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Article

# Sustainability of a Rainfed Wheat Production System in Relation to Water and Nitrogen Dynamics in the Soil

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Abstract: Rainfed wheat production systems are usually characterized by low-fertility soils and frequent droughts, creating an unfavorable environment for sustainable crop production. In this study, we used a processed-based biophysical numerical model to evaluate the water balance and N dynamics in soils under rainfed wheat cultivation during 2018 and 2019 at low and medium rainfall sites in South Australia. Estimated evapotranspiration components and N partitioning data were used to compute wheat's water and N use efficiency under rainfed conditions. The results revealed that the soil surface horizon (0-30 cm) was critical in controlling plant water and N uptake responses and N dynamics in the soil. Seasonal soil evaporation losses accounted for 50% of rainfall at the arid, low annual rainfall (219 mm) site (Pygery) and 41% at the medium rainfall (392 mm) site (Yeelanna). Plant water uptake at Pygery was 40-50% of rainfall, and thus little, if any, drainage occurred at this site. Leaching losses of up to 25% of seasonal rainfall at Yeelanna indicate a significant amount of water evading the root zone. Nitrogen (N) applications can play a key role in achieving profitable wheat production in the low-fertility soils prevalent under rainfed conditions. The model-predicted N partitioning revealed that ammonia-nitrogen (NH4-N) contributed little to the plant N nutrition, and its concentration in the soil remained below 2 ppm throughout the crop season except immediately after the NH<sub>4</sub>-N based fertilizer application. Nitrate-nitrogen (NO3-N) gradually increased (maximum 144 ppm) with time, especially in the 0-40 cm horizons, and contributed to most N uptake during both seasons at both locations. The N losses from the soil at the medium rainfall site (3.5-20.5 kg ha-1) were mainly attributed to NH4-N volatilization (N<sub>v</sub>) and NO<sub>3</sub>-N leaching (N<sub>L</sub>) below the crop root zone. Water productivity (8-40 kg ha<sup>-1</sup> mm<sup>-1</sup>) and N use efficiency (31-41 kg kg<sup>-1</sup>) showed immense variability induced by climate, water availability, and N dynamics in the soil. These results suggest that combining water balance and N modeling can help manage N applications to optimize wheat production and minimize N losses in rainfed agriculture.

**Keywords:** wheat; rainfed; water balance; nitrogen uptake; water productivity; nitrogen use efficiency; HYDRUS

#### 1. Introduction

Water is one of the most limiting factors to increasing food and fiber production, especially in the arid and semi-arid regions of the world. In these regions, rainfall is insufficient and highly variable, often failing to satisfy the evapotranspiration demand of rainfed crop production. Low and sporadic rainfall in rainfed cultivated regions impacts crop water uptake and nutrient mineralization in soils of poor fertility [1,2]. Thus, crop production is affected by the unpredictability of water availability at crucial crop growth stages, causing yield and quality loss. Numerous studies have shown that grain production in semi-arid rainfed cropping systems strongly depends on soil moisture and N supply, i.e., it is thus co-limited [3,4]. Therefore, water-saving technologies, water retention, and effective use of water and nutrients are of paramount importance in the fragile rainfed production systems.

Wheat production in Australia is characterized by low to medium rainfall (<450mm) and a very high evaporative demand relative to rainfall (>3: 1), with a coefficient of variation of 25–30% [5], making it one of the driest rainfed cropping environments in the world [6]. Moreover, the soils in rainfed regions vary in texture, composition, water-holding capacity, and nutrient availability, which adds to the challenges of sustainable crop production. These factors lead to wide region-to-region and seasonal variability in wheat production. For example, wheat production during 2021-22 (36 Mt) was more than double that in 2019-20 [7], predominantly associated with favorable climatic conditions. However, a long-term yield assessment revealed that the average annual wheat yield in Australia was only 50% (1.73 t/ha) of the potential yield [8]. Therefore, identifying yield-limiting constraints in the soil-plant-atmosphere continuum [9] can help devise ways and means to close this wide gap in the water-limited yield and year-to-year variability in wheat production.

Achieving potential yield with less water has always been an endeavor in increasing the productivity and water use efficiency of crops. One major stumbling block in this pursuit is limited and seasonally varying water availability for rainfed wheat. In this regard, the French and Schultz [10] model has provided a valuable benchmark for assessing the water-limited yield potential of grain crops based on seasonal rainfall. It is widely used by many farmers from rainfed regions in Australia and many other parts of the world. For example, the model prediction for wheat is 20 kg grain ha<sup>-1</sup> mm<sup>-1</sup> of water transpired above 110 mm evaporation. This prediction has been revised numerous times to include various climatic factors such as rainfall distribution and evaporative demand of the environment [11,12] and co-limitation of water and nitrogen factors [13,14]. The co-limitation assessment raised the water-limited wheat yield to 24 kg ha<sup>-1</sup> mm<sup>-1</sup>, suggesting that low nutrient availability reduces water use efficiency and increases the gap between actual and water-limited yield potential. The major limitations of the French and Schultz [10] approach include its inability to account for the impact of the timing of growing season rain and water losses such as runoff or drainage and the assumption of constant seasonal evaporation [15]. These limitations can be addressed by more complex processed-based models commonly used for water balance studies under cropped conditions [16,17].

Water availability in the soils tremendously impacts the nutrient availability and its uptake by the roots. The soil water content not only determines the crop N uptake but also controls biogeochemical N transformations, such as volatilization, nitrification, and urea hydrolysis. Therefore, water and N interactions in the soil affect crop growth and yield attributes, including photosynthesis, foliage growth, crop yield, protein content, leaf senescence, root-to-shoot water and N translocations, and microbial enzyme activity in the soil [4,18-21]. Benjamin et al. [22] reported that N uptake and N use efficiency were reduced with limited water availability during crop growth and corresponding limited N movement in the soil. On the other hand, N leaching and denitrification can occur when excessive water is applied [23]. Similarly, an appreciable amount of N can be lost to the atmosphere due to ammonium volatilization, especially when urea is top-dressed on the soil surface during the growing season [24,25].

Angus and Grace [1] reported that most grain cropping systems in Australia have a negative N balance, resulting from more N exported off-farm in agricultural products than applied as fertilizer or through biological nitrogen ( $N_2$ ) fixation. Numerous studies found that the recovery efficiency of N in rainfed wheat production is as low as 30-50% [1,26-28]. Furthermore, Gastal et al. [26] reported that between 50 and 75% of the applied N is either retained in the crop residues, remains in the soil, or is lost from the system, leading to environmental problems. Other studies also revealed that N

applications higher than the crop demand might result in leaching losses, which could contaminate groundwater and trigger the eutrophication of freshwater and marine ecosystems [29,30]. Climate change further aggravates the problem and uncertainty regarding the supply of resources [31] and their optimum utilization [32]. Thus, maximization of water and N use is essential for ensuring long-term productive potential and maintaining the ecological functions of natural resources [33]. Hence, an increase in nitrogen use efficiency (NUE) will not only reduce the amount of applied N but also minimize N-related environmental pollution [34]. Therefore, accurate estimates of N reactive fluxes, plant uptake, and N losses (including gaseous) are required to fully understand N dynamics in the soil under rainfed wheat production systems.

Several process-based models (e.g., APSIM and HYDRUS) can provide estimates of effective water and N balances, use efficiencies, and losses from agricultural production systems. These models integrate the effect of rainfall, soil, weather, and other management practices to predict the dynamics of water and N movement in soils [35]. APSIM has been widely used in Australia to model the fate of water and nitrogen in rainfed farming systems (e.g., Keating et al. [16,36]). However, most of these studies have only used the bucket-type water balance module, the results of which can deviate from those provided by numerical simulations (e.g., HYDRUS), which provide more precise solutions of the partial differential equations describing non-linear water flow and convective-dispersive solute transport in soils [17].

Hence, the objectives of this investigation were to evaluate daily and seasonal soil water balances, including wheat's root water uptake and the dynamics of N in the soil (mineralization, transformation, plant uptake, and gaseous losses), using HYDRUS-1D. Water (WUE) and N use efficiency (NUE) of wheat were also estimated using the model-simulated water and N balance components. This information can help devise better guidelines for enhancing fertilizer use efficiency and reducing N losses in rainfed wheat production regions.

