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1 Plant-wide model-based analysis of iron dosage strategies for

2 chemical phosphorus removal in wastewater treatment systems

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21 Abstract

Stringent phosphorus discharge standards (i.e. 0.15 - 0.3 g P.m⁻³) in the Baltic area will compel wastewater treatment practice to augment enhanced biological phosphorus removal (EBPR) with chemical precipitation using metal salts. This study examines control of iron

25 chemical dosing for phosphorus removal under dynamic loading conditions to optimize operational aspects of a membrane biological reactor (MBR) pilot plant. An upgraded version 26 of the Benchmark Simulation Model No. 2 (BSM2) with an improved physico-chemical 27 28 framework (PCF) is used to develop a plant-wide model for the pilot plant. The PCF consists of an equilibrium approach describing ion speciation and pairing, kinetic minerals 29 30 precipitation (such as hydrous ferric oxides (HFO) and FePO₄) as well as adsorption and coprecipitation. Model performance is assessed against data sets from the pilot plant, evaluating 31 the capability to describe water and sludge lines across the treatment process under steady-32 state operation. Simulated phosphorus differed as little as 5–10% (relative) from measured 33 34 phosphorus, indicating that the model was representative of reality. The study also shows that 35 environmental factors such as pH, as well operating conditions such as Fe/P molar ratios (1, 1.5 and 2), influence the concentration of dissolved phosphate in the effluent. The time 36 constant of simultaneous precipitation in the calibrated model, due to a step change 37 decrease/increase in FeSO₄ dosage, was found to be roughly 5 days, indicating a slow 38 dynamic response due to a multi-step process involving dissolution, oxidation, precipitation, 39 aging, adsorption and co-precipitation. The persistence effect of accumulated iron-40 precipitates (HFO particulates) in the activated sludge seemed important for phosphorus 41 42 removal, and therefore solids retention time plays a crucial role according to the model. The aerobic tank was deemed to be the most suitable dosing location for FeSO₄ addition, due to 43 high dissolved oxygen levels and good mixing conditions. Finally, dynamic model-based 44 45 analyses show the benefits of using automatic control when dosing chemicals.

Key words: Iron, Membrane bioreactors, Phosphorus removal, chemical precipitation, Plantwide model, Wastewater treatment

48 Nomenclature

ADM1	Anaerobic Digestion Model No. 1	
Al^{3+}	Aluminium ion	
ASM	Activated sludge model	
ASM2d	Activated Sludge Model No. 2d	
BOD_7	7-day biochemical oxygen demand	(gCOD.m ⁻³)
BR1/ANOX	Anoxic bioreactor 1	
BR2/ANOX	Anoxic bioreactor 2	CY
BR3/FLEX	Swing bioreactor 3 (anoxic/aerobic)	0
BR4/AERO	Aerobic bioreactor 4	
BR5/AERO	Aerobic bioreactor 5	
BR6/DEOX	De-aeration bioreactor 6	
BR7/ANOX	Post-anoxic bioreactor 7	
BSM2	Benchmark Simulation Model No. 2	
Ca	Calcium	$(mole.L^{-1})$
CAS	Conventional activated sludge	
Cl	Chloride	$(mole.L^{-1})$
CO_2	Carbon dioxide	
COD	Chemical oxygen demand	(gCOD.m ⁻³)
DO	Dissolved oxygen	(g.m ⁻³)
EBPR	Enhanced biological phosphorus removal	
EPA	Environmental Protection Agency	
Fe	Iron	
$FeCl_3$	Iron chloride	

FeSO ₄	Iron(II) sulphate	
Iron(II) or	Ferrous iron	(mole.L ⁻¹)
Fe^{2+}		
Iron(III) or	Ferric iron	(mole.L ⁻¹)
Fe^{3+}		
ISS	Inorganic suspended solids	(gSS.m ⁻³)
K	Potassium	$(mole.L^{-1})$
MBR	Membrane bioreactor	
Mg	Magnesium	
MLSS	Mixed liquor suspended solids	(gSS.m ⁻³)
n	Order of the precipitation reaction	
Na	Sodium	
NH ₃	Ammonia	
NH ₄ -N	Ammoniacal nitrogen	(gN.m ⁻³)
NO ₃ -N	Nitrate nitrogen	(gN.m ⁻³)
O_2	Oxygen	
pН	Hydrogen potential	(standard)
PO_4^{3-}	Phosphate ion	
PO ₄ -P	Orthophosphate phosphorus	(gP.m ⁻³)
RAS	Returned activated sludge	
S_A	Fermentation products	(gCOD.m ⁻³)
S_F	Readily biodegradable organics	(gCOD.m ⁻³)
S_I	Inert biodegradable organics	(gCOD.m ⁻³)
S_{O2}	Dissolved oxygen	(g.m ⁻³)
t	Time	(min, h, day)

Т	Temperature	(°C, K)
TIC	Total inorganic carbon	(gC.m ⁻³)
TN	Total nitrogen	(gN.m ⁻³)
ТОС	Total organic carbon	(gC.m ⁻³)
TP	Total phosphorus	(gP.m ⁻³)
TSS	Total suspended solids	(gSS.m ⁻³)
VFA	Volatile fatty acids	(gCOD.m ⁻³)
VSS	Volatile suspended solids	(gSS.m ⁻³)
WAS	Waste activated sludge	
WWTP	Wastewater treatment pant	
X_{AUT}	Autotrophic biomass	(gCOD.m ⁻³)
X_{FePO4}	Iron phosphate mineral state	$(gFe.m^{-3})$
X_H	Heterotrophic biomass	(gCOD.m ⁻³)
X _{HFO}	Hydrous ferric oxide	$(g.m^{-3})$
$X_{HFO,H}$	Hydrous ferric oxide with high adsorption	(g.m ⁻³)
	capacity	
$X_{HFO,H,P}$	$X_{HFO,H}$ with adsorbed phosphate	$(g.m^{-3})$
$X_{HFO,L}$	Hydrous ferric oxide with low adsorption	(g.m ⁻³)
	capacity	
$X_{HFO,L,P}$	X _{HFO,L} with adsorbed phosphate	(g.m ⁻³)
X _I	Inert non-biodegradable organics	(gCOD.m ⁻³)
X _{ISS}	Inorganic suspended solids state	$(gSS.m^{-3})$
X_{PAO}	Phosphorus-accumulating organisms state	(gCOD.m ⁻³)
X_{PHA}	Polyhydroxy-alkanoate state	(gCOD.m ⁻³)
X_{PP}	Polyphosphate state	$(g.m^{-3})$

X_S	Slowly biodegradable substrate state	(gCOD.m ⁻³)
X_{TSS}	Total suspended solids state	(gTSS.m ⁻³)

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50 Research highlights

- A plant-wide model calibrated against extensive pilot-plant data describing phosphorus (P)
 dynamics with iron (Fe) dosing.
- Good agreement between measured and modelled P (5–10% (relative) difference).
- P concentration strongly depends on pH, Fe/P ratio and influent P load.
- P removal control strategies substantially reduce FeSO₄ dose.
- Model shows aerobic tanks are the most suitable dosing location for FeSO₄, due to fast oxidation
 of Fe²⁺ to Fe³⁺.
- 58

