# Applications of Mathematics in urban rainfall-runoff modelling.

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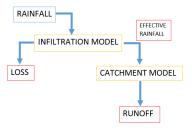
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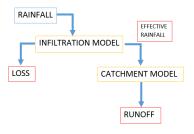
A method to capture these effects is rainfall-runoff modelling.

# Range of Conceptual rainfall runoff models



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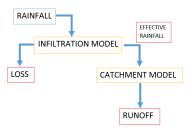
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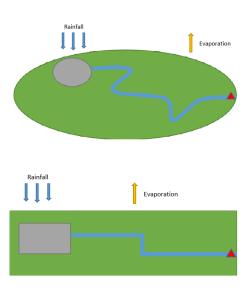
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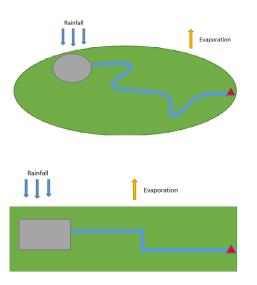


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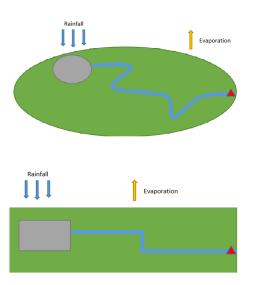
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The applications of runoff models ranges from expanding stream climate and flow records, estimating river flow in ungauged catchments and prediction of the effects of land use change.



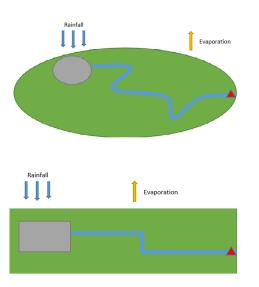


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The location of the urbanisation with relation to the river, can impact transportation times.

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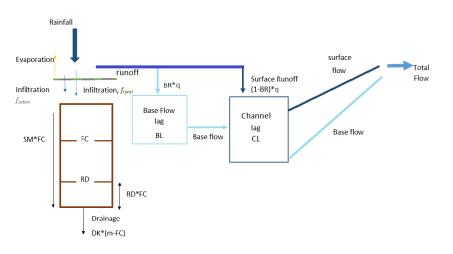
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A nested model approach was used, when no urbanisation is present URMOD defaults to a rural model.

## Visual representation of URMOD



# URMOD processes

**INPUTS** 

RAINFALL, EVAPORATION, RUNOFF CATCHMENT DESCRIPTORS

MODEL CALIBRATES

500 ITERATIONS

OUTPUTS

MODEL PARAMETERS

**INPUTS** 

RAINFALL, EVAPORATION

MODEL SIMULATES

**OUTPUTS** 

EXPECTED RIVERFLOW

How infiltration is treated

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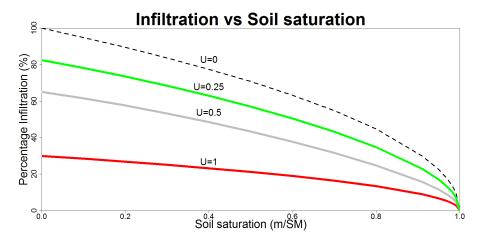
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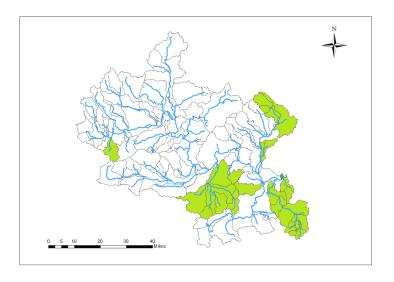
The urban moisture equation

$$\frac{dm}{dt} = \underbrace{\left(1 - u\right)i\left(1 - \frac{m}{SM}\right)^{\frac{1}{2}} + ui(1 - \gamma)\left(1 - \frac{m}{SM}\right)^{\frac{1}{2}}}_{\text{Infiltration}} - \underbrace{D(m - F)}_{\text{Drainage}} - \underbrace{E_p}_{\text{Evaporat}}$$

# Gamma parameter



This is with a fixed scaling term  $\gamma.$  In the above example  $\gamma=0.7$ 



112 catchment's subsetted into 29 catchments in the Thames river.

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Urbanisation levels from 8% up to 55%. Areas ranging from  $8.835 \text{Km}^2$  up to  $690.575 \text{ Km}^2$ . Varying soil types from impervious (London clay) to pervious (chalk).

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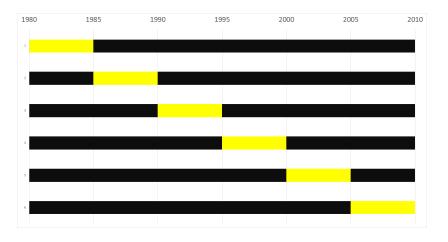
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River runoff data used was in a 30 year period from 1980-2010.

# Calibration and Validation period



The calibration period for the model was the black years, where as the Validation periods is the yellow years .

#### Performance criteria

The Nash-Sutcliffe efficiency Statistic E

$$E = 1 - \frac{\sum_{n=1}^{n} (Q_{obs} - Q_{sim})^{2}}{\sum_{n=1}^{n} (Q_{obs} - \bar{Q}_{m})^{2}}$$

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A tanh transformation was applied to the E statistic. Too constrict the lower bound of the E, bounds now are (-1,0.762).

#### Jack-knife experiment

The Jack-knife mean is obtained for each catchment.

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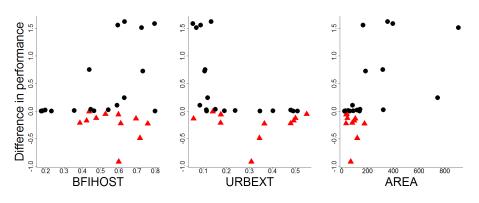
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$$V_N = \frac{N-1}{N} \sum_{j=1}^{N} (Z_{N-1,j} - \bar{Z}_N)^2.$$
 (2)

The 95% confidence intervals are calculated.

$$(\bar{Z}_N - 2*\sqrt{V_N}, \bar{Z}_N + 2*\sqrt{V_N}) \tag{3}$$

# Comparison of urban and rural model



Comparison between Urban model and default rural. Circles indicate Urban model better performance and triangles indicate default rural model better performance.

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Is URMOD a improvment?

#### Further Reading

Bayliss, A., Black, K., Fava-Verde, A., and Kjeldsen, T. (2006). URBEXT2000-a new FEH catchment descriptor. calculation, dissemination and application.

worldbank (2016).

Population growth (annual %).