index corrected for number of dryseason days appended from previous year.
- 6. Compute filter data sm.regression function. Default  $\sigma=2$ .
- 7. Use the splinefun function to get spline interpolation of filter data.
- 8. Compute the peaks and troughs of the spline fit to the filter data.
- 9. Note the date and value of the largest peak magnitude  $Q_{\text{max}}$  of the filter data. Compute the  $Q_{\text{min}}$  as the minimum value of flow from the first day of the water year up to the date of  $Q_{\text{max}}$ .
- 10. Use data from previous water year's, which is really part of the same dry-season but may span the water year boundary, and current dry-season base flow and compute the  $Q_{50\text{-baseflow}}$  over these flow values.
- 11. Define the minimum initiation flow  $Q_{\min \text{ init mag}}$  magnitude as 2  $\times$  dry-season base flow median
- 12. Cycle over the peaks  $p \in (1, \dots, P)$  of the spline fit to the filter data and test the following four cases
  - Case 1 Initiation flow date is before half-duration

$$\begin{split} &(I_p < D_{1/2}) \land \\ &(I_p \neq 1) \land \\ &[Q_p > Q_{\texttt{broad filter}}(I_p)] \land \\ &(Q_p > Q_{\texttt{min init mag}}) \land \\ &(I_p <= I_{\texttt{max init day}}) \end{split}$$

where  $I_p$  is the water year day (index) at peak p,  $D_{1/2}=20$  the default half-duration,  $Q_p$  is the flow value at p,  $Q_{\tt broad\ filter}(I_p)$  is the flow value of the smoothed broad filtered data at  $I_p$ ,  $I_{\tt max\ init\ day}=175$  is a user-defined last water-year date for initiation flow.

 Case 2 If peak and valley is separated by half duration, or half duration to the left is less than 30% of the peak value.

$$\begin{split} & \left[ \left( \frac{Q_p - f(I_p - D_{1/2})}{Q_p} > \tau_{\mathsf{init}} \right) \ \lor \left( I_m - I_p < D_{1/2} \right) \right] \ \land \\ & \left[ Q_p > Q_{\mathsf{broad filter}}(I_p) \right] \land \\ & \left( Q_p > Q_{\mathsf{min init mag}} \right) \land \\ & \left( I_p <= I_{\mathsf{max init day}} \right) \end{split}$$

where  $\tau_{\text{init}}=0.3$  is default initiation threshold percent,  $I_m$  is the water year day (index) at minimum  $m\in(1,\ldots,M)$ .

• Case 3 Valley and peak are distanced by less than half duration from either side

$$\begin{split} & \left[ \left( I_m - I_p < D_{1/2} \right) \vee \left( I_p - I_{m-1} < D_{1/2} \right) \right] \wedge \\ & \left[ Q_p > Q_{\text{broad filter}}(I_p) \right] \wedge \\ & \left( Q_p > Q_{\text{min init mag}} \right) \wedge \\ & \left( I_p <= I_{\text{max init day}} \right) \end{split}$$

 Case 4 Both sides of flow value at the peak plus half duration index fall below initiation threshold percentage.

$$\begin{split} & \frac{[f(I_p - D_{1/2}) - Q_{\min}]}{Q_p - Q_{\min}} < \tau_{\text{init}} \; \wedge \\ & \frac{[f(I_p + D_{1/2}) - Q_{\min}]}{Q_p - Q_{\min}} < \tau_{\text{init}} \; \wedge \\ & [Q_p > Q_{\text{broad filter}}(I_p)] \; \wedge \\ & (Q_p > Q_{\min \; \text{init mag}}) \; \wedge \\ & (I_p <= I_{\max \; \text{init day}}) \end{split}$$