59 **1 Introduction**

In recent years, effluent discharge limits to receiving waters are becoming more stringent, owing to 60 increased awareness and growing concerns regarding pollution and degradation of water resources. For 61 example, current effluent standards in Stockholm (Sweden) restrict the concentrations of total phosphorus 62 (TP) in treated wastewater discharge to less than 0.3 gP.m⁻³. However, these requirements are expected to 63 be tightened to achieve more efficient phosphorus removal. The future annual average emission standards 64 for TP in Stockholm, Sweden, will likely be 0.2 gP.m⁻³, with the operational effluent target set at 0.15 65 gP.m⁻³ (Anderson *et al.*, 2016). To meet these stricter quality standards, the effluent should contain very 66 low concentrations of dissolved phosphorus and almost no suspended solids. Wastewater treatment 67 facilities will need to undergo significant (structural/operational) modifications and/or improvements as 68 69 far as nutrient removal is concerned. A number of existing wastewater treatment plants are seeking to 70 intensify treatment using conventional activated sludge (CAS) systems coupled with membrane solids 71 separation referred to as membrane bioreactors (MBRs) (Judd, 2008). Since MBR systems have high 72 selectivity and can be operated with high suspended solids concentrations and longer sludge retention 73 times, a smaller footprint results. Consequently, biological nutrient removal in MBRs is becoming more

popular as a means of treating wastewater and has now been successfully achieved at lab-, pilot and fullscale (Bertanza *et al.*, 2017; Wang *et al.*, 2014).

In terms of biological treatment options, enhanced biological phosphorus removal (EBPR) is now 76 77 common practice. However, the feasibility of EBPR systems may be limited to some extent (Ekama, 78 2010) by wastewater characteristics and other environmental factors such as temperature and mass loading. In such situations, phosphorus (P) removal by biological means can be supported by chemical 79 80 precipitation processes (De Haas et al., 2000a). In current practice, chemical phosphorus removal in 81 conventional activated sludge plants is mainly performed by the addition of iron (Fe) or aluminium salts 82 upstream of the primary clarifier (pre-precipitation), to mixed liquor in the activated sludge tanks (simultaneous precipitation or co-precipitation) and/or to the tertiary processes (post-precipitation) 83 84 (Henze et al., 2002; EPA, 2010). The phosphorus removal efficiency depends on a number of factors 85 including pH, temperature, redox conditions, dosing location, reactor configuration, and iron and phosphorus conversions by microorganisms present in the wastewater (De Haas et al., 2000a; Wang et 86 al., 2014). In turn, these factors will dictate the forms of iron, either ferric (Fe^{3+}) or ferrous (Fe^{2+}), and 87 influence the rate and extent of iron transformations. As an illustration, when ferric salts are added to the 88 89 mixed liquor, the salt ionizes to yield the free metallic ions, a portion of which may then react with 90 orthophosphate (PO₄-P) to form insoluble ferric phosphate precipitates (strengite). The precipitates might 91 then be separated out by sedimentation or membrane filtration (Wu et al., 2015). However, the majority 92 of ferric ions will combine with hydroxide ions to form a variety of hydroxide complexes, termed hydrous 93 ferric oxides (HFO) with high sorption capacity, which will subsequently assist in the removal of 94 phosphorus by adsorption and co-precipitation (Smith et al., 2008). Due to high costs of ferric iron salts, Fe is in some instances added as ferrous iron, such as in $FeSO_4$ salt, which may oxidize to Fe^{3+} at the 95 96 dosing point if oxidizing conditions prevail in the physical or biological treatment stage (EPA, 2010). In 97 order to achieve greater degrees of P removal, higher levels of iron or smarter dosing strategies may be 98 required (e.g. optimum dosing location, molar ratio requirements).

99 For MBR systems, and for CAS plants without tertiary treatment, biological treatment is usually the final 100 treatment step, which means that the process will have to operate with much lower phosphorus 101 concentrations. Phosphorus is an essential nutrient for microbial growth and its shortage may limit 102 biological activities, such as nitrification and denitrification processes (Philips et al., 2003). This 103 introduces a sensitive interaction between biology and precipitation chemistry, requiring optimal 104 phosphorus removal control strategies and operational settings to achieve efficient and robust wastewater 105 treatment. A more detailed insight into the interactions between iron species and phosphorus within a 106 biological nutrient system with membrane separation is of particular importance to many countries. 107 Wastewater utilities are assessing biological nutrient removal with MBRs to establish a suitable treatment 108 pathway in line with stricter discharge requirements in the future (Daigger et al., 2010). While current 109 studies have significantly increased knowledge of the process design with membrane technology and modified biological treatment, there is still a need to further clarify the impacts of ferric and ferrous iron 110 111 dosing on phosphorus removal in the activated sludge system. Gaining insight into iron speciation and 112 iron species transformation through modelling is paramount to capture the mechanisms of iron-113 precipitation, as their nature, movement and fate in bioreactors would impact both phosphorus removal efficiency as well as membrane performance characteristics. 114

A recent study proposed a mechanistic chemical P removal modelling approach, which describes the 115 kinetics precipitation and flocculation of HFO as well as P adsorption onto HFO particulates and co-116 117 precipitation (Hauduc et al., 2015). This model had been calibrated and validated with lab-scale data on P 118 removal with iron in synthetic aqueous solutions. The model framework of Hauduc et al., (2015) was 119 demonstrated to be well-suited for benchmark development procedures for optimizing control and 120 operational strategies for chemical dosing in a plant-wide context (Solon et al., 2017), however this 121 approach has not been validated with real wastewater for full-scale implementation. By the way of 122 contrast, Kazadi Mbamba et al. (2016) validated a phosphorus plant-wide model with spontaneous 123 precipitation in anaerobic digestion, but did not include simultaneous precipitation of P with metals in the

activated sludge system. The main reason of excluding simultaneous precipitation by Kazadi Mbamba *et al.* (2016) was that P was solely removed by biological processes in the modelled full-scale system.
Consequently, the approach of Hauduc *et al.* (2015) and the plant-wide model of Solon *et al.* (2017) have
not yet been tested on full-scale data with diverse dynamics, and this is the focus of the present study.

The main novelty of this contribution is to predict P and Fe transformations in both water and sludge 128 129 lines. Current modelling approaches and understanding of the reaction mechanisms of iron and 130 phosphorus are applied to pilot-scale data to evaluate control and operational strategies. The study also focuses on the impact of the Fe/P molar ratio system when the pH varies, and its effect on effluent TP 131 132 concentration, for example due to routine membrane cleaning with acidic solutions. Special focus is placed on validating these aspects using recent model development. The paper is structured to first 133 present the underlying principles of the plant-wide model including the precipitation model, then the 134 135 validation step with static pilot-test data and other steady-state analyses, after which dynamic simulations are used to examine the influence of operational and control factors. 136

137

138 **2 Methodology**

139 2.1 Pilot-plant configuration

The MBR pilot-plant under study is located at the R&D facility Hammarby Sjöstadsverk, which is adjacent to Henriksdal wastewater treatment plant (WWTP) (850,000 PE), the largest in Stockholm (Sweden). The purpose of the pilot-plant is to evaluate the design of a future full-scale facility and optimize operation and control. The pilot-plant design mimics the configuration of the future full-scale facility, which consists of pre-aeration tanks, primary clarifiers and membrane bioreactors with anoxic and aerated zones. The scale factor used in the design and rebuilding of the pilot-plant compared with the

full-scale plant is 1:6,700, except for the primary sedimentation, which is relatively small (scale factor 1:12,000), and as a result led to poorer Total Suspended Solids (TSS) separation efficiency than would be expected from full-scale. A major difference for the operating strategy and control between pilot and fullscale, is that the pilot has only two membrane tanks that can be put into operation for optimal/energy efficient membrane operation, whereas each line in the full-scale system will have 12 membrane tanks.