# 2. Materials and Methods

# 2.1. Study sites

The study was part of a project to evaluate soil moisture and N information to assist farmers on the Eyre Peninsula in South Australia in making better management decisions for profitable wheat production. Two sites, i.e., Pygery (-32.9838 °S, 135.3642 °E) and Yeelanna (-34.1369 °S, 135.7665 °E), representing different soils, climates, and N applications, were selected for this study to assess water and nitrogen dynamics in the soils under wheat production. The Pygery (Py) site is located in the West Coast region of the Eyre Peninsula and is characterized as a low rainfall zone. Annual average rainfall and reference crop evapotranspiration (ETo) at this site during the last 100 years amounted to 327 and 1397 mm, respectively. The Yeelanna (Ye) site is located in the Lower Eyre Peninsula region, with annual average rainfall and ETo of 411 and 1172 mm, respectively. More details about this project and specific growing conditions can be found in [37].

Cereals (wheat, barley), rotated with canola or pasture legumes, are the widely grown crops in the study region. However, a wheat crop was grown at both locations during the study period (2018 and 2019). Details about wheat variety, spacing, density, sowing, harvesting, and fertilizer applications during the two seasons are given in Table 1. It is worth noting that the amount of the N fertilizer applied at Yeelanna was much higher than at Pygery. This reflects a wide range of N-use practices followed by farmers in different rainfall regions. Apart from the initial application, two doses of 100 kg of N were applied during the season as a top dressing at Yeelanna. An extra N application is typically added in medium rainfall environments to enhance yield and, thus, profitability [38]. Essentially, the extent and timing of N applications in dryland wheat farming systems depend on the timing and intensity of rainfall, which provides the necessary water to dissolve the fertilizer in the soil and make it available for root uptake.

Table 1. Wheat sowing, fertilizer details, and wheat yield at the experimental sites.

	2018	2019
Pygery (I	Py)	
Variety	Mace	Mace
Sowing date	19th May	12th May
Row spacing (mm)		
Plant density (plants m <sup>-2</sup> )	140	160
Fertilizers (applied at sowing)		
MAP (kg ha <sup>-1</sup> )	55	-
Urea (kg ha <sup>-1</sup> )	-	40
Yield (t ha <sup>-1</sup> )	1.45	1.6
Yeelanna	(Ye)	
Variety	Emu Rock	Mace
Sowing date	12th May	22 <sup>nd</sup> May
Row spacing (mm)	307	305
Plant density (plants m <sup>-2</sup> )	150	150
Fertilizers (applied at sowing)		
MAP (kg ha <sup>-1</sup> )	66	
Urea (kg ha <sup>-1</sup> )	100	75
In-season fertilizer		
		100 on 28th
Urea (kg ha-1) and date	50 on 16th July	June
	50 on 17 <sup>th</sup> August	100 on 27th July
Yield (t ha <sup>-1</sup> )	5.67	3.84

Soil moisture probes (Sentek Sensor Technologies, Australia) were installed in 2017, with sensors every 10 cm down to a depth of 40 cm and every 20 cm down to 100 cm. Soil samples were collected from close to each sensor before crop sowing. The basic physicochemical properties of the soil were estimated following the standard procedures [39]. Data on soil texture, bulk density, pH, and organic carbon content are given in Table 2 for both sites. Soil texture at Pygery ranged from sandy loam to sandy clay, with clay contents increasing gradually with depth, while the texture at Yeelanna represents a typical duplex, sandy clay loam at the surface (0-10 cm) with heavy clay underneath. Both sites have soils with pH in the alkaline range and almost similar organic carbon contents (OC), except for a higher OC level (2.03%) in the surface soil at Yeelanna. The cation exchange capacity (CEC) of the soil at different depths was almost double at Yeelanna than at Pygery except in the surface layer (0-15 cm). The soil nitrate (NO3-N) and ammonium N (NH4-N) contents were analyzed at 0-15, 15-30, 30-60, and 60-100 cm soil depths.

Table 2. Physico-chemical properties of soils at the experimental sites.

Depth	Soil	sand	silt	clay	Db	OC	рН	pН	CEC
(cm)	textur		(%)		(g cm-	(%)		(CaC	(Cmol (+)
	e		, ,		3)		$(H_2O$	l <sub>2</sub> )	kg-1)
							)		
	·	·		Pyger	y (Py)			·	
0 - 15	SL*	64.7	13.5	19.8	1.5	1.17	8.5	7.8	17.0
15 - 30	SCL	58.7	12.3	28.9	1.3	0.75	8.7	8.0	22.5
30 - 60	SCL	47.0	21.2	31.8	1.3	0.55	9.3	8.3	25.0
60 - 90	CL	42.7	21.2	36.0	1.4	0.34	9.5	8.5	26.2
90 - 100	SC	45.0	19.3	35.7	1.4	0.34	9.5	8.5	24.7
				Yeelan	na (Ye)				
0 - 15	SCL	70.4	8.7	20.9	1.4	2.03	8.1	7.7	26.1

15 - 30	C	21.8	6.3	71.9	1.3	0.70	8.5	7.9	42.0
30 - 60	C	22.3	6.4	71.2	1.5	0.42	8.6	8.0	45.5
60-90	C	14.3	10.2	75.6	1.6	0.32	9.3	8.3	47.2
90-100	SC	51.5	3.0	45.5	1.6	0.32	9.3	8.3	51.5

<sup>\*</sup> S = sand, C = clay, L = loam; Db = bulk density; OC = organic carbon; CEC = cation exchange capacity.

The particle size distribution and bulk density of different layers at the study sites were measured to estimate the soil hydraulic parameters, which were used as inputs into the HYDRUS-1D model [17]). Measured values of the air-dry ( $\theta_r$ ) and saturated ( $\theta_s$ ) water contents were used in the simulations. Typically, the  $\theta_r$  values ( $\approx 1500 \text{kPa}$ ) were relatively high, a characteristic feature of heavy sub-soil clay commonly occurring in the dryland belt of the study region [40]. These parameters were further fine-tuned during the model calibration using water content dynamics data in the soil. Optimized parameters for both sites used in the numerical model are shown in Table 3.

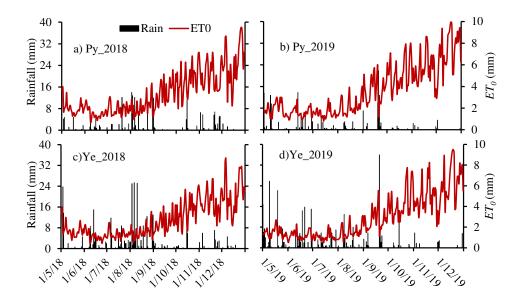
**Table 3.** Estimated soil hydraulic parameters at Pygery and Yeelanna used in the HYDRUS-1D modeling simulations.

Soil	Soil	$\theta_r^*$	$\theta_s$	а	п	Ks	l	$D_b$
texture	depth	(cm³cm-	(cm³cm-	(cm <sup>-1</sup> )		(cm d-1)		(g cm <sup>-3</sup> )
	(cm)	3)	3)					
			]	Pygery (Py)	)			
Loam	0-15	0.05	0.4031	0.024	1.3963	27.11	0.5	1.5
Loam	15-30	0.12	0.4136	0.0224	1.3196	19.14	0.5	1.3
Clay	30-60	0.2	0.4408	0.0172	1.3744	15.56	0.5	1.3
loam								
Clay	60-90	0.22	0.4475	0.0173	1.351	14.39	0.5	1.4
loam								
Cay	90-105	0.24	0.4475	0.0182	1.345	15.83	0.5	1.4
loam								
			Y	eelanna (Y	e)			
Loam	0-15	0.07	0.4548	0.0245	1.4539	53.44	0.5	1.4
Clay	15-30	0.15	0.4582	0.0226	1.3115	17.16	0.5	1.3
Clay	30-60	0.19	0.4444	0.0214	1.2827	9.39	0.5	1.5
Clay	60-90	0.21	0.4869	0.0193	1.1743	5.49	0.5	1.6
Silt	90-105	0.24	0.4915	0.0181	1.1562	11.05	0.5	1.6
loam								

<sup>\*</sup> $\theta_r$  and  $\theta_s$  are the residual and saturated water contents, respectively,  $K_s$  is the saturated hydraulic conductivity,  $D_b$  is the bulk density, and a, n, and l are shape parameters.

# 2.2. Climate parameters

Local climate parameters were obtained from the SILO climate database [41] using the Wudinna Aero station (station 18083) for the Pygery site and the Yeelanna station (station 18099) for the Yeelanna site. At Pygery, both 2018 and 2019 were dry years, with total rainfall during the wheat growing season (May to December) amounting to 208 and 190 mm, respectively (Figure 1). Most of the rain occurred during the winter period (May to August) when the crop water demand was low. Corresponding values of ET<sub>0</sub> at the Py and Ye sites were 829 and 886 mm, respectively (Figure 1).