- 13. If any of these cases are satisfied then  $I_p$  is set at the initiation flow water-year timing and  $Q_p$  the initiation flow magnitude.
- 14. The duration is calculated by setting slope and magnitude thresholds on either side of the initiation flow event peak (rising limb (left) and falling limb (right)). The derivative threshold ( $\tau_{f_l'}=0.5$ ) is higher for the left side (steeper rising limb) and lower ( $\tau_{f_r'}=0.3$ ) for the right side (less steep falling limb). The magnitude threshold are percentile requirements for the left or right side of the initiation flow peak. For the rising limb, the bottom of the rising limb must be below a relative magnitude threshold ( $\tau_{Q_l}=0.5=0.80$  (80th percentile)) based on all flow values on the left side of the peak. The same requirement is used for the right side ( $\tau_{Q_r}=0.5=0.80$  (80th percentile)) of the peak. Given these input values we then
  - Determine the peaks and minimums of the smoothed filtered data.
  - If a  $Q_m$  is within 10 days of the initiation flow peak on either side, set that minimum date as the start (left) or end (right) of the initiation flow.
  - If not, fit a smoothing spline to data from left side minimum to peak and peak to right side minimum separately.
  - Compute the first derivative of these two sets of smooths.
  - If rising limb side of initiation flow is not within 10 days of the peak, then from the peak find the first filter data value such that

$$f'(d)_l < \tau_{f'_l} \land Q_{dl} < \tau_{Q_l}$$

where d iterates over the days to the left of the initiation peak and e.g.,  $Q_{dl}$  is the magnitude at day d from the left side l.

 A similar process is performed for the right hand side except spline and derivatives are computed for the falling limb.

- Once the left and right ends of the initiation flow have been detected then
  - Set the duration as the number of days between the left side of the fall pulse flow peak and the initiation flow peak.
  - If there is no left side identified, set the duration as the number of days between the initiation flow peak and the right value of the falling limb.

#### Flow initiation pulse 2010

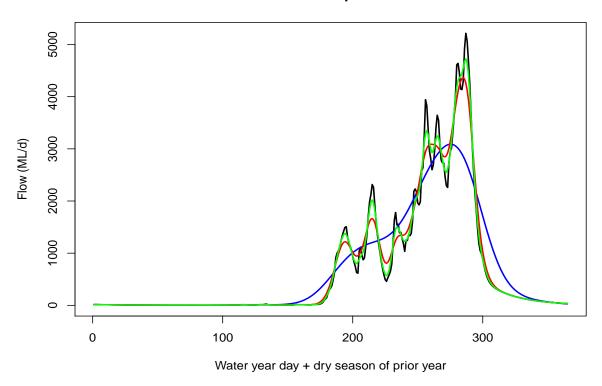


Figure 2.1: Example of the three layers of smoothing for flow initiation detection.

- Init\_Mag Peak magnitude of initiation flow detected by above algorithm.
- Init\_Tim The water year day of peak initiation flow detected using above algorithm.
- Init\_Dur The number of days from peak to rising or falling limb such that the flow is less than 80% of the peak and the slope of the hydrograph is 30% (left) or 50% (right) of the observed slope values computed from the spline of the observed flow values to the left or right of the peak.

#### **Troubleshooting**

These metrics are subject to rare instances of NA. When might these arise and for what reasons?

 In rare instances the broad filter smoothing parameter can lead to a failing of the code to detect an initiation flow. This parameter can be adjusted by changing the init\_broad\_sigma parameter in the getFFMetrics R function.

#### Dry season start and baseflows 2.4

The dry season period represents the low magnitude, low variability portion of the water year, which typically spans the winter periods. For FFAus the dry season functional flow component is summarised using the following metrics

- **Dry\_Tim** The water year day where the wet-season has receded sufficiently and dry-season deemed to have started.
- Dry\_Dur The number of water year days from dry-season start to wet-season start.
- **Dry\_NoFL\_Days** The number of water year days within the dry-season duration in which no flow was recorded.
- Dry\_Mag\_\* The 10th, 50th, and 90th percentile magnitude of the dry-season flow data.

The key computational components required for the dry-season summary is the the dry-season timing and the wet-season initiation timing. The wet-season timing calculation is detailed below. To compute the dry-season timing we perform the following computational steps

- For each water year we append 30 days of the following water year conditional this year not being the final year or there is a gap in water years. If it is the final year or a gap the final 30 days of that year are repeated. The rationale for this is to assist with smoothing at the end of the water year boundary, which typically, and by construction, divides the dry-season.
- 2. Fit an intermediate smoothing spline default  $\sigma = 5$  to the water year flow data.
- 3. Fit a spline function (f(.)) to the smoothed data and then compute the derivation (f'(.)).
- 4. Determine the peaks and minimums of the smoothed data.
- 5. Find the first peak inflow after the maximum peak flow date ( $I_{MPD}$ ), which defaults to water-year day 250 from a 01/07 water year start (early March).
- 6. Determine a minimum threshold  $\tau_{\text{ds-min}}$  set to be the 12.5 percentile of the flow data from maximum peak flow date to end of the extended flow year's data.
- 7. Iterate of each water year day d and determine the first water year day such that

$$\begin{split} |f'(d)| &< Q_{\rm max}/\gamma \; \land \\ I_d &> I_{\rm MPD} \; \land \\ Q_{\rm d} &<= \tau_{\rm ds\text{-}min} \end{split}$$

where  $\gamma$  is referred to as the sensitivity in the code.