The pilot-plant treatment process consists of a conventional primary treatment including a pre-aeration step, where FeSO₄ is added, followed by seven bioreactors operated as a 4-stage modified Ludzack-Ettinger (MLE) process consisting of two anoxic (BR1/ANOX and BR2/ANOX), one aerobic/anoxic (BR3/FLEX), two aerobic (BR4/AERO and BR5/AERO), one de-oxygenation (BR6/DEOX) and one post-anoxic (BR7/ANOX) compartments (Figure S1 and Table S1). The Henriksdal wastewater treatment plant consists of two influents: Sickla influent (SIN) and Henriksdal influent (HIN). The influent to the pilot-plant was derived from HIN.

From the mixed liquor suspended solids (MLSS) in the membrane bioreactor tanks, clarified permeate for final discharge is produced. The retentate from the MBRs is distributed to the bioreactors as returned activated sludge (RAS), while a small portion is bled as waste activated sludge (WAS). A sludge treatment facility was constructed at the pilot-plant but not yet in operation during this project; however, anaerobically digested supernatant (Table 1) from Henriksdal WWTP was blended with the RAS flow in the RAS-deoxygenation zone (RASDEOX) and then fed to the first anoxic reactor.

Although the pilot-plant during the time of the study did not have an operational sludge treatment train (anaerobic digester), an interaction with sludge treatment was physically simulated by adding digestate back into the membrane module and routinely removing WAS and primary sludge from the pilot-plant.

167 2.2 Membrane bioreactors

168 The MBR pilot uses GE hollow fiber membranes (nominal pore size 0.04 µm) with two cassettes (2.5m x 169 1.0m x 0.34m) of three membrane modules each, immersed in each membrane tank. Each module has a membrane area of 34.2 m^2 and consists of a variety of fiber strands with attachment at the top and bottom 170 171 of the cassette frame. The filtered water (permeate) is transported on the inside of the fibers to connections in both the bottom and the top of the module. The membranes are kept clean during operation 172 by aeration from below and backpulse cleaning-in-place (CIP) with hypochlorite and citric/oxalic acid 173 solution twice per week, respectively. The bioreactors are operated with a hydraulic retention time (HRT) 174 of 12 hours and a sludge retention time (SRT) of about 23 days. The membrane modules are operated in 175 cyclic mode with 9 minutes of filtration at a constant flux of 19.4 L.m⁻².h⁻¹ (LMH) followed by a 1 minute 176 relaxation. 177

178 2.3 Chemical addition

Phosphorus was removed from the aqueous phase by chemical precipitation, dosing FeSO₄·7H₂O (iron 179 (II) sulfate heptahydrate) and FeCl₃·6H₂O (iron (III) chloride hexahydrate) at three distinct dosing points. 180 FeSO₄ was dosed in the pre-aeration tank before the primary clarifier and in the aerobic tank 181 (BR4/AEROB), whereas FeCl₃ was added at the end of the post-denitrification (BR7/ANOX) before the 182 membrane tanks. The addition of FeSO₄ to the pre-aeration tank was flow-proportional with an annual 183 average dose of 10 gFe.m⁻³, while the addition of FeSO₄ in the BRA4/AEROB was controlled to achieve 184 a set point of 0.2 gP.m⁻³ in the treated effluent, with a maximum dose of 15 gFe.m⁻³. FeCl₃ added before 185 the membrane tanks was also controlled to achieve a set point of 0.15 gP.m⁻³ in the effluent, with a 186 maximum dose of 15 gFe.m⁻³. Brenntaplus (a mixture of proteins, sugars and alcohols) with concentration 187 of about 400,000 gCOD.m⁻³ was used as an external carbon source. It was dosed at a flowrate of 0.005 188 m³.d⁻¹ in the post-anoxic tank (BR7/ANOX) and the dosage was controlled to achieve a pre-selected 189 nitrate concentration set point of 3 gN.m⁻³ in the effluent. 190

191 2.4 Influent characterisation

192 <u>2.4.1 Routine measurement data</u>

193 A SCADA (supervisory control and data acquisition) system provided the following daily data: (1) flow 194 rates of water and sludge streams, (2) air flow rate to the activated sludge system, (3) phosphate 195 phosphorus (PO₄-P), (4) nitrate nitrogen (NO₃-N) in treated effluent, (5) dissolved oxygen (DO), (6) total 196 suspended solids (SS), (6) temperature and (7) pH in membrane tank 2. In addition, the operating utility (Stockholm Vatten och Avfall (SVOA)) provided data from routine sampling and off-line analysis which 197 198 included daily and weekly measurements on composite samples from auto-samplers located at the influent, primary effluent, effluent, bioreactor 4 and RASDEOX line. Analyses on the influent and 199 200 effluent included total organic carbon (TOC), 7-day biological oxygen demand (BOD₇), TSS, volatile suspended solids (VSS), total dissolved solids (TDS), volatile fatty acids (VFA), ammoniacal nitrogen 201 202 (NH₄-N), NO₃-N, total nitrogen (TN), PO₄-P, total phosphorus (TP), alkalinity, iron (Fe) soluble calcium 203 (Ca), magnesium (Mg), sodium (Na) and potassium (K). Analyses were generally done using Standard 204 Methods (APHA, 2012). The samples were conserved with 1-part 4M sulfuric acid to 100 parts sample volume, except for samples tested for TOC, which were instead conserved with 2M hydrochloric acid in 205 206 the same proportions. In addition to external analyses, other samples, as described in Section 2.4.2, were 207 analysed internally (on site) for TSS, filtered and total COD, TN and NH₄-N by colorimetric methods 208 using a spectrophotometer (WTW Photolab 6600). Data collected over a period from 20 June 2016 to 10 209 April 2017 were selected and averaged, before use as a representative measure of steady state conditions.

210 2.4.2 Additional data measuring campaign

Additional sampling and off-line analyses were required for model calibration, these were carried out to augment routine measurements at the pilot-plant. Grab and composite samples were collected daily for a week during the period 12/07/2017 to 19/07/2017, from five different points: influent, primary effluent, effluent, from one of the bioreactors (BR4/AEROB) and RASDEOX return sludge. Samples were stored

in a cooler box with ice bricks and transported to an external laboratory (Eurofins Environment SwedenAB), which conducted the analyses.