**Figure 1.** Daily values of rainfall and reference crop evapotranspiration (*ETo*) at the Pygery (a, b) and Yeelanna (c, d) sites during the 2018 (a, c) and 2019 (b, d) wheat growing seasons (May-December).

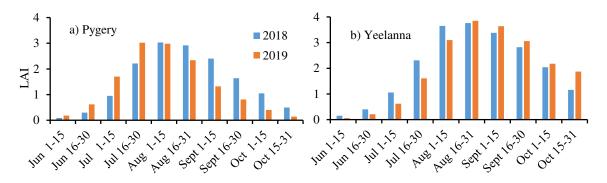
At Yeelanna, average values of rainfall and ETo during the study period (2018-19) and the wheat cropping season (May- December) were 365 and 693 mm, respectively (Figure 1). The ETo values were usually low during the winter season, and then increased during the wheat's post-anthesis period, thus enhancing crop water demand between anthesis and harvest. Thus, low rainfall and high climate water demand at Pygery impose relatively adverse conditions for wheat cultivation compared to the Yeelanna site.

Daily crop evapotranspiration (ETc) values for wheat were estimated from daily reference crop evapotranspiration (ETo) and crop coefficients (Kc) for different growth stages [42]. The daily ETc values were divided into the evaporation (Es) and transpiration (Tp) components based on the leaf area index (LAI) as follows [43]:

$$E_{s} = ET_{c} \cdot e^{-K_{gr} \times LAI}$$

$$T_{p} = ET_{c} - E_{s}$$
(1)

Here,  $K_{gr}$  is the light extinction coefficient for wheat, and its value was set to 0.46 [44] for rainfed conditions. Estimated LAI values of wheat at both locations (Figure 2) were used to estimate daily potential  $E_s$  and  $T_p$  values following the FAO-56 dual crop coefficient approach [42]. These values and daily rainfall were then used as inputs into the HYDRUS-1D model to estimate the actual values of  $E_s$  and  $T_p$  ( $E_s$  act and  $T_p$  act) for wheat at both locations.



**Figure 2.** Estimated leaf area index (LAI) of wheat at the a) Pygery and b) Yeelanna sites during the 2018 and 2019 seasons.

# 2.3. Brief description of HYDRUS-1D

The HYDRUS-1D software can simulate one-dimensional variably saturated water flow, heat movement, and transport of solutes involved in sequential first-order decay reactions [17]. The governing one-dimensional water flow equation is described as follows:

$$\frac{\partial \theta}{\partial t} = \frac{\partial}{\partial z} \left( K(h) \frac{\partial h}{\partial z} - K(h) \right) - R(h, z, t) \tag{2}$$

where  $\theta$  is the soil water content (L<sup>3</sup>L<sup>-3</sup>), t is the time (T), h is the soil water pressure head (L), z is the vertical coordinate (L), z is the unsaturated hydraulic conductivity function (LT<sup>-1</sup>), and z is the sink term accounting for an actual volume of water uptake by plant roots from a unit volume of soil per unit time (L<sup>3</sup>L<sup>-3</sup>T<sup>-1</sup>). Water extraction z from the soil was computed using the Feddes model [45]. Different values of the stress response function for wheat were taken from the HYDRUS-1D data repository. In this method, the potential transpiration rate, z, is distributed over the root zone using the normalized root density distribution function and multiplied by the dimensionless water stress response function. Hence, this model assigns plant root water uptake rates according to local soil water pressure heads at any point in the root zone. Therefore, potential transpiration (z) is reduced below its potential value when the soil is no longer capable of supplying the amount of water required by the plant under the prevailing climatic conditions.

The partial differential equations governing one-dimensional dynamics of N involved in sequential first-order decay chain reactions during transient water flow in a variably saturated rigid porous medium [17] are given as:

$$\frac{d\theta C_1}{dt} = \frac{d}{dz} \left( \theta D_1^w \frac{dC_1}{dz} \right) - \frac{dqC_1}{dz} - \mu'_{w,1} \theta C_1 \tag{3}$$

$$\frac{d\theta C_2}{dt} + \frac{d\rho S_2}{dt} + \frac{da_v g_2}{dt} = \frac{d}{dz} \left(\theta D_2^w \frac{dC_2}{dz}\right) + \frac{d}{dz} \left(a_v D_2^g \frac{dg_2}{dz}\right) - \frac{dq C_2}{dz} - \mu'_{w,2} \theta C_2 + \gamma_{s,2} \rho + \mu'_{w,1} \theta C_1 - r_{a,2}$$
 (4)

$$\frac{d\theta C_3}{dt} = \frac{d}{dz} \left( \theta D_3^w \frac{dC_3}{dz} \right) - \frac{dq C_3}{dz} - \mu'_{w,3} \theta C_3 + \mu'_{w,2} \theta C_2 - r_{a,3}$$
 (5)

where C is the solute concentration in the liquid phase (mg L<sup>-1</sup>), S is the solute concentration in the solid phase (mg g<sup>-1</sup>), g is the solute concentration in the gas phase (mg L<sup>-1</sup>),  $\rho$  is the dry bulk density (g cm<sup>-3</sup>), q is the volumetric flux density (cm day<sup>-1</sup>),  $\mu'_w$  is the first-order rate constant for the solute in the liquid phase (day<sup>-1</sup>), providing connections between individual chain species,  $\gamma_s$  is a zero-order rate constant in the solid phase (day<sup>-1</sup>),  $r_a$  is the root nutrient uptake (mg L<sup>-1</sup> day<sup>-1</sup>),  $D_w$  is the dispersion coefficient (cm<sup>2</sup> day<sup>-1</sup>) for the liquid phase, and  $D_g$  is the diffusion coefficient (cm<sup>2</sup> day<sup>-1</sup>) for the gas phase. The subscripts 1, 2, and 3 represent (NH<sub>2</sub>)<sub>2</sub>CO (urea), NH<sub>4</sub>+–N (ammonium N), and NO<sub>3</sub>-–N (nitrate N), respectively. Adsorption/desorption of NH<sub>4</sub>+ is an instantaneous reaction between the soil solution and the exchange sites of the soil matrix [46].

#### 2.4. Nitrogen balance parameters

Input parameters for the nitrogen transport in HYDRUS-1D are required to characterize the three main sets of processes: solute transport, solute reactions/transformations, and root solute uptake. Baldock et al. [47] defined the following N balance components in the soil, which are crucial to understanding and estimating the annual soil N dynamics.

N balance = 
$$(N_F + N_{Min} + N_{dfa} + N_{dep}) - (N_R + N_L + N_V + N_{Den} + N_E)$$
 (6)

where  $N_F$  is N added to the soil in the form of chemical fertilizers,  $N_{Min}$  is N added to the soil in the form of organic amendments (e.g., manure, composts, etc.),  $N_{dfa}$  is N derived from atmospheric  $N_2$  by symbiotic and non-symbiotic fixation,  $N_{dep}$  is the N deposition from the atmosphere,  $N_R$  is N removed in harvested products,  $N_L$  is N leached from the root zone,  $N_V$  is N volatilized as ammonia from fertilizers and soils,  $N_{Den}$  is N lost as  $N_2$  and  $N_2O$  by denitrification, and  $N_E$  is N lost by erosion.

In the N modeling study, all components of the N balance except for  $N_{dfa}$ ,  $N_{dep}$ ,  $N_{Den}$ , and  $N_{E}$  were considered. Neglected components were either present only in minute amounts ( $N_{dfa}$ ,  $N_{dep}$ ) in the wheat fields or represented negligible processes in dryland conditions ( $N_{Den}$ ,  $N_{E}$ ). Therefore, the mineral N sources consisted of two pathways, i.e., mineral fertilizer applications ( $N_{F}$ ) and organic N mineralization ( $N_{Min}$ ). The latter process is estimated based on the assumption of 3% annual

mineralization estimated for the study region [47]. The following values of solute transport parameters were used in the simulation: the molecular diffusion coefficients in free water ( $D_w$ ) for NH<sub>4</sub>–N and NO<sub>3</sub>–N were 1.52 and 1.64 cm<sup>2</sup> day<sup>-1</sup>, respectively, the molecular diffusion coefficient in the air ( $D_g$ ) for NH<sub>3</sub> was optimized as 18057.6 cm<sup>2</sup> day<sup>-1</sup>, similar to other studies [48], the longitudinal dispersivity was considered equal to one-tenth of the profile depth [49], and Henry's law constant ( $K_H$ , at 25°C) for NH<sub>4</sub>–N was 2.95 × 10<sup>-4</sup> [50]. The distribution coefficients ( $K_d$ ) for NH<sub>4</sub> that varied from 1.0 to 1.8 cm<sup>3</sup> mg<sup>-1</sup> in different soil layers were adapted from Li et al. [48]. These values fall within the range reported for different mixed and layered soils [51]. The urea hydrolysis rate ( $K_h$ ) of 0.74 day<sup>-1</sup> in the topsoil layer (0–10 cm) adapted in the current study is consistent with the reported values in numerous studies under different soils and climate conditions [48,52,53].