8. The date in which this criteria is satisfied is set as the dry-timing.

The above logic summarises that flow must drop below the 12.5 percentile and have an absolute rate of change that is slow and determined by the maximum flow and sensitivity.

Given the dry-season start date and wet-season start-date we compute

- Duration is just the number of days between dry-season start date and wet-season start date.
- $Q10_{\rm DS},~Q50_{\rm DS},~Q90_{\rm DS}$  is computed from the percentiles of the flow data for the duration of the dry-season.
- No flow days is just the sum over the days of no flow.

#### **Troubleshooting**

These metrics are subject to rare instances of NA. When might these arise and for what reasons?

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• In rare instances the last peak may be great than the default  $I_{\text{MPD}} = 250$ . This can be set using the max\_peak\_flow\_date parameter in the getFFMetrics R function.

#### 2.5 Wet season

The wet season describes the period of the annual hydrograph with elevated flows. We summarise this portion of the annual hydrograph using peak magnitude flows and a description of the baseflow including magnitude (Q10,Q50), timing and duration. The peak flows are summarised using the whole annual flow hydrograph.

The pivotal computations for describing the wet season at the wet season initiation dates and the recession dates as these define the portion of the hydrograph that is summarised for baseflow calculation. The peak flows are summarised using the whole year's hydrograph and thus don't rest on the wet-season start and end date computations. The flow recession start date is detailed below. The wet season start dates were computed as part of the initiation flows computation and the reader is referred to Step 5 of the algorithm in that section.

- Wet\_BFL\_Mag\_\* We compute the 10th and 50th percentiles of the flow data for the period between the wet-season start and recession start.
- Wet\_Tim This is defined explicitly in Step 5 of the initiation flows descriptions. However, the wet season baseflow start date is defined as the date that sufficient base flow has accrued based on a magnitude and rate of change threshold.
- Wet\_BFL\_Dur The number of days between the wet-season start and recession start.
- Peak\_Mag\_Ann The peak magnitude for that water year.
- Peak\_Mag\_Tim The water year day of peak magnitude.

For the following metrics we compute the 80th, 90th, and 95th percentiles of the flow data for the whole period of flow. These are then used as exceedance values for the computation of the following metrics. For each magnitude threshold the flow events above these thresholds are summarised in the following way.

- Peak\_Mag\_\* For all events that exceed the Q\* threshold take the median over the maximum values for each event. For example, if there are three events that exceed a Q80 threshold of 390 with peak magnitudes for each event being 400, 500, and 450 then the metric reported would be 450.
- **Peak\_Dur\_\*** Sum over the days in which flow exceeds the *Q\** threshold.
- **Peak\_Fre\_\*** The number of events that exceed the Q\* threshold. An event has to be at lest one day and a gap of three days to be a unique event.
- Peak\_Tim\_\* The median over the exceedance event start dates.

We further summarise peak flow shape and peak frequency hydrometrics functions from Allison Whipple's <code>hydrospatial</code> R package. The code rests on passing a user defined percentile value in which to summarise the peaks of each year's hydrograph using the <code>whipple\_exceed\_thresh</code> parameter, with the default being 0.95. The threshold is then used to calculate a magnitude value corresponding to that percentile over all years of flow data. Data are then prepared into format <code>hydrospatial</code> and then flood events determined using the <code>hydrospatial</code> R function <code>utils\_floodid</code>. For each water year the following hydrometrics are summarised given the magnitude threshold

- No\_Events Number of events that exceed the threshold defined by
- No\_Peaks\_Avg The average number of peaks within exceedance events. For example, if
  we have four exceedance events and the first event has two peaks and the rest one peaks
  then the metric reported is 1.25.
- No\_Peaks\_Max The maximum number of inter-event peaks. For example, for the above scenario of four events the value reported would be 2.
- Frac\_V\_Cent\_Avg Over all events the mean value of the number of days to >0.5 of total flood event volume divided by the total number event days.
- Frac\_V\_Cent\_Max For the event that contains the maximum flow for the water year, the
  value of the number of days to > 0.5 of total flood event volume divided by the total number
  event days.