217 2.5 New model configuration describing plant wide P-Fe interactions

218 <u>2.5.1 Plant wide model</u>

The plant-wide model was adapted from the Benchmark Simulation Model No. 2 (BSM2) (Gernaey et al., 219 220 2014, Solon et al., 2017). The primary clarifier was modelled as one non-reactive settler (Otterpohl and 221 Freund, 1992). Biokinetics in the activated sludge plant were described by ASM2d (Henze et al., 2000), 222 expanded to include physico-chemical processes as described below in Section 2.5.2. Furthermore, the 223 TSS in ASM2d was computed from volatile suspended solids (VSS) and inorganic suspended solids (ISS) (Ekama and Wentzel, 2004). The membranes were simply described as a reactive filtration system with 224 wastewater entering at the bottom, permeate exiting at the top of the membranes and retained biomass 225 leaving from the base to be recycled back to the activated sludge system as RAS. Sludge thickening and 226 dewatering units were assumed to be ideal (with constant split fraction and characteristics) with no hold-227 228 up volume or reactions (Jeppsson et al., 2007).

The pilot-plant during the time of the study did not have a sludge treatment train, but had WAS removed 229 230 and digestate added to simulate the physical interaction between the liquid and sludge lines (See Section 2.1). To capture this interaction in the model, an anaerobic digester was included on the thickened sludge 231 232 line (Figure 2). This allowed a full evaluation on the impacts of iron salts to be carried out in the pilot-233 plant as a whole. Biochemical conversion processes in the anaerobic digester were described by the ADM1 (Batstone et al., 2002), upgraded to include recent developments, including physico-chemical and 234 235 biological iron, sulphur and phosphorus transformations (Flores-Alsina et al., 2016). For a full exposition of the extended ADM1 model, as well as a detailed description on the matrix format used to represent the 236 237 anaerobic digestion model, the original publications (Batstone et al., 2002; Solon et al., 2017) can be 238 consulted. Model interfaces were used to translate state variables between the ASM2d and ADM1 and

between the ADM1 and the ASM2d, based on continuity principles (Nopens *et al.*, 2009), and in
accordance with Solon *et al.* (2017).

The membrane model consisted of a simple reactive filter to describe the cycling of RAS between the membrane module and the activated sludge line. Membrane fouling was not considered in the model to minimise unnecessary model complexity, because it would require a large number of parameters to calibrate a fouling model. Also, backwashing and relaxation were not physically modelled. However, aeration for controlling membrane fouling was incorporated in the MBR model to evaluate its impact on the activated sludge treatment.

247 <u>2.5.2 Physico-chemical framework describing Fe precipitation and oxidation/reduction reactions</u>

248 The activated sludge model was extended with the chemical precipitation processes of two minerals, namely hydrous ferric oxide and iron phosphate (strengite, FePO₄.2H₂O). Removal of P by chemical 249 precipitation and sorption were assumed to take place in parallel, and were therefore competing for ferric 250 iron in the wastewater within the bioreactors (Wu et al., 2015). Iron transformations were described using 251 the hydrous ferric oxide (HFO) model, which describes how the precipitation of freshly formed and 252 253 highly reactive HFO provides a number of adsorption sites for ions on its surface (Hauduc et al., 2015). 254 However, a simplified HFO model was used (Solon, 2017; SUMO, 2018). Briefly, the HFO model describes the precipitation of amorphous iron hydroxide or HFO particulates (X_{HFO}), phosphate 255 256 adsorption/binding onto X_{HFO} and the ageing of HFO as the extent of crystallinity increases. HFO initially 257 precipitates with a high adsorption capacity (X_{HFO,H}), which has an open structure and easily accessible binding sites. Through the aging process, X_{HFO} loses reactivity and develops a more compact structure 258 259 and less accessible sites (thus high reactivity $X_{HFO,H}$ transforms over time into low reactivity $X_{HFO,L}$). Adsorption of phosphates onto HFO leads to production of HFO with bound phosphate (X_{HFO,H,P} or 260 $X_{HFO,L,P}$). The binding of P to $X_{HFO,H,P}$ in the model description is reversible, which means that a 261

transformation of $X_{HFO,H}$ into $X_{HFO,L}$ in the model would decrease the concentration of $X_{HFO,H}$ and thereby induce a transformation of $X_{HFO,H,P}$ into $X_{HFO,H}$ as well as cause a release of P.

When iron salts, such as $FeSO_4$, are added to the aerobic tank, Fe^{2+} will undergo oxidation into ferric iron as follows:

$$Fe^{2+} + \frac{1}{4}O_2 + H^+ \rightarrow Fe^{3+} + \frac{1}{2}H_2O$$
 (3)

The reaction consumes a stoichiometric amount of 0.14 g O_2/g Fe²⁺. The oxidation of ferrous iron leads to the formation of ferric iron and subsequently to HFO precipitates, which will affect the removal of P by adsorption and co-precipitation through the HFO pathway as shown above. The complete stoichiometry and kinetic rates used for the HFO model can be found in Solon (2017).

Direct iron phosphate precipitation (X_{FePO4}) was described as a reversible process using supersaturation as the chemical driving force. The model consisted of two parts; an algebraic equation set for aqueous-phase reactions (weak acid-base and ion-pair equilibrium) and rate expressions for minerals precipitation, minerals dissolution and gas transfer (Kazadi Mbamba *et al.*, 2015a; b).

275 In the extended ADM1 (Solon et al., 2017), mineral precipitation is also described as a reversible process 276 using supersaturation as the chemical driving force. The multiple minerals in the extended ADM1 include calcite, aragonite, amorphous calcium phosphate and struvite. Furthermore, the extended ADM1 includes 277 iron phase transformation. Ferric iron in the form of hydrous ferric oxides (X_{HFO,L}, X_{HFO,H}) undergoes 278 279 reduction to ferrous iron using hydrogen and sulfide as electron donor (Solon et al., 2017). Once released, Fe^{2+} can preferentially bind with S^{2-} to form iron sulphide. Additionally, Fe^{2+} in excess may also combine 280 with soluble phosphate present in the anaerobic digester to form vivianite $(Fe_3(PO_4)_2)$. FePO₄, if 281 undersaturated, may undergo dissolution releasing Fe^{3+} and soluble P. 282

Gas transfer in the plant-model was described using single-film mass transfer-controlled processes (Batstone *et al.*, 2002). The gases included were O_2 and CO_2 in ASM2d, and CO_2 , NH_3 , H_2O and CH_4 were modelled in ADM1.

286 2.6 Ancillary elements

287 <u>2.6.1 Influent COD fractions</u>

The fractionation of COD in the influent was performed using the routinely analysed data provided by the 288 pilot-plant operator. As in ASM2d, the COD fractions in the influent included readily biodegradable 289 organic compounds (fermentable) (S_F), fermentation products (S_A), inert soluble organic compounds (S_I), 290 slowly biodegradable organic compounds (X_S) and inert particulate organic compounds (X_I) , using a 291 physico-chemical and biological characterization method (Roeleveld et al., 2002). Particulate 292 components, namely heterotrophic organisms $(X_{\rm H})$ were considered to be 6% of the influent total COD 293 294 while the nitrifying organisms (X_{AUT}) were assumed to be negligible in the influent as per Henze *et al.* 295 (1995). Total suspended solids (X_{TSS}), total dissolved ammonia nitrogen (S_{NH4}), nitrate (S_{NO3}) and inorganic soluble phosphorus (S_{PO4}) were assumed to be equal to experimentally measured values, while 296 297 the remaining variables in the influent, including dissolved oxygen (S_{O2}) and dissolved dinitrogen (S_{N2}), 298 were set to zero.