Mineralization (organic N to inorganic NH<sub>4</sub>–N) and immobilization (inorganic NH<sub>4</sub>–N to organic N) are two important N transformation processes that occur simultaneously in the soils [52]. It was assumed that these two transformations occurred only in the root zone [54] (0–30 cm) and that they can be represented by a single comprehensive production rate for NH<sub>4</sub>–N ( $K_{Min}$ ) of 0.0045 day<sup>-1</sup> [55], which was optimized (0.00009 day<sup>-1</sup>) for field conditions.

The nitrification rates were calibrated to vary from 0.02 to 0.25 day<sup>-1</sup>, with higher values in the surface soil, then decreasing gradually with depths. The volatilization rate of 0.24 kg ha<sup>-1</sup> day<sup>-1</sup> reported under rainfed wheat cultivation in South Australia [56] was used in the current study. While some of these processes are temperature and water-content dependent, neglecting these dependencies is common [35,48] due to the lack of such information and measured data. Unlimited passive uptake of NO<sub>3</sub>–N was allowed in the root solute uptake model [57] by specifying the maximum allowed uptake concentration exceeding NO<sub>3</sub>–N concentrations in the root zone. In addition to passive uptake, active uptake of NH<sub>4</sub>–N was also integrated into the simulations. The Michaelis–Menten constant for active uptake of NH<sub>4</sub> was assumed to equal the default value of 0.5 mg L<sup>-1</sup>. Other N degradation processes, such as denitrification (into N<sub>2</sub>O and NO) losses, were not considered in this study as they occur at only very low rates (<0.12%) in dryland wheat production systems [58] in Australia. Similarly, Yang et al. [59] reported only 0.41±0.08% N<sub>2</sub>O emission from N fertilizer under the rainfed monocropping system.

#### 2.5. Initial and boundary conditions

The initial water contents at various depths were set using the soil water contents measured by the capacitance probe. Measured ammonium and nitrate contents in the soil, specified in terms of N concentrations (NH<sub>4</sub>-N and NO<sub>3</sub>-N), were set as the initial conditions for N simulations. The initial concentration representing the basal fertilizer application was calculated using the initial soil water content, assuming fertilizer was mixed within the surface 10 cm layer. An atmospheric boundary condition with surface runoff was specified at the soil surface for water flow. The free drainage boundary condition was imposed at the bottom of the domain (105 cm). Root water uptake was calculated using the potential transpiration rate, specified rooting depth and density, and the Feddes' stress response function [45]. The upper boundary condition for solute transport was set as a 'volatile' boundary condition [60] with a stagnant boundary layer of 2.5 cm. This boundary condition assumes that there is a stagnant boundary layer (air) at the top of the soil profile and that upward solute movement through this layer is by solute diffusion in air, facilitating the simulation of volatilization losses of N. A third-type boundary condition was used at the lower boundary. The concentration fluxes of N for all fertilizer applications were calculated in N content terms. The top-dressed fertilizer application during the wheat season is represented in the model by converting the amount of applied urea into the boundary concentration using the known value of the water content in the topsoil layer (from the previous water flow simulation) at the time of fertilizer application.

HYDRUS-1D simulations were commenced on 01/05/2018 and continued until 31/12/2019 for both locations. Theoretical details and more information on the HYDRUS-1D software and related references can be found at https://www.pc-progress.com/en/Default.aspx?HYDRUS-3D.

# 2.6. Model evaluation

$$ME = \frac{1}{N} \sum_{i=1}^{N} (Oi - Pi) \tag{7}$$

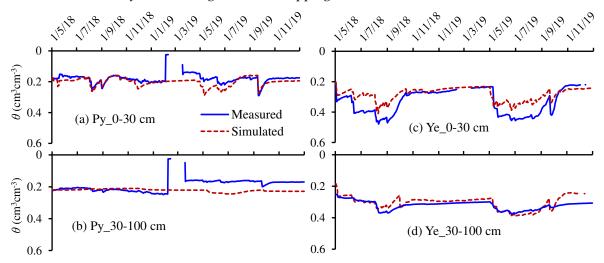
$$MAE = \frac{1}{N} \sum_{i=1}^{N} |Oi - Pi| \tag{8}$$

$$RMSE = \sqrt{\frac{1}{N} \sum_{i=1}^{N} (Oi - Pi)^2}$$
(9)

#### 3. Results

#### 3.1. Soil water dynamics in the soil

The capacitance probe measured daily soil water contents in 0-30 cm and 30-100 cm depths at the Pygery and Yeelanna sites were compared with corresponding HYDRUS-1D simulated values in Figure 3. The simulations showed small changes in the wetting of the upper horizon (<30 cm) at the Py site due to instant depletion of soil moisture in response to soil evaporation and plant transpiration. However, at the medium rainfall site (Ye), the water content rapidly increased in the 0-30 cm horizon. In the second horizon (30-100 cm), both data sets showed only small changes in moisture content over the two wheat seasons. A close correspondence between the observed and modeled moisture distribution patterns exists in both horizons, despite the probe malfunction in 2018 during a short period from mid-February to mid-March 2019 (Figure 3). The moisture probe measured slightly lower values during the post-harvest wheat season, especially at deeper depths (>30 cm). The HYDRUS-1D results distinctly show two soil horizons with a boundary at a depth of 30 cm. It should be noted that measured and simulated moisture contents in the soil below 30 cm are consistently high during both seasons, especially at the Yeelanna site (between 0.25 and 0.35 cm<sup>3</sup>cm<sup>3</sup>). Similar values of soil water contents were observed in other regional studies [61]. This is a typical characteristic of sub-soil heavy clay occurring in the study region, with the clay fraction at the Yeelanna site as high as 75% (Table 1). These soils can hold a large amount of water, varying between 0.2 to 0.25 cm<sup>3</sup>/cm<sup>3</sup> at the wilting point (1500 kPa), which is not available to plants. In addition, these soils may have sub-soil constraints such as compaction, which further restricts the water movement and uptake by growing crop plants [61]. Hence, the water contents in the sub-soils (>30 cm depth) remained consistently static during the entire cropping season.



**Figure 3.** Comparison of measured soil water contents in the 0-30 cm (top) and 0-100 cm (bottom) (profile averaged) with the corresponding simulated values during the 2018 and 2019 wheat growing seasons at the Pygery (a, b) and Yeelanna (c, d) sites on the Eyre Peninsula.

Statistical errors (ME, MAE, and RMSE) assessing the comparison between HYDRUS-1D simulated and measured soil water contents for the soil surface (0-30 cm) and deeper (30-100 cm) layers showed a varied response. The RMSE, MAE, and MAE values for the surface depth (0-30 cm) during the 2018 and 2019 at Pygery remained between 0.01 and 0.03 cm³/cm³, indicating a close agreement. The corresponding values for the 30-100 cm profile were between 0.02 and 0.07 cm³ cm⁻¹, which are slightly higher than the surface layer. At Yeelanna, the values of the error estimates during 2018 ranged from 0.02 to 0.06 and 0.03-0.07 cm³ cm⁻¹ in the 0-30 cm and 30-100 cm soil depths, respectively. During the validation period (2019), the error values varied from 0.04-0.07 cm³ cm⁻¹. Wang et al. [62] reported RMSE and mean relative error (MRE) values of 0.07 cm³ cm⁻¹ and 21.6%, respectively, as accurate estimation of water content dynamics in the soil by SWAP model under wheat irrigated with varied levels of deficit irrigations. Error estimates reported in other studies [35,63] also corroborate well with the values estimated in the current study, which showed a good agreement between measured and simulated water content dynamics in the soil.

There are numerous possible reasons for the deviations in the behavior of water content dynamics in the soil. Apart from model assumptions, capacitance probes can induce significant errors in the water content measurements. Numerical modeling depends on two crucial factors: a) the accuracy of model input parameters and b) the precision of observed values compared with the model output. Ramos et al. [63] showed that deviations between measured and model-predicted water content dynamics in the soils might be related to field measurements, model inputs, and model structural errors. The moisture probe's calibration and the inherent complexities of the soil [64] are additional crucial factors that immensely affect the extent of the divergence between observed and modeled data. These factors may contribute to a similar extent of deviations in water contents as obtained by modeling predictions. It is also likely that higher observed values of the water content at lower depths (>50 cm) at Yeelanna may have contributed to larger values of the error statistics. Overall, a good agreement between the measured and simulated data shows that the model can predict the effects of different weather and soil properties at different sites and respond to various field variations.

#### 3.2. Soil water balance

Seasonal water balance components ( $T_{p \, act}$  = actual plant water uptake,  $E_s$  = soil evaporation,  $D_r$  = drainage,  $\Delta S$  = soil storage/depletion) for the wheat crop at Pygery (Py) and Yeelanna (Ye) predicted by HYDRUS-1D during 2018 and 2019 are shown in Table 4. At Pygery, evaporation losses during the crop season (May to October) varied from 44 to 57%, with an average of 50% of the rainfall received. The remaining water (43-58%) was attributed to plant uptake, while drainage losses were negligible. At Yeelanna,  $E_s$  losses varied from 29 to 42%, with an average value of 33%, significantly lower than at Pygery. Plant water uptake varied from 41 to 49%, with an average value of 40%. The drainage component ( $D_r$ ) represents 12-26% (41-90 mm) of the rainfall received during the cropping season, which is the main difference between the two sites.

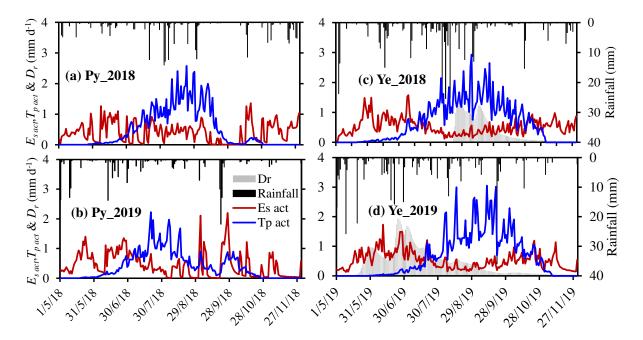
**Table 4.** Seasonal water balance components (mm) simulated by HYDRUS-1D during the 2018 and 2019 cropping seasons at the Pygery (Py) and Yeelanna (Ye) sites.

Site	Year	$E_s$	Tp act	$D_r$	ΔS	Rainfall	Rainfall
						(season)	(annual)
Py	2018	76.6	95.2	0.03	6.4	175.6	235.3
	2019	98.6	85.0	0	-2.8	183.6	201.8
Ye	2018	96.3	140.5	40.8	54.9	333	407.6
	2019	104.3	140.6	90.4	9.2	348.3	375.5

 $T_{p \text{ act}}$  = actual plant water uptake,  $E_s$  = evaporation,  $D_r$  = drainage,  $\Delta S$  = soil storage/depletion.

Daily  $T_{p \, act}$  and  $E_s$  components of the water balance simulated by HYDRUS-1D during 2018 and 2019 at Pygery and Yeelanna are shown in Figure 4. At Pygery, daily plant water uptake varied from

0 to 2.6 mm during 2018, while the maximum value was 2.2 mm during the 2019 crop season. As expected, daily evaporation losses (Es) were higher before sowing and after the crop harvest. However, the magnitude remained low during 2018 (0-1.5 mm), reflecting the moisture availability in the surface soil layer. During 2019, spikes in daily evaporation (up to 2 mm) were similar to plant water uptake, especially during crop maturity and harvest (September and October).

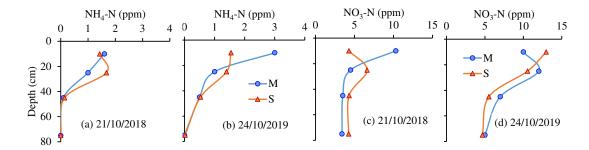


**Figure 4.** Daily rainfall and predicted values of actual evaporation ( $E_{s \ act}$ ), actual plant water uptake ( $T_{p \ act}$ ), and drainage ( $D_r$ ) under wheat crop during the 2018 (top) and 2019 (bottom) growing seasons at the Pygery (a, b) and Yeelanna (c, d) sites on the Eyre Peninsula.

At Yeelanna, the maximum daily plant water uptake ( $T_{p act}$ ) reached about 3 mm during the 2018 and 2019 seasons (Figure 4). The magnitude of daily  $T_{p act}$  losses was similar to Pygery, but there was less fluctuation in the daily dynamics, probably due to consistent availability of moisture in the surface layer. One of the important components of the water balance at Yeelanna is drainage ( $D_r$ ), which was negligible at Pygery. Daily drainage ( $D_r$ ) losses occurred in August-September of 2018, while these losses were higher early in the season (mid-May to August) during 2019.

#### 3.3. Nitrogen simulation in the soils

Nitrogen species commonly occurring in a dissolved state in the soil solution are NH<sub>4</sub>-N and NO<sub>3</sub>-N. These species control the plant-available forms of N in the soils. The dynamics of these species depend on the number and magnitude of N pools in the soil, their interactions, transformations, and exchanges among them. The comparison of measured and simulated values of NH<sub>4</sub>-N and NO<sub>3</sub>-N in the soil at various depths at the time of wheat harvest is shown in Figure 5 for the Pygery site. Some inconsistencies include the higher simulated value of NO<sub>3</sub>-N than measured in the surface soil (0-15 cm) during 2018, which subsequently increased in the second layer (15-30 cm) and then showed a similar pattern as measured values. Similarly, the measured NH<sub>4</sub>-N value was higher than simulated, while the reverse was true for NO<sub>3</sub>-N in the surface layer during the 2019 season. However, at other depths, the simulated values of both species matched well with the measured values. Furthermore, the profile-averaged measured NH<sub>4</sub>-N values of 0.7 and 1.1 ppm were comparable to the corresponding simulated values of 0.8 and 0.9 ppm, respectively, during the 2018 and 2019 wheat seasons.

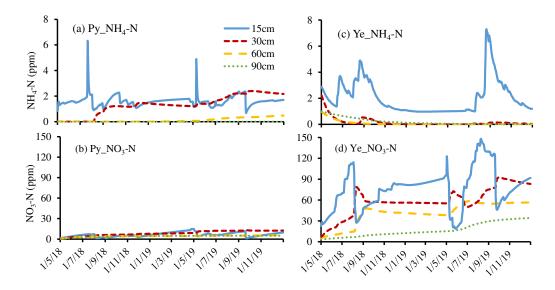


**Figure 5.** Comparison of measured (M) and simulated (S) values of NH<sub>4</sub>-N (a, b) and NO<sub>3</sub>-N (c, d) in the soil at wheat harvest time (as indicated) during the 2018 (a, c) and 2019 (b, d) seasons at the Pygery site.

Similarly, measured profile-averaged NO<sub>3</sub>-N contents of 5.4 and 8.5 ppm matched well with the corresponding simulated values of 4.9 and 8.4 ppm, respectively, during 2018 and 2019. This indicates that the model has been able to simulate the N dynamics in the soil profile under wheat crop at the Pygery site. Modelled N dynamics in the soil at the Yeelanna site couldn't be compared in absence of appropriate measured data. Overall, the patterns of NH<sub>4</sub>-N and NO<sub>3</sub>-N values in the soil indicate that the modeling approaches used to account for N mineralization, transformation, plant uptake, and conversions of N among different pools in the soils are reasonably sound. However, intensive soil observations for nitrogen transformations, losses, and soil solution species are required to improve the simulation at both field sites.

The spatiotemporal dynamics of the simulated concentrations of these species are shown in Figure 6 for both sites. The distribution pattern of N species revealed that a fraction of NH<sub>4</sub>-N always remained in the soil due to the continuous decomposition of organic N to NH<sub>4</sub>-N considered by the HYDRUS-1D model. High peaks of NH<sub>4</sub>-N in the soil, especially in the surface layers (0-15 and 15-30 cm), corresponded to the fertilizer applications. However, the increasing presence of NH<sub>4</sub>-N in low concentrations in the lower layers of the soil profile indicates a slow downward movement of NH<sub>4</sub>-N in the soil with time. However, NH<sub>4</sub>-N concentrations in the soil remained below 2 ppm throughout the simulation except after applying the NH<sub>4</sub>-N fertilizer.

Simulated daily NO<sub>3</sub>-N concentrations at the Pygery site gradually increased with time, especially in the surface soil layer (0-40 cm). They fluctuated between 1.2 and 14.9 ppm in the 0-15 cm layer (Figure 6b). The gradual peaks in the surface layer (0-15 cm) reveal the conversion of NH<sub>4</sub>-N to NO<sub>3</sub>-N via nitrification. These peaks subsequently moved to lower depths with lower concentrations and a lag time reflecting plant uptake. At deeper soil layers (below 50 cm), the NO<sub>3</sub>-N concentrations were more or less stable around 5 ppm, indicating reduced N uptake and transformation activities in this zone. This also suggests a lack of deep drainage at Pygery, a crucial driver for transporting NO<sub>3</sub>-N deeper into the soil. The water balance at the Pygery site strongly supports this observation (Table 4).



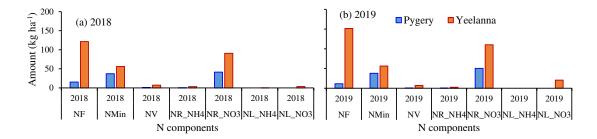
**Figure 6.** Simulated distribution of NH<sub>4</sub>-N (a, c) and NO<sub>3</sub>-N (b, d) in the soil at different depths (15, 30, 60, and 90 cm) at the Pygery (a, b) and Yeelanna (c, d) sites.

At Yeelanna, HYDRUS-1D predicted higher NH<sub>4</sub>-N concentrations in the soil than at Pygery (Figure 6c). The NH<sub>4</sub>-N concentrations in the surface layer (0-15 cm) reached high values of 4.8 and 7 ppm after the fertilizer application. The continued presence of NH<sub>4</sub>-N in low concentrations in the surface zone indicates the continual production of NH<sub>4</sub>-N by mineralizing organic matter. On the other hand, the peak NO<sub>3</sub>-N concentration in the 0-15 cm soil depth at Yeelanna was almost 8-10 times higher than at Pygery. During 2018, the NO<sub>3</sub>-N concentration increased to 112 ppm in response to fertilizer application and subsequently decreased in early September, likely due to leaching (Figure 6d). Later in the season, during the post-harvest summer period, the NO<sub>3</sub>-N concentration in the upper soil layers (0-15 cm) increased with a decrease in the soil water content. The NO<sub>3</sub>-N concentration in the soil peaked at 144 ppm in 2019 due to much higher N application and then decreased due to plant uptake and late-season leaching. At the end of the simulation in 2019 (31/12/2019), the NO<sub>3</sub>-N concentration in the soil ranged from 34 to 91 ppm. Higher concentrations of NH<sub>4</sub>-N and NO<sub>3</sub>-N in the soil at Yeelanna were directly related to higher N applications. High levels of NO<sub>3</sub>-N concentration were reported in other modeling studies under similar N fertilization and wheat production conditions [65].

# 3.4. Nitrogen balance in soils

# 3.4.1. Mineralization of organic N in the soil

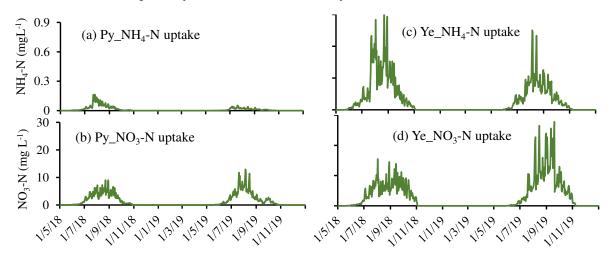
The breakdown of organic matter in the soil (N<sub>Min</sub>) at Pygery during the cropping season (May-December) added 37.3 kg N ha<sup>-1</sup> during 2018 and almost a similar amount during 2019 (Figure 7). HYDRUS-1D predicted higher N<sub>Min</sub> (56.2 to 56.4 kg N ha<sup>-1</sup>) for the soil at Yeelanna than at Pygery due to the higher organic carbon content in the soil at the former (2.03%) relative to the latter (1.17%) site. Additionally, relatively low rainfall at Pygery perhaps impacted the microbial decomposition of organic matter because the mineralization rate is only about two-thirds of that at Yeelanna. The absolute values of daily N<sub>Min</sub> at Pygery ranged between 0.15 and 0.17 kg N ha<sup>-1</sup>, whereas the corresponding figures for Yeelanna ranged from 0.22 to 0.25 kg N ha<sup>-1</sup> (data not shown). The conversion of NH<sub>4</sub>-N to NO<sub>3</sub>-N in the soil at Pygery was relatively poor compared to Yeelanna due to unfavorable moisture and temperature conditions. Therefore, relatively higher NH<sub>4</sub>-N deposition/storage in the soil occurred at Pygery than at Yeelanna. There was a slight increase in the N<sub>Min</sub> rate during the cropping/winter season at both locations. However, these estimates will vary over the years, depending on the substrate's content and quality, the C:N ratio, microbial activity, and climate variability, including rainfall and temperature variations [1,66].



**Figure 7.** Predicted components of N balance ((N<sub>F</sub> = fertilizer nitrogen, N<sub>Min</sub> = N mineralization from organic matter, N<sub>V</sub> = N volatilization, N<sub>R\_NH4</sub> = plant uptake of ammonium N, N<sub>R\_NO3</sub> = plant uptake of nitrate N, N<sub>L\_NH4</sub> = leaching of ammonium N, N<sub>L\_NO3</sub> = leaching of nitrate N) during the (a) 2018 and (b) 2019 at Pygery (Py) and Yeelanna (Ye).

# 3.4.2. Nitrogen uptake by wheat

Nitrogen available to wheat includes inorganic nitrogen (NH<sub>4</sub>–N and NO<sub>3</sub>-N), such as fertilizers, and soluble organic nitrogen. The amount of N delivered to plants from soil is location-specific due to the variations in the environmental conditions, soil types, and different agricultural management practices implemented at the two locations. Simulations showed that NH<sub>4</sub>-N contributed very little to the plant N nutrition and that most N uptake was in the form of NO<sub>3</sub>-N during both crop seasons (Figure 8). Simulated total N uptake at Yeelanna was more than twice that at Pygery. Daily NH<sub>4</sub>-N and NO<sub>3</sub>-N uptake by wheat at Pygery ranged from 0 to 0.16 mg L<sup>-1</sup> and 0 to 13 mg L<sup>-1</sup>, respectively. While at Yeelanna, maximum daily NH<sub>4</sub>-N and NO<sub>3</sub>-N uptakes were 0.9 and 0.8 mg L<sup>-1</sup> in 2018 and 15.5 and 27.8 mg L<sup>-1</sup> in 2019, respectively. Notably, the maximum daily N uptake by wheat occurred from early August to late September, which coincided with the wheat's maximum growth period. Seasonal crop N uptake at Pygery ranged from 55-62% of the total N (N<sub>F</sub> + N<sub>Min</sub>+ N<sub>5</sub>), whereas the corresponding N uptake at Yeelanna was only 40-44%. However, wheat N uptake during 2019 at Yeelanna was roughly double the amount of N mineralized in the soil (Figure 7). This implies that almost half of the N uptake by wheat was contributed by the N fertilizer.



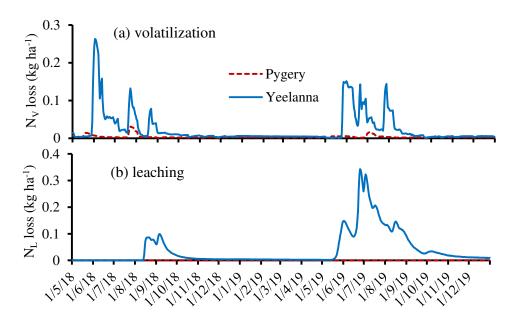
**Figure 8.** Daily NH<sub>4</sub>-N (a, c) and NO<sub>3</sub>-N (b, d) uptake by wheat at Pygery (a, b) and Yeelanna (c, d) during 2018 and 2019 simulated by HYDRUS-1D.

#### 3.4.3. Simulated volatilization losses of N

Volatilization N losses (Nv) usually occur when urea or ammonium fertilizers are top-dressed or applied on the soil surface. Typically, this is a regular feature of the dryland cropping system in Australia [56]. When there is not enough moisture in the soil to hydrolyze and move the dissolved fertilizer into the soil,  $NH_4$ –N is partially converted into  $NH_3$  and escapes into the atmosphere. High

temperatures, high wind, and low water contents in the surface layer, commonly present during wheat sowing, create ideal conditions for N<sub>V</sub> losses. Also, NH<sub>4</sub>–N may move towards the soil surface via capillary rise with intense evaporative fluxes, contributing to gaseous losses. There is an even greater potential for NH<sub>3</sub> losses in areas with alkaline soils [67,68].

HYDRUS-1D simulations in the current study suggest that volatilization losses of N (N<sub>v</sub>) at Pygery are smaller than at Yeelanna because fertilizer applications at the latter site (121-151 kg N ha<sup>-1</sup>) are higher than at the former site (11-15 kg N ha<sup>-1</sup>) for the same crop (Figure 9). The maximum daily N<sub>v</sub> losses at Pygery were only 0.02 and 0.03 kg N ha<sup>-1</sup> during 2018 and 2019, respectively (Figure 9a). Corresponding amounts at Yeelanna were 0.26 and 0.15 kg N ha<sup>-1</sup>, respectively. At the Yeelanna site, daily N<sub>v</sub> losses increased initially in response to fertilizer application and then rapidly dropped as the applied N was translocated deeper into the soil. This was due to high NH<sub>4</sub>–N concentrations from the applied fertilizer in the surface soil layer with low water contents providing favorable conditions for N<sub>v</sub> losses. Seasonal N<sub>v</sub> losses at Pygery were 1.1 and 0.8 kg N ha<sup>-1</sup> during the 2018 and 2019 cropping seasons (Figure 9), respectively. At Yeelanna, the corresponding losses were 7.3 and 6.9 kg N ha<sup>-1</sup>, respectively. These losses represent 4.6 to 7.3% of the N applied. This amount falls within the range of N<sub>v</sub> losses (1.8-23%) measured by Turner et al. [56] at different southern Australian locations involving fertilizers applied to rainfed crops, including wheat.

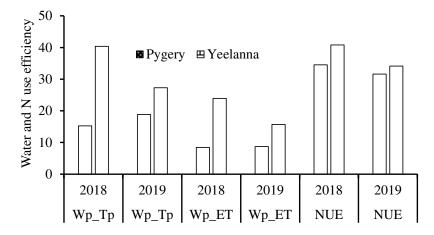


**Figure 9.** Daily nitrogen volatilization ( $N_v$ ) (a) and leaching ( $N_L$ ) (b) losses at the Pygery (Py, red line) and Yeelanna (Ye, blue line) sites simulated by HYDRUS-1D during the 2018 and 2019 wheat seasons.

# 3.4.4. Leaching losses of Nitrogen

Leaching losses refer to the N losses induced by a drainage flux from the root zone to deeper soil layers and groundwater. These losses normally occur in the form of NO<sub>3</sub>-N, a mobile component of N. At Pygery, leaching losses of NO<sub>3</sub>-N (N<sub>L</sub>) were negligible as there was not a sufficient drainage flux to trigger N losses. However, at Yeelanna, seasonal NO<sub>3</sub>-N leaching amounted to 3.5 and 20.5 kg ha<sup>-1</sup> during 2018 and 2019, respectively (Figure 9b). In 2018, drainage losses occurred during midseason (mid-August to late September), even though drainage fluxes were low during that time. The maximum daily NO<sub>3</sub>-N losses were 0.1 kg ha<sup>-1</sup> (Figure 9b). On the other hand, N losses increased many folds during 2019. Most NO<sub>3</sub>-N losses occurred early in the season when the  $T_p$  requirement was small. Heavy rain events during this period can leach an enormous quantity of NO<sub>3</sub>-N from the root zone. Therefore, the daily rate of NO<sub>3</sub>-N leaching increased to 0.35 kg N ha<sup>-1</sup>, leading to N losses via off-site movement. On a percentage basis, N<sub>L</sub> losses accounted for 3-13.5% of N applied by fertilizers and 1.5-7.6% of the total plant-available N in the soil.

Model-simulated seasonal water and nitrogen use and yield estimates for the experimental sites at Pygery and Yeelanna were used to estimate the water productivity in terms of transpiration (Wp\_Tp) and evapotranspiration (Wp\_ET), and nitrogen use efficiency (NUE) of dryland wheat (Figure 10). Both water productivities (Wp\_Tp and Wp\_ET) and NUE were higher at Yeelanna (high rainfall zone) as compared to Pygery (low rainfall zone). This explains a three times higher wheat yield at Yeelanna than the corresponding yield (1.52 t/ha) obtained at Pygery. The Wp\_Tp and Wp\_ET efficiencies at Pygery varied from 15 to 18 and 8 to 9 kg ha<sup>-1</sup> mm<sup>-1</sup>, respectively, while corresponding values at Yeelanna ranged from 27 to 40 and 16 to 24 kg ha<sup>-1</sup> mm<sup>-1</sup>. Different Wp values obtained at both sites signify the importance of rainfall quantities, soil's water retention properties, and farmers' management practices.



**Figure 10.** Estimated water productivity (kg ha<sup>-1</sup> mm<sup>-1</sup>) for transpiration (Wp\_Tp) and evapotranspiration (Wp\_ET), and nutrient use efficiency (NUE) (kg kg<sup>-1</sup>) of wheat at Pygery (Py) and Yeelanna (Ye) during the 2018 and 2019 seasons.

Similarly, NUE varied from 31 to 34 and 34 to 41 kg grain yield kg<sup>-1</sup> N uptake at Pygery and Yeelanna, respectively (Figure 8). Normally, the N use efficiency is relatively low irrespective of crop type. For example, Hu et al. [69] found that about 40% of the N fertilizer is recovered in the aboveground parts of dryland wheat. The rest was either retained in the soil, denitrified, or lost by N leaching.

# 4. Discussion

#### 4.1. Soil water balance and wheat water uptake

Under rainfed conditions, the soil moisture regime is dictated by the timing, amounts, and intensity of rains, which are a crucial driver for sustainable crop production. Therefore, accurate estimation of soil water balance helps understand the interrelationship among different hydrological components, including plant water availability and incipient water losses. Water content dynamics in the soil showed that most of the soil profile moisture regime variability occurred in the surface layer (0-30 cm), with a more static moisture regime in the deeper depths (Figure 3). This is because, at the low rainfall site (Py), more than 80%, and at the medium rainfall site (Ye), about 70-75% of rain events were smaller than 5 mm and were thus likely retained in the surface soil layer. The water content retained in this horizon is crucial for seed germination and subsequent growth of crops, as the bulk of the fibrous roots of cereal crops mine this region for water and nutrient needs [70]. Wang et al. [62] reported that the root activity of winter wheat is concentrated within the 0-40 cm soil layer and reported small changes in water content dynamics at the deeper depths.

The model-simulated actual seasonal transpiration ( $T_{p \text{ act}}$ ) at both locations ranged between 95 and 141 mm, which falls within the range estimated by French and Schultz [10] and Sadras and Angus

[11] for the rainfed wheat crop. Site-specific climate, soil properties, and crop variety highly influence the extent of water uptake by wheat. In addition to low rainfall at Pygery, soils had low water holding capacity compared to Yeelanna, which significantly influenced the water availability for wheat in the soil. Indeed, soils with low water holding capacity and scanty rainfall during winter led to frequent terminal droughts [11]. Seasonal evaporation can tremendously impact the water availability for crop needs in the surface soils. Several studies [10,11] assumed a fixed value of the seasonal evaporation loss (110 mm) when determining water availability for rainfed wheat, which seems unreasonable. However, inter and intra-season variabilities in the evaporation losses are common and are highly correlated with the diurnal and seasonal changes in the climate parameters and ground cover [62]. In the current study, seasonal  $E_s$  losses varied from 77 to 104 mm, showing 5-30% lower evaporation losses than a fixed value (110 mm) suggested by French and Schultz [10]. Numerous other studies [71-73] reported soil evaporation significantly lower (45 - 70 mm) than the proposed fixed value. Direct water loss from the soil surface can be reduced by adopting appropriate water storage and mulching practices, improving water retention in the soil [74]. Improved water regimes in surface soils can boost wheat growth and sustainable production in a water-limited environment.

Water uptake and crop yields of rainfed wheat are severely influenced by climate, soil and crop characteristics, and a large gap exists between the potential and actual crop yield [11,15]. These variabilities ultimately impact the water use efficiency of crops in the rainfed environments. The average water productivity (WP\_ET) values (8.6 kg ha<sup>-1</sup> mm<sup>-1</sup>) estimated in the current study at the Pygery site are comparable to water use efficiency reported in other studies in the rainfed region of Australia [11,73]. Similarly, the transpiration efficiency (WP\_Tp) values are similar to values reported by Harries et al. [73] and Sadras and Lawson [14] for the rainfed wheat production environments. However, the average values of WP\_ET (19.8 kg ha<sup>-1</sup> mm<sup>-1</sup>) and WP\_Tp (33.8 kg ha<sup>-1</sup> mm<sup>-1</sup>) obtained at the Yeelanna site were much higher than those reported in previous studies. These studies usually ignored the deep drainage component, in contrast to the current study. The model predicted that 25% of rainfall received at Yeelanna is lost as deep drainage, which was a significant factor contributing to higher WP\_ET and WP\_Tp at this site. Thus, HYDRUS-1D has been able to predict the actual water balance fluxes, including deep drainage, depending on the climate, crop, and soil conditions [75], and provided an accurate assessment of water use efficiency and water-limited yield estimation for the rainfed wheat production system.

# 4.2. Nitrogen losses and recovery by crop

Nitrogen supplement in the form of fertilizer is essential for profitable crop production. The fertilizer requirement of wheat may vary each season, depending on N<sub>Min</sub> in the soil and climate variability. Angus and Grace [1] reported that the minimum level of N fertilizer applied to dryland wheat should be 45 kg N ha-1 for sustainable crop production. However, the long-term (15 years) application of the fixed amount of N fertilizer (45 kg ha<sup>-1</sup>) at 50 farms resulted in a reduction in the wheat yield by 60% of the water-limited potential yield [76]. This suggests that the N fertilizer application at the Pygery site was much lower (see Table 1) than required, significantly impacting obtaining a potential water-limited yield and N use efficiency. On the other hand, the amount of N applied was very high at Yeelanna (121-151 kg ha-1), potentially leading to high N concentration in the soil and consequent losses of applied N. Therefore, blanket applications of N can have varied impacts on crop growth and yield and may lead to potential N losses from the fields. This indicates that applying ae fixed amount of N fertilizer may lead to a long-term suboptimal N application, underachieving the yield potential or agricultural crops. Nitrogen applications and crop use vary seasonally in response to the dynamic N mineralization, gaseous conversion, plant uptake, and other N loss mechanisms, which are highly influenced by climate variables and soil environment. Angus et al. [77] reported that the average aboveground recovery of N was around 36% at six commercial dryland wheat sites in south-eastern Australia. However, with improved management practices, the N recovery efficiency in grain production has increased to 44% [1]. Thus, the wheat's NUE estimates in the current study corroborate well with other studies.

There are various reasons for low N recovery in dryland agriculture. Rainfall and its erratic nature are major determinants for low N recovery through their effects on loss mechanisms. There is also a varied ability of crops to access applied N in the soil. Soil factors such as texture, pH, and organic matter content, as well as soil constraints such as salinity and sodicity, also significantly impact the processes of N transformation in the soils [78]. Therefore, N recovery improvements require better temporal matching of N supply to periods of high crop demand and avoiding periods when risks of losses surge [35,66]. Monjardino et al. [79] concluded that adopting non-limiting or near-non-limiting nitrogen fertilizer practices could help close the wheat yield gap in the Australian rainfed cropping system. The results from this study indicate that site-specific water availability and N management play a crucial role in enhancing the efficient resource utilization of rainfed cropping systems. Thus, we recommend conducting further research on fertilizer-application timing and evaluating different fertilizer-application scenarios to increase crop recovery of fertilizers applied to dryland wheat production.

Ammonium volatilization (Nv), similar to ammonia and nitrate leaching (NL) from the root zone, represents an important N loss for rainfed wheat cropping systems. The N<sub>v</sub> losses from applied urea fertilizers typically contribute to greenhouse gas emissions from rainfed wheat production systems. However, in the present study, this fraction is lower than the emission threshold (10%) from the applied synthetic fertilizers considered by IPCC [80]. Nonetheless, Nv losses to the extent observed in the current study (4.6 to 7.3% of the N applied) still represent a major economic loss to farmers. Therefore, an accurate assessment of Nv losses could help devise better management practices for improving the productive and sustainable practices of rainfed wheat production systems. Leaching drives the NL losses due to rain events and the mass of N in the NO<sub>3</sub>-N form in the soil. In the current study, N<sub>L</sub> losses were observed at the medium rainfall site (Yeelanna), which accounted for 3-13.5% of N applied by fertilizers and 1.5-7.6% of the total plant-available N in the soil. In sandy soils, N leaching (NL) can be significantly higher [81], ranging between 6 and 20% of the total N flux (16-159 kg N ha<sup>-1</sup> year<sup>-1</sup>). Numerous other studies [82-85] have reported significant leaching losses of NO₃-N, varying from 4 to 59 kg ha-1 year-1 for different cropping systems in Australia. This represents a financial loss to the growers and an increased risk of groundwater pollution. Indeed, NO<sub>3</sub> leaching occurs infrequently at most dryland cropping farms in Australia because the soil water-holding capacity is generally sufficient to retain the surplus rainfall over potential evapotranspiration.

The HYDRUS-1D simulations suggested that maintaining the N balance is crucial for the wheat production system, explaining how soil N storage changes over the years. Matching the supply of available N to the crop N demand will reduce the potential accumulation of available N and potential N losses. Although increasing N stocks is encouraged, it should be acknowledged that temporary periods of mining N stocks are acceptable, provided the extent of N mining is quantified and followed by a rebuilding phase, in which N stocks are replenished [47]. It is recommended that annual N balance calculations are performed. However, these values should be integrated and accumulated over time to define the full effect of applied management practices and temporal trends. Such information will allow grain growers to implement appropriate actions to maintain their production base in the future and continue to maximize profitable grain yield outcomes. Further optimization of N applications can reduce the N losses by linking them with soil water content, rainfall, and meteorological data for a particular site. This requires more modeling efforts and intensive N estimation at the field site for developing rainfall-based guidelines.

# 5. Conclusions

Real-time monitoring of water contents and plant available soil water capacity assists with decisions on when to seed and fertilize rainfed crops. This study used the numerical model HYDRUS-1D to simulate the water balance and nitrogen dynamics under rainfed wheat cultivation at two locations (Pygery and Yeelanna) with varied climate and soil conditions. The model output of water and N balance was compared with measured data across various soil depths at both locations.

The modeled and measured water content showed little change below 30 cm at the two sites regardless of differences in soils and rainfall. This suggests that plant water uptake by rainfed wheat

mostly occurred in the top 30 cm of soil, signifying the importance of the surface soil layer, which stores water received by small rain events in rainfed environments. Nevertheless, moisture retained in the surface layer is vulnerable to evaporation imposed by hot and dry weather conditions in the arid and semi-arid environments. In the current study, 50 and 30% of seasonal rainfall at medium and low rainfall sites were lost via evaporation. Therefore, adopting appropriate water storage and mulching practices can reduce this direct water loss, enhancing water availability in the soil and improving the water-limited yield potential of rainfed wheat.

The numerical model showed an excellent capability to simulate different N pools and their transformations in the soil, such as urea hydrolysis, organic N mineralization, NH³ volatilization, nitrification, plant N uptake, denitrification, and N leaching, which are crucial for enhancing N use efficiency. Assessing the off-site movement of N (leaching losses) can help devise better strategies for N fertilizer applications, which will reduce the environmental impacts of fertilizer use. Similarly, the estimation of low N volatilization losses suggests that the contribution of dryland farming to greenhouse N gas emissions is very low. However, more efforts are needed to reduce N leaching losses by managing the appropriate timing and dose of N applications in response to available soil moisture levels and crop needs.

**Author Contributions:** For research articles with several authors, a short paragraph specifying their individual contributions must be provided. The following statements should be used "Conceptualization, V.P.; methodology, V.P.; software, V.P. and J.Š.; formal analysis, V.P.; investigation, V.P.; resources and project management, P.R.P.; data curation, V.P.; writing—original draft preparation, V.P.; writing—review and editing, V.P., J.Š., P.R.P., V.F. and T.P.; visualization, V.P.; supervision, P.R.P. All authors have read and agreed to the published version of the manuscript." Please turn to the CRediT taxonomy for the term explanation. Authorship must be limited to those who have contributed substantially to the work reported.

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