#### **Troubleshooting**

These metrics are subject to instances of NA. When might these arise and for what reasons?

- If the wet season start date or recession start date are absent then summaries of the intermediate wet season base flows may not be present. Refer to these sections separately if these are absent.
- For particular watering years, it is possible and likely for Q95 thresholds that there are no flow events that exceed the Q\* threshold. In these instance the metrics that depends on these thresholds will report NA, which typically includes the Whipple metrics. The threshold percentile for the Whipple metrics can be altered using the whipple\_exceed\_thresh parameter.

#### 2.6 Recession flows

The recession marks the shift from high magnitude flows to the dry season base flow. A continuous decline in flows is expected during this period until the beginning of the summer base flow is reached. The metrics used to characterise the flow recession are magnitude and timing on the first day of the recession, duration of the spring recession period, and rate of change of flow across the period of decline.

The principal calculation is the detection of the start of the recession which is calculated as follows

- 1. Smooth the within year flow data using Gaussian smoothing spline with default filter  $\sigma=10$  to create the 'filter data'.
- 2. Compute the peaks and minimums of the filter data.
- 3. Starting with the first peak before the dry season iterate in reverse over peaks p and set final wet season peak as

$$\begin{split} I_p &< I_{\text{MPD}} \; \land \\ I_p &\geq I_{\text{MMFD}} \; \land \\ \frac{Q_p - Q_{\text{min}}}{Q_{\text{max}} - Q_{\text{min}}} > \tau_{PF} \; \land \\ I_p &< I_{\text{DSS}} \end{split}$$

where  $I_{\mathrm{MPD}}$  is maximum peak flow date (default = 300),  $I_{\mathrm{MMFD}}$  is the minimum max flow

day (default = 80),  $au_{PF}$  is the peak percentage filter (default = 0.5), and  $I_{ t DSS}$  is the dry season start date.

- 4. Given the date for this maximum we define a window around this date of 20 days to the left and 50 days to the right.
- 5. For these windowed data we fit a smoothing spline that closely matches the data. We then fit a spline to these data and compute the derivative of this spline.
- 6. Find all peaks and minimums of this smoothed interval.
- 7. Iterate over the peaks and minimums and set the recession start date as the peak that satisfies

$$\begin{split} f(p) - f(p-1) &> (\tau_{max-f'} \times 1)/\gamma \wedge \\ f(p-1) - f(p-2) &> (\tau_{max-f'} \times 2)/\gamma \wedge \\ f(p-2) - f(p-3) &> (\tau_{max-f'} \times 3)/\gamma \wedge \\ f(p-3) - f(p-4) &> (\tau_{max-f'} \times 4)/\gamma \wedge \\ \frac{f(p) - Q_{\min\text{-win}}}{Q_{\max\text{-win}} - Q_{\min\text{-win}}} &> \tau_{PFMF} \end{split}$$

where  $\tau_{max-f'}$  is the maximum slope value over all  $f'(p_{win})$  in the windowed interval,  $\gamma$ (default = 1000) is the sensitivity parameter that limits the rate of change prior to the maximum,  $Q_{\min-\text{win}}$  is the minimum flow in the window and similarly for the maximum and  $\tau_{PFMF}$  is the percentage of maximum flow threshold (default = 0.5).

- 8. Search over the observed (unsmoothed data) for highest flow value and set this recession start date as the peak.
- 9. Set the **recession magnitude** as the flow value at this date.

Given these above calculations, we can define the metrics reported by the FF code.

- Rec\_Mag The magnitude at the water year recession start date is defined as above.
- Rec\_Tim The water year recession start date defined as above. Essentially the date of the last peak before recession to start of dry season.
- Rec\_Dur The number of days between the recession start date and the dry season start date.
- Rec\_ROC The median of the first derivative values divided by the flow of that day over the recession duration period. Therefore, the ROC represents a percentage rate of change.