299 <u>2.6.2 Synthetic influent data generation</u>

The static influent fractions obtained from the analyses above, were used to determine dynamic influent base characteristics. A simplified dynamic influent generator was used to re-create long-term wastewater dynamics (Gernaey *et al.*, 2011; Flores-Alsina *et al.*, 2014). Since data related to influent wet weather flow-rate conditions were missing for the pilot system, the measured flow rate data were used instead. A temperature module was not included in the model, because measured temperature data were available

and used instead. Finally, an additional module had to be included in the model in order to capture the
dynamics of cations (Na, K, Ca, Mg) and anions (Cl) in the influent.

307 <u>2.6.3 Calibration procedure and more parameters</u>

308 A step-wise calibration procedure was used (Kazadi Mbamba et al., 2016), whereby kinetic parameters 309 were adjusted to minimize discrepancies between the model outputs and static measured data from the 310 pilot-plant. Besides the influent characterisation described above and adjustment of the maximal rate of autotrophic biomass (0.5 d^{-1}) and decay of autotrophic bacteria (0.1 d^{-1}), model parameters for ASM2d 311 312 and ADM1 were kept at default values (Henze et al., 2000; Batstone et al., 2002; Flores-Alsina et al., 2016). The Davies approximation to activity coefficients was used with temperature correction, and 313 equilibrium constants were also adjusted for temperature using the constant-enthalpy form of the van't 314 315 Hoff equation (Stumm & Morgan, 1996). For minerals precipitation reactions in the anaerobic digester, precipitation rate coefficients from a previous study were used (Kazadi Mbamba et al., 2015b). 316

317 2.7 Scenario analyses

318 Scenario analyses were used to investigate the performance of the plant-wide model and the impact of 319 simultaneous precipitation on phosphorus removal under dynamic conditions. The criteria that were used 320 to assess model performance, were related to effluent quality in the water line, including NH₄-N, NO₃-N 321 and PO₄-P. The following six scenarios were assessed:

i) Scenario 1 – plant-wide model with MBR, chemical precipitation, closed loop DO controllers in the aerobic zones and NO₃ controller in the post-anoxic zone. For the DO controllers, the DO concentrations in the aerobic tanks were controlled to a set point of 2.0 g.m⁻³ by manipulating the air supply rate, while an external carbon source was added to the post-anoxic tank to maintain the concentration of NO₃-N at 3 gN.m⁻³ for the NO₃ controller.

ii) Scenario 2 *with step change in FeSO*₄ *dose*. This scenario determined the phosphorus response time constant under dynamic conditions with the calibrated plant-wide model, when the dosage of iron salts was changed (increased or decreased by 10%), to assess how this would affect phosphorus removal. The time constant was determined as the time required by the effluent P to reach 63.2% (from a 10% FeSO₄ step decrease or increase) of its total change.

iii) Scenario 3 *with phosphorus controller*. The base case was simulated as in Scenario 1 except for dosing of Fe salts, with a predefined concentration of phosphorus in the effluent being controlled by manipulating the dose flow rates (FeSO₄ or FeCl₃). This scenario examined whether inclusion of a phosphorus controller for chemical precipitation, would be essential to achieve low P effluent concentrations, whilst at the same time preventing detrimentally low P concentrations with adverse effects on biological processes in the bioreactors.

iv) Scenarios 4, 5 & 6 were designed to investigate the impact of changing dosing location for iron sulphate to the activated sludge system. During this simulation analysis, FeSO₄ addition was varied between three different locations, namely anoxic (BR1/ANOX), aerobic (BR4/AER), and RASdeoxygenation (RASDEOX) compartments in Scenario 4, Scenario 5 and Scenario 6, respectively.

342

343 **3 Results and discussion**

344 3.1 Steady-state influent characteristics

Data from 2015 were used to fractionate COD and calculate COD ratios, which were obtained from the 2016-2017 data used in the steady-state simulations. Table 2 shows the measured total, filtered and flocculated COD data, as well as the various COD fractions obtained from the 2015 data. The readily biodegradable and fermentation products fractions accounted for 13% and 9% of total COD, respectively.

The slowly biodegradable fraction had the highest percentage (56% of total COD), while the nonbiodegradable organics and the heterotrophic biomass represented 11% and 6% of total COD, respectively. The non-biodegradable fraction was used as one of the calibration parameters for sludge age in the activated sludge system; however, the effect of this parameter adjustment was outweighed by the separate effect of an adjusted primary clarifier efficiency influencing the amount of particulates entering the activated sludge system.

355 The averaged influent measurements and modelled influent composition for the pilot-plant are presented in Tables 3 and 4, respectively. The pilot-plant has limited COD data available and so the total organic 356 357 carbon (TOC) measurements were converted to COD using an observed COD/TOC ratio of 3.5. The plant had a medium strength influent with respect to concentrations of organic matter (148 gTOC.m⁻³; 521 358 gCOD.m⁻³) and nutrients, such as ammonia nitrogen (37 gN.m⁻³), and orthophosphate phosphorus (3.3 359 gP.m⁻³). The influent contained 6.23 g.m⁻³ of total phosphorus, of which about 53% was soluble 360 phosphorus. Total nitrogen included 76% ammoniacal nitrogen, while the remainder was organic 361 nitrogen. The raw wastewater influent contained 249 gTSS.m⁻³ of total suspended solids (TSS), of which 362 363 86% was volatile and the remainder was inorganic.

Using the COD ratio described above, the estimated organic matter content included a significant quantity of soluble COD (174 gCOD.m⁻³), including VFAs (40 gCOD.m⁻³). The results of the characterization showed a low (0.15) ratio between the readily biodegradable and slowly biodegradable substrates. The ratio of inert organic matter to slowly biodegradable substrate was also 0.15. These ratios did not change substantially after the primary clarifier, because the clarifier was performing very poorly with a removal efficiency of less than 30% TSS.

370 **3.2** Dynamic influent characteristics

Figure 1 shows a representative pilot-scale data set over 294 days from June 2016 to April 2017, together with the BSM2 influent generator model simulations for flow rate, COD, NH₄-N and PO₄-P. Simulation results were in reasonably good agreement with measured results in terms of concentrations of ammonia nitrogen, phosphate, COD and TSS. We note that the influent generator provided modelled data at 5 min intervals, whereas actual measurements were relatively sparse with only daily or weekly sampling and analysis. The representative influent file created by the BSM2 influent generator model was used for dynamic simulation analyses.

378 **3.3 Plant steady-state results**

379 <u>3.3.1 Model calibration</u>

380 Figure 2 presents the modelled steady state and average measured data for key variables. With the minimal parameter adjustments described in Section 2.6, it was possible to achieve good agreement 381 between modelled and measured TSS, PO₄-P and NH₄-N in the different streams of the pilot-plant. 382 383 Further, the model was able to confirm the observed concentration of P in the effluent. For the steady-384 state scenario, differences between measured and modelled phosphorus of 5-10% were observed throughout the pilot-plant, and the prediction error for ammonia nitrogen was low at below 1%. The 385 386 relative error for measured and predicted suspended solids (SS) in the primary effluent, mixed liquor and return activated sludge was reasonable at 3%, 1% and 6%, respectively. However, significant SS 387 388 differences were seen in the effluent, likely due to faulty SS meters in the pilot-plant. The model instead 389 assumes ideal complete retention of solids, due to the presence of the membranes.

