Improving nutrient and water use efficiencies in multi-loop aquaponics systems

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Abstract

The sustainable development of agricultural systems where nutrients and water are recycled to a high degree is of enormous importance. Traditional aquaponics, where fish and plants are cultivated in one recirculating system, addresses these ecological challenges, but still struggles with its economical feasibility. Decoupled multi-loop aquaponics systems, in which the aquaculture and hydroponics subsystems are running autonomously, proved that they can keep up with the productivity of state-of-the-art hydroponics systems or even outscore them. Yet, a problem of such decoupled aquaponics systems was that plants require a high nutrient concentration, whereas fish prefer rather a clean water. In practice, the opposite is happening as the nutrients are added to the aquaculture units through the feed. This paper optimizes a recent approach showing that desalination technologies, such as reverse osmosis, can play an important role in reversing the concentrations within such systems without killing beneficial plant growth-promoting rhizobacteria thermally. The proposed integrated systems approach has the potential to make both periodical nutrient and water discharges and excessive fertilizer supplementation obsolete that would otherwise be necessary to maintain good water quality for the fish and an optimal nutrient solution for the plants.

Keywords Aquaponics · Desalination · Nutrient recovery · Decoupled aquaponics · Horticulture · Sustainability · Sustainable agriculture

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Introduction

Aquaponics is the process of growing aquatic organisms and plants symbiotically in one system or several subsystems (Lennard and Leonard 2006; Monsees et al. 2017b; Yep and Zheng 2019), whereas the process water is recirculated freely between the aquaculture and hydroponics units in one-loop systems (Palm et al. 2019); decoupled multi-loop aquaponics systems follow a different approach. Decoupled aquaponics systems separate the aquaculture and hydroponics units from each other so that optimal conditions (i.e., temperature, pH, nutrient concentration, etc.) for both fish and plant can be achieved (Goddek et al. 2016; Kledal and Thorarinsdottir 2018; Kloas et al. 2015). Advantages of decoupled aquaponics systems is a higher water and nutrient use efficiency and presumably higher yields compared with the traditional approach and stand-alone hydroponics systems (Delaide et al. 2016; Dijkgraaf et al. 2019; Goddek and Vermeulen 2018; Nicoletto et al. 2018; Nozzi et al. 2018; Saha et al. 2016). However, this tendentious effect was mainly being observed when growing leafy vegetables and does not apply for all crops. On the other hand, an issue of closed hydroponics systems is that salts tend to accumulate. Periodical discharges of the nutrient solution are thus required (Carmassi et al. 2005; Savvas et al. 2008). Recent publications showed that a nutrient solution based on aquaculture water increased the uptake of salts and might make such discharges obsolete (Delaide et al. 2017; Goddek and Vermeulen 2018).

Since the nutrients enter aquaponics systems mainly via the fish feed, nutrients consequently accumulate in the recirculating aquaculture system (RAS) (Espinal and Matulić 2019; Lekang 2007; Timmons and Ebeling 2013). This is especially the case for decoupled aquaponics systems, where the nutrient flow solely is one way; i.e., from the RAS to the hydroponics subsystem (Kloas et al. 2015; Monsees et al. 2017b). As stated above, plants require a much higher nutrient concentration than fish. So in simple decoupled aquaponics systems, nutrient supplementation is required for the plants, while RAS water needs to be discharged under certain conditions which are mainly fish species-dependent. Consequently, simple decoupled aquaponics systems do not allow favorable water and nutrient use efficiencies, unless processes are integrated that could help to overcome these drawbacks (Goddek et al. 2019).

With respect to system's nutrient use efficiency, several scholars have suggested treating the RAS residual stream, i.e., fish sludge, and processing it further into biofertilizer by using bioreactor technology (Delaide et al. 2019a, b; Goddek et al. 2018; Monsees et al. 2017a). In order to concentrate nutrients in the hydroponics system, and enhancing water quality on the fish side, Goddek and Keesman (2018) recently introduced a process that deals with solving this nutrient distribution issue. The objective of this study is to investigate different desalination processes as well as exploring system solutions to optimize the use of desalination technologies for multi-loop aquaponics systems.

Methodology

Desalination technologies aim to lower or completely remove the salt content from a solvent. In many of these technologies, a water stream with some salt content is split into a brine stream (concentrate) and a desalinated stream (diluate). As desalination typically requires large amounts of energy, currently the focus is more and more on sustainable desalination technologies with the use of renewable energy sources and energy recovery.