Metric name	Flow component	Units	Metric code
Average annual flow	Magnitude	ML/day	Avg_Ann
Standard deviation of annual flow	Variation	ML/day	SD_Ann
Coefficient of variation	Relative variation	Unitless	CV_Ann
Initiation flow magnitude	Magnitude	ML/day	Init_Mag
Initiation flow timing	Timing	Water year day	Init_Tim
Initiation flow duration	Duration	Days	Init_Dur
Wet-season median baseflow	Magnitude	ML/day	Wet_BFL_Mag_50
Wet-season low baseflow	Magnitude	ML/day	Wet_BFL_Mag_10
Wet-season timing	Timing	Water year day	Wet_Tim
Wet-season duration	Duration	Days	Wet_BFL_Dur
Peak magnitude year	Magnitude	ML/day	Peak_Mag_Ann
Peak magnitude timing	Timing	Water year day	Peak_Mag_Tim
Magnitude over quantiles events	Magnitude	ML/day	Peak_Mag_*
Duration over quantiles events	Duration	Days	Peak_Dur_*
Frequency of quantiles events	Frequency	Integer $\geq$ 0	Peak_Fre_*
Timing of quantiles events	Timing	Median start WY day	Peak_Tim_*
Recession magnitude	Magnitude	ML/day	Rec_Mag
Recession timing	Timing	Water year day	Rec_Tim
Recession duration	Duration	Days	Rec_Dur
Recession rate of change	Rate of change	Real number > 0	Rec_ROC
Dry-season high baseflow	Magnitude	ML/day	Dry_Mag_90
Dry-season median baseflow	Magnitude	ML/day	Dry_Mag_50
Dry-season low baseflow	Magnitude	ML/day	Dry_Mag_10
Dry-season timing	Timing	Water year day	$Dry_{\scriptscriptstyle{-}}Tim$
Dry-season duration	Duration	Days	Dry_Dur
Dry-season no flow days	Duration	Days	Dry_NoFL_Days
Number peaks over Q95 events	Frequency	Integer $\geq 0$	No_Peaks_Avg
Number peaks for max Q95 event	Frequency	Integer $\geq$ 0	No_Peaks_Max
Average peak shape over Q95 events	Peak shape	Real number > 0	Frac_V_Cent_Max
Shape of peak for max Q95 event	Peak shape	Real number > 0	Frac_V_Cent_Avg
Percentile (Q*) magnitudes	Magnitude	ML/day	Q*_Mag
Percentile (Q*) timing	Timing	Average start day WY	$Q^*_Tim$
Percentile (Q*) frequency	Frequency	Integer $\geq$ 0	Q*_Fre
Percentile (Q*) duration	Duration	Days	Q*_Dur
Percentile (Q*) magnitude longest event	Magnitude	ML/day	Q*_Mag_Lng_Evt
Percentile (Q*) start timing longest event	Timing	Start day WY	$Q^*\_Strt\_Tim\_Lng\_Evt$
Percentile (Q*) start season longest event	Timing	Season as character	Q*_Strt_Sea_Lng_Evt
Percentile (Q*) duration longest event	Duration	Days	$Q^*_Dur_Lng_Evt$

Table 2.1: Summary of functional flow hydrometrics suite generated by the ffaus R package. The units for magnitude are mega litres per day (ML/day) because the Flow-MER reporting and data generation uses this metric but it can be any flow unit. Water year day refers to the days from July 1 of each year, which is considered the default water year start. Q\* refers to the (10, 25, 50, 75, 90) percentiles with \* representing a place holder for abbreviation i.e., for Q\* metrics these are calculated and reported for all these percentiles. Rows coloured grey are those metrics that were included in the understorey vegetation PFG percent cover analyses.

## References

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#### **CONTACT US**

- t 1300 363 400 +61 3 9545 2176
- e csiroenquiries@csiro.au
- w www.csiro.au

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#### FOR FURTHER INFORMATION

#### **CSIRO DATA61**

Luke R. Lloyd-Jones

- t +61 452001500
- e luke.lloyd-jones@csiro.au
- w Data61

#### **CSIRO Land and Water**

Danial Stratford

- t +61 3...
- e danial.stratford@csiro.au
- w Land and Water

#### **CSIRO Land and Water**

Ashmita Sengupta

- t +61 ....
- e ashmita.sengupta@csiro.au
- w Land and Water