The total iron concentration was low in the effluent (0.12 gFe.m⁻³), indicating that almost all of the added iron salts precipitated out of the mixed liquor and were incorporated into the activated sludge. Available data for iron speciation and the precipitation model were limited, nevertheless pilot-plant performance

393 with respect to final effluent concentration of total iron was predicted very reasonably. Given the low 394 concentration of total Fe in the effluent, it could be assumed that dosing FeCl₃ at the membranes provided additional removal of P, with no evidence of short-circuiting of dissolved iron. As such, a large amount of 395 396 iron minerals in the form of HFO (about 70% of iron precipitates) and iron phosphate (approximately 30% of iron precipitates) were retained in the activated sludge within the bioreactors, with the associated 397 precipitation and adsorption most likely accounting for the phosphorus removal. The proportion of 398 HFO/FePO₄ significantly varies depending on a number of operational factors, including sludge age, pH, 399 Fe/P ratio, the transformation between Fe^{2+} and Fe^{3+} , and the equilibrium concentrations of ferric iron and 400 soluble phosphate. These factors are vital when assessing control strategies with respect to efficient 401 removal of phosphorus. While pilot-plant data related to Fe^{2+} and Fe^{3+} species were unavailable, a 402 literature review shows that ferrous iron added to an oxidizing environment fully converts to ferric iron, 403 which then participates in P removal via precipitation or adsorption pathways (Wang et al., 2014). Whilst, 404 405 the conversion of ferrous iron to ferric iron could be implemented as a simple instantaneous reaction, a 406 fast kinetic approach was used instead in this modelling study, and did not compromise simulation speed. In general, dosing of Fe^{3+} may be preferred to avoid an oxidation step; however, this would depend on the 407 relative cost of ferric and ferrous salts. In general, the study showed that iron speciation is key in studying 408 409 Fe chemistry and will therefore increase understanding of chemical P removal mechanisms.

In terms of energy recovery, the model simulated biogas production at 2.4 Nm³.d⁻¹, which is probably lower than expected due to the low sedimentation efficiency in the primary clarifier (less than 30%). However, experimental data were not available to confirm prediction accuracy, due to the lack of a dedicated sludge treatment train.

414 <u>3.3.2 Impact of pH and Fe/P molar ratio</u>

The calibrated plant-wide model was used to carry out further simulations to study the impact of pH and molar ratio of Fe/P on the removal efficiency of phosphorus. As shown in Figure 3, the effluent P

417 concentration substantially decreased with decreasing pH at all Fe/P molar ratios. For example, for the lowest ratio (Fe/P=1), the effluent P dropped from 0.39 gP.m⁻³ at higher pH (7.4) to 0.02 at pH 6.7. 418 419 However, the relative differences of P concentrations in the effluent between the highest and lowest Fe/P 420 ratios was higher (0.63) at higher pH but became smaller (0.09) at lower pH. This shows that the pH and 421 the molar ratio of iron to the phosphorus concentrations affect the competition between hydroxyl ions and phosphates for ferric ions at the point of addition. These results are in good agreement with other studies 422 (Hauduc *et al.*, 2015). In general, the pH of a wastewater affects chemical species distribution of the weak 423 acid-base systems, such as phosphate, and ferric iron speciation, which in turn dictate simultaneous 424 chemical precipitation and adsorption. Furthermore, the results show that increasing the concentrations of 425 426 iron salts may not translate in further removal of phosphorus when residual P concentration is already 427 very low. This is in agreement with other studies, which have reported that the efficiency of dosed chemicals declines significantly at low phosphorus concentrations (De Haas et al., 2000a; 2001b). 428

429 3.4 Assessment of model dynamic responses

430 3.4.1 Time constant of chemical precipitation

431 Figure 4 presents the results of simulations where a step change in the dose of FeSO₄ was introduced. The 432 time constants of the response of the P concentration were found to be 5.25 days and 5 days, when the iron dose rate was decreased and increased by 10%, respectively. Therefore, when the dosing of $FeSO_4$ is 433 changed in the wastewater treatment system, the effluent P varies accordingly in a time-dependent 434 manner with slow dynamics. With the observed first-order response, the initial change in effluent P is 435 greatest, eventually levelling off at a new equilibrium state at least within about 5 days. The overall slow 436 437 response is likely the result of the complex multi-step process of dissolution, oxidation, formation, growth and aging of HFO complexes, affecting phosphorus adsorption in a time-dependent manner in the model. 438

439 Similarly, the experimental investigations (shown in Figure S2) at the pilot-plant under study similarly440 showed a slow response when the dosed amount of precipitants was changed, and therefore corroborate

441 these simulation results (Figure 4). The representation in the model (as seen in the simulation results) 442 induces a persistent effect of the dosed iron being recycled in the sludge and continuing to remove phosphorus well after reducing/stopping the chemical dosing. Again, this was corroborated by actual 443 444 measurement observations in the pilot plant. Specifically, the model description includes chemical 445 phosphorus removal via two simultaneous reactions: a reaction of phosphate and HFO (by adsorption and co-precipitation) as well as a rapid direct iron phosphate precipitation (possible at the point of chemical 446 addition) (Wu et al., 2015). Freshly formed HFO and possibly (amorphous) iron phosphate in the 447 wastewater, are potentially highly reactive (high surface areas or many binding sites) and able to partake 448 in the removal of phosphorus from wastewater. However, reactivity of HFO deteriorates through ageing 449 450 that occurs as the minerals accumulate in the bioreactors and continues to be recycled as part of the RAS. 451 This indicates that the progressive accumulation of the Fe precipitates continuously facilitates additional phosphorus removal. The implication of this assertion is that the solid retention time (SRT) plays a 452 453 critical role in determining the effluent P concentration. In other words, during simultaneous 454 precipitation, iron dosed directly to the bioreactors or membrane tanks within the MBR system, where sludge recycling is taking place with much longer SRTs (23 days), will participate in P removal. 455 Additionally, the effluent P will decrease with increasing SRT, indicating that the sludge age is one of the 456 key operational parameters controlling the iron sludge content in the bioreactors and influences both the P 457 458 in the effluent and eventually the membrane characteristics. On the other hand, a higher SRT would 459 involve the potentially competing effect of accumulating older less reactive sludge. However, from pilotplant observations in this study, HFO reactivity is reasonably maintained, presumably by iron, cycling in 460 461 the MBR system, undergoing reduction-oxidation reactions whilst alternating between anoxic and aerobic 462 conditions (Bligh et al., 2017). This is represented in the model.

3.4.2 Plant-wide dynamic results 463

In order to demonstrate the application of the plant-wide model, several scenarios were considered in 464 which effluent phosphorus concentrations around 0.05-0.4 gP.m⁻³ were obtained, using a stoichiometric 465 24

466 molar ratio Fe/P = 2 with respect to the influent concentration. The effect of increasing or decreasing the quantity of dosed chemicals was investigated as part of Scenario 2. The dosing chemicals (FeSO₄ and 467 FeCl₃) were fed directly to the aerobic tank and membrane tanks, respectively. Their concentrations were 468 decreased by 10% after 120 days while the plant was operated under dynamic conditions. Dosing FeSO₄ 469 to the aerobic tank led to the oxidation of Fe^{3+} , which played a key role in removing P. Figure 5a displays 470 the total phosphorus in the influent, which is also compared to the total amounts of iron salt dosed at the 471 three dosing locations to remove phosphorus from the influent, as shown in Figure 5b, as well as the 472 473 concentration profile for phosphorus in the secondary effluent, as shown in Figure 5c. The striking feature in controlling PO₄ in the effluent is that the total amount of added iron was reduced by 18% from 1046 474 gFe.d⁻¹ in Scenario 1 (PO₄ open loop) to 889 gFe.d⁻¹ in Scenario 3 (PO₄ closed loop). This reduction 475 476 clearly shows the benefits of controlling Fe dosage and how it could significantly impact the operational cost of removing P from wastewater. It is worthwhile to mention that about 8.9% of the iron dosed in the 477 first scenario, was added as Fe^{3+} , while the remainder (91.1%) was dosed as $FeSO_4$. The overall amount 478 of Fe³⁺ was 8.6% in the second scenario, however, it increased significantly to 44.6% in Scenario 3 (see 479 Section 3.4.2 for further discussions). The simulation results in Figure 5c show that the concentrations of 480 phosphorus in the effluent increased by approximately 44% for the 2nd scenario and decreased by 15% for 481 the 3rd scenario, respectively. The increase of phosphorus in the effluent in the 2nd scenario is due to the 482 483 decreased contribution of the iron salt flows to the aerobic tank and membrane tanks.

Scenario 2 was carried out to simulate the behaviour of the pilot-plant if the FeSO₄ dosage had been less than required for a significant period of time, and the control system takes corrective measures to ensure that the effluent quality is maintained. For example, after a period of limited dosage (e.g. due to incorrect concentration of precipitation chemicals), the modelling results (Figure 5c) showed that such scenarios could be compensated for by increasing and decreasing subsequent Fe salt dosage in a controlled manner. As indicated above, redox cycling of iron in an MBR system is expected to maintain or reduce the rate of HFO reactivity loss as a result of reduction in anoxic zones and oxidation in aerobic zones (Blight *et al.*,

491 2017). To this end, the presence of the accumulated precipitates has a beneficial effect on phosphorus, 492 and a major mechanism of phosphorus removal, likely due to the long contact time with the accumulated 493 sludge leading to removal of P by adsorption or co-precipitation. The amount and reactivity of existing 494 minerals present in the activated sludge are among the most influential factors for phosphorus removal by 495 simultaneous precipitation adsorption reactions.

Figure 6 shows the results of concentration profiles of ammonia nitrogen in the secondary effluent for the 496 first three scenarios combined. The simulation results indicate that the concentrations of ammonia 497 nitrogen in the effluent decreased by approximately 8.7% for the 2nd scenario and decreased by 8.2% for 498 the 3rd scenario, respectively. The spikes in the simulated ammonia concentrations corresponded very 499 well to lower concentrations of soluble phosphate in the bioreactors. Overall, these results indicate that 500 phosphorus deficiency due to simultaneous precipitation may be detrimental to autotrophic nitrifying 501 502 bacteria, which require enough phosphorus for cell growth. It should be noted that a phosphorus limitation can occur when the concentration of phosphorus is in the range of 0.1 to 0.3 gP.m⁻³ (Metcalf & 503 Eddy, 2004). This highlights the necessity to control the level of bioreactor phosphate concentrations to 504 505 reduce the risk of biological processes being limited by low phosphate.

506 <u>3.4.3 Impact of controlling iron salt (FeSO₄ & FeCl₃) dosing</u>

The impact of imposing a basic control and operational strategy for maintaining the concentration of 507 508 phosphate below a required future effluent standard, was investigated for demonstration purposes. The results in Figure 5c (Scenario 3) indicate that the implemented PO₄ control strategy, enabled the plant to 509 reach P effluent concentrations of about 0.15 gP.m⁻³ as stipulated by the future effluent quality standard, 510 511 whilst at the same time ensuring that the iron dosage was appropriate. However, the location of the two P 512 controllers appeared to be an important factor for achieving minimum consumption of iron coagulants. For example, when the sensor for FeSO₄ dosage was at the same location (secondary effluent) as the one 513 for FeCl₃ dosage, the simulation indicates that only the FeCl₃ controller with the lower set point (0.15 514

gP.m⁻³) was effective. Moving the location of the FeSO₄ controller before the post-anoxic tank (at the 515 516 outlet of the anoxic tank before addition of FeCl₃) led to a reduction of iron coagulant by 15% since both controllers were working as per set criteria. This is in agreement with the recommendations of Ingildsen 517 518 & Olsson (2002), that sensors located in close proximity to the controlled processes are preferable for a good controller performance. Controlling Fe salts dosing also provides additional benefits of maintaining 519 520 optimal conditions for nitrification/denitrification processes. It has been shown that biological nutrient removal mechanisms function less well in the presence of chemical precipitation, under conditions where 521 522 the P concentration in the activated sludge is too low and potentially limiting (Philips et al., 2015). Such conditions with low P may be prevalent in WWTPs with MBRs and chemical P removal, such as in the 523 524 pilot-scale plant under study, designed to reach very low effluent P concentrations. Therefore, it is 525 recommended to control the addition of iron salts. When the P controllers are maintained at their set points by closed-loop control, the simulations indicate that the WWTP will not only achieve lower P 526 values in the effluent but also more efficient chemical use. 527

528 <u>3.4.4 Impact of iron dosing location</u>

To maximize the removal of phosphorus in the presence of iron salts, different iron dosing locations 529 including the aerobic tank, anoxic tank and RASDEOX stream, were investigated. Given that the 530 531 dissolved oxygen content of the RASDEOX stream from the membrane tanks is high and can have impact 532 on the denitrification process in the anoxic tank, simulations were used to analyse whether adding Fe(II) salts in this location could provide additional benefits in reducing the oxygen level in the stream being 533 534 recirculated to the activated sludge. Figure 7 shows the results of the simulated effluent P concentrations 535 for the impact of FeSO₄ dosing at the three different locations in the activated sludge system for Scenarios 536 4, 5 and 6. The dosing location in each case was changed at the beginning of the simulation.

537 In comparison to Scenario 4 (default dosing location), the simulation results indicate that the 538 concentrations of phosphorus in the effluent increased by roughly 17% and 13% for the 4th and 5th

539 scenarios, respectively. Whereas in the case of ammonia nitrogen concentration in the effluent, the reduction is small: 0.96% in the 4th scenario and 1.8% in the 5th scenario. The decrease of nitrate in the 540 effluent in the fifth scenario is likely due to the decreased contribution of RASDEOX oxygen entering the 541 542 anoxic tank. In general, the results show that iron addition at these locations had a limited impact on phosphorus removal performance. The implication would be that FeSO₄ dosing should be fed at an 543 aeration stage in the activated sludge process, where there is good mixing. When dosed prior to the 544 aeration tank, ferrous salts will dissolve and then some of the resulting Fe^{2+} will be oxidized to ferric iron 545 by nitrate (anoxic zone), whereas the remaining Fe^{2+} will undergo oxidation in the aerobic zone. 546

547 **3.5.** *Discussion*

548 <u>3.5.1 General description of P/Fe interactions in water treatment systems and singularity of the presented</u> 549 research

The study summarized in this paper has gone beyond the state of the art mathematical modelling practice 550 with an approach accounting for P and Fe transformations in both water and sludge line. Simulation 551 results were validated with N, P, Fe and TSS measurements at different parts of the plant. As far as the 552 553 authors are aware, the work herein does not resemble any other study in the published literature. Previous 554 studies described Fe-P processes with lab-scale data (Hauduc et al., 2015) or, when full-scale, only the water line had been accounted for (de Haas 2000a; 2000b; 2001). Full-scale examples predicting P 555 dynamics, verified with experimental data, did not include the Fe component (Kazadi-Mbamba et al., 556 557 2016). The latter has a strong effect on the overall process performance as shown by (Solon *et al.*, 2017) and by the present study results. 558

559 <u>3.5.2. Model based optimization for improved performance</u>

560 The overall results of this study demonstrate an iron transformation and precipitation model as part of 561 plant-wide model is a suitable tool for assessing chemical P removal from activated sludge. The model

562 enabled the prediction of iron consumption and P effluent and could be used to develop control strategies to optimize simultaneous precipitation in terms of chemicals consumption while maximizing nutrients 563 removal as far as stringent effluent discharge requirements are concerned. However, a complete 564 565 calibration and validation of an activated sludge model combined with chemical P removal requires additional influent characterization of soluble chemical components, particularly iron species, to be 566 incorporated into the physico-chemical module. In general, wastewater utilities only carry out limited 567 routine measurements, which also include very limited measurements of soluble chemical components. 568 569 To increase the accuracy of predicting simultaneous precipitation, it would be essential to perform additional measurements that cover other relevant components, especially non-typical wastewater 570 571 constituents (e.g. iron species) that play a significant role in modelling chemical P removal, but for which 572 there is currently limited knowledge.

573 The model analysis focused quite extensively on the fate of iron and phosphorus in the activated sludge 574 system. However, it should be pointed out that the plant-wide model used, included a sludge treatment train which consisted of sludge thickening, digestion and dewatering. During anaerobic digestion of waste 575 activated sludge, iron is released as a result of HFO reduction and iron phosphate dissolution leading to 576 577 an increased soluble concentration of iron. Sludge digestion also produces sulphide due to sulphate reduction and the degradation and reduction of sulphur-containing organics (Batstone et al., 2002). The 578 produced sulphide preferentially binds with iron to form iron sulphide minerals leading to a low 579 580 concentration of dissolved sulphide and hence decreases H₂S concentration in the biogas phase (Ge et al., 581 2013). Therefore, the model also has the potential to evaluate chemical dosing in anaerobic digesters for 582 hydrogen sulphide removal from biogas.

583

584 4 Conclusions

The present study demonstrates that an integrated model (ASM2d, ADM1, physico-chemical model) is suitable to account for biological nutrient and chemical P removal through Fe precipitation. The integrated model gave good results (representative of reality) when validated against the pilot-scale measurement data. The following were key modelling outcomes:

- The plant-wide model was able to replicate with acceptable accuracy the trends in effluent soluble
 ammonia (1%), phosphate (5-10%) and suspended solids (1-6%) under steady-state.
- Simultaneous precipitation of FePO₄ and HFO particulates including adsorption of P on HFO sites
 were the main mechanisms for phosphorus removal in the MBR system.
- 3) The simulations confirmed that the modelling approach was valid, particularly the dependency on
 pH, which showed a strong expected effect. The ratio of Fe/P was also identified as influential,
 which should be set (where possible) based on an effluent P target. At higher ratios, lower P
 concentrations are expected in the effluent. However, when the P concentration in the mixed
 liquor is very low (<0.2 mgP.L⁻¹), an increasing Fe/P ratio does not translate linearly into further
 removal of P.
- When the P controllers were maintained at their set points by closed-loop control of the iron salts
 dose, the WWTP achieved lower P values in the effluent. Accordingly, it is recommended to
 control the addition of iron salts, which would normally also have a positive impact on the
 operational cost of P removal in wastewater.
- 5) The time constant of simultaneous precipitation in the calibrated model, in response to step change
 increase or decrease in FeSO₄ dose, was found to be roughly 5 days. This indicated a slow
 dynamic response, likely due to multiple steps of dissolution, oxidation, precipitation, aging,
 adsorption and co-precipitation processes.
- 607 6) The dosing point of FeSO₄ in the activated sludge system was analysed for three different 608 locations: aerobic, anoxic and RASDEOX tanks. Dosing at the aerobic tank had a slightly higher

609 effect on the chemical P removal. Locations with high DO and good mixing conditions are 610 considered to be preferable for $FeSO_4$ addition due to fast oxidation of Fe^{2+} to Fe^{3+} .

611

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Figure 1 – Dynamic plant influent for representative measured and simulation data. The blue and red
solid lines represent the measured and simulated results, respectively.

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Figure 2 – Steady-state comparison between the model prediction and measured data for representative streams and variables across the pilot treatment plant. $FePO_4$ was added in a pre-aeration tank (before primary settling tank, not shown) and in the first aerobic tank, $FeCl_3$ was added before the MBRs.

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Figure 3 – The impact of pH and Fe/P molar ratio on the dissolved phosphorus in the

effluent.



Figure 4 – Dynamic response in effluent P to step change in iron salt ($FeSO_4$) dosage decrease (a) and increase (b).



Figure 5 – Total phosphorus in the influent (a), total amount of added iron (FeSO₄ and FeCl₃) at the three dosing locations for Scenarios 1 - 3 (b) and dynamic simulations of the soluble phosphate in the treatment plant outflow for Scenarios 1 - 3 (c).



Figure 6 – Dynamic simulations of ammonia nitrogen in the treatment plant outflow for

Scenarios 1 - 3.



Figure 7 – Dynamic simulations of the soluble phosphate and ammonia nitrogen in the treatment plant outflow for Scenarios 4, 5 and 6. The blue solid, red solid and yellow solid lines show the simulation results for the Scenario 4, Scenario 5 and the Scenario 6, respectively.

Table 1 – Composition of the supernatant from the full-scale anaerobic digesters atHenriksdal WWTP.

Parameters	Values
Total COD (gCOD.m ⁻³)	502
Soluble COD (gCOD.m ⁻³)	337
Total nitrogen (gN.m ⁻³)	523
Ammoniacal nitrogen (gN.m ⁻³)	460
Total phosphorus (gP.m ⁻³)	18.2
Orthophosphate phosphorus (gP.m ⁻³)	1.60
Total iron (gFe.m ⁻³)	1.10
Total suspended solids (gSS.m ⁻³)	1560

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Table 2 – Measured total, filtered and flocculated COD for the 2015data, as well as CODfractions calculated and retained for the 2016/2017 data.

Parameters	COD (g.m ⁻³)