Based on the previous mass balance study of this paper's authors (Goddek and Keesman 2018), this study will examine alternative technologies with respect to (solar) distillation for concentrating nutrients in multi-loop aquaponic systems and explore solutions to reduce energy requirements and monetary expenses by following a process-based approach. As large-scale aquaponic systems are being built, no experimental data is available yet and thus in this study, we explore different solutions to the nutrient concentration problem by following a system-thinking approach.

Alternative nutrient concentrating technologies

Desalination based on evaporation to produce freshwater from saline water is known and explored for many centuries. Large-scale desalination was implemented in the nineteenth century (Birkett 1984). Initially, multiple-effect distillation (MED), with specific energy consumption (SEC) in the range of 19–27 kWh/m³, was the dominant technology (Al-Karaghoul and Kazmerski 2012). However, roughly in the second half of the twentieth century, thermal multi-stage flash distillation (MSF), with an SEC of 20–37 kWh/m³, was commonly used (Al-Shammiri and Safar 1999; Van der Bruggen and Vandecasteele 2002). These distillation technologies were and still are commonly used in the Middle East, as the abandoned presence of fossil fuels does not limit the energy needs. In the 1950s, electrodialysis (ED) for demineralization of saline water was introduced, as ion-selective membranes with low electrical resistance became available (Juda and McRae 1950; Wilson 1960). In the late 1960s, large-scale reverse osmosis (RO), with an SEC of 1.8–5.5 kWh/m³, was introduced and in the 1980s RO became a competitive technology with respect to the thermal-based distillation technologies (see Fig. 1) (Bartman et al. 2010; Karabelas et al. 2018).

In the Middle East, the distillation technologies remain popular, as in this region, salinity, temperature, and membrane fouling potential are high and thus limit the application of RO (Greenlee et al. 2009). However, in the rest of the world, RO is the dominant desalination technology. Other technologies, with/without modifications or combination of technologies, are being tested and implemented on small scale. Table 1 shows a non-exhaustive overview of basic desalination technologies, with the most commonly used technologies in bold.

Fig. 1 Past and expected annual growth of the membrane and thermal desalination market. (Source: Fried and Serio 2012)

Table 1 Non-exhaustive overview of basic desalination technologies with the most commonly used technologies in bold

Desalination technologies					
Domain	Electrical	Thermal	Mechanical	Chemical	Magnetic
Examples	Electrodialysis (ED)	Multiple-effect distillation (MED)	Reverse osmosis (RO)	Forward osmosis (FO)	Energy + magnetohydro-dynamics (E + MHD)
	Capacitive de-ionization (CDI)	Multi-stage flash distillation (MSF)	Nano-filtration (NF)	Ion-exchange resins	
	Electrohydrodynamic atomization (EHDA)	Thermal vapor compression (TVC)	Mechanical vapor compression (MVC)	Extraction	
		Eutectic freeze crystallization (EFC)			

Scale inhibitors, also known as antiscalants and frequently used in RO technologies, prevent the formation of all kinds of scales, which are mainly composed of calcium carbonate, magnesium hydroxide, and calcium sulfate. Generally, antiscalants are organic compounds. Typically, these compounds contain sulphonate, phosphonate, or carboxylic acid functional groups and chelating agents such as carbon, alum, and zeolites (Singh 2005). Especially phosphonate-based antiscalants are of interest here, as these, after possible biodegradation in the rhizosphere (Fisher 2009), might be used as fertilizer for the plants in the hydroponics system. Also, phosphonate-based antiscalants can be removed and partially recovered from membrane concentrates (Boels et al. 2012; Chen et al. 2017).

Process optimization

Goddek and Keesman (2018) presented one option, based on thermal desalination technologies, to concentrate the hydroponics nutrient solution and leading the demineralized water back to the aquaculture system. The nutrient and water mass balance in this manuscript remains the same. However, the approach presented in the 2018 paper is very energy-intensive and would require one desalination unit per hydroponic subsystem (Fig. 2), even though alternative desalination techniques were used.

Another downside of the suggested concept is that the thermal treatment would neutralize beneficial bacteria that are found in the aquaculture process water. The solution that we aim for has to comply with the following conditions: (a) keep the beneficial bacterial alive; (b) be able to serve several hydroponics subsystems; and (c) increase the nutrient and water use efficiency of the overall system.

Unlike a thermal solution, reverse osmosis technology remains the integrity of the bacteria. Figure 2 shows a systemic decoupled aquaponics design taking the abovementioned conditions into account. Compared with the process scheme in Fig. 1, the inflow direction of the nutrient concentrator has been reversed. Instead of increasing the concentration of each hydroponics sump, the revised design aims at extracting and concentrating nutrients from the aquaculture system and leading back demineralized water. This inverted process flow has no effect on the system's mass balance as described by Goddek and Keesman (2018). Instead, a larger desalination unit is required to handle higher inflow capacities. This is due to the fact that the nutrient concentration in the RAS water is much lower than in the hydroponics sump.

Another change contributing to the process optimization is the implementation of protein skimmers (labeled as “prot. Skim” in Fig. 3) (Lekang 2007; Timmons and Ebeling 2013). Protein skimmers remove micro- and nano-particles from the process water. This is in particular important as follows: (1) the inflow water to the RO system should be particle-free to avoid clogging and wearing of the membrane, and (2) to make sure that the water getting into the hydroponic sump only contains soluble nutrients and does not contain particles as these might accumulate in the plants' rhizosphere, potentially leading to a decreased nutrient uptake.

Discussion

A challenge for food production systems for the future is to achieve and maintain a high water and nutrient use efficiency (Campbell et al. 2016; Howden et al. 2007; Vermeulen et al. 2012).

So far, the problem of decoupled aquaponics systems is that nutrients tend to accumulate in the RAS part and are rather scarce in the hydroponics system. From a mass balance point of view, this problem can only be solved by reversing the concentrations of the subsystems. The

In economic terms, the RO system is highly dependent on the domestic electricity price. Also, one has to consider that electricity consumption increases with higher desired efficiency ratios. Additional costs include the initial investment (i.e., CapEx), maintenance costs, and membrane replacements. Then again, operation expenses are lowered as the need for both freshwater and additional fertilization is reduced to a high degree, as periodical flushing of RAS water is avoided following this RO-based approach. The strongest economic argument, however, is the additional growth rate one can expect compared with state-of-the-art

Fig. 3 This aquaponics design extracts the nutrients from the RAS. The nutrient concentrator is consequently RAS-dependent. The concentrated nutrient solution in the buffer can thus be used for several hydroponics subsystems. Also, the low nutrient concentration in the RAS allows for better use of RO technologies

aquaponics systems (Delaide et al. 2016; Goddek and Vermeulen 2018; Licamele 2009). To what degree the use of RAS-concentrates has an impact on plant growth compared with standard decoupled aquaponics systems (i.e., two loop systems) has yet to be clarified. Another statement that needs to be made is that the bigger the desalination unit, the cleaner the RAS water. Very sensitive fish, for example, could be reared in RAS then. This approach could avoid periodical water bleed-off, resulting in better water and nutrient use efficiency of the overall system.

Determining the financial savings by applying an RO-based nutrient concentrated technology is strongly dependent on the location of the aquaponics system. Location-specific parameters such as water availability, electricity prices, discharge policies/prices, produce market prices, and fertilizer costs determine its economic benefit. However, it is indisputable that the ecological footprint of aquaculture and horticultural production systems can be strongly reduced by closing and optimizing flow and process (control) loops.

Conclusions

Today, the pressure to find effective strategies for the sustainable transformation of agricultural systems is higher than ever. Combining different production systems and using their respective waste streams to produce more with fewer resources is the concept of aquaponics. In order to be able to survive in the markets, the production needs to be able to keep up with state-of-the-art systems such as hydroponics. Previous studies have shown the tendency that leafy green yields in decoupled aquaponics were at least equivalent to the yields achieved in hydroponics systems. For tomatoes, such an observation was not made so far. However, there is an indication that blossom-end rot might occur less under aquaponic conditions (Delaide et al. 2019b; Schmautz et al. 2016). Consequently, this paper showed that loop optimization measures are necessary in order to achieve higher nutrient and water use efficiency and promote sustainable ecological and economic development. This can be achieved by implementing, for instance, RO technologies into decoupled aquaponics systems. Nevertheless, further research is required with respect to the impact of RAS-concentrates on plant growth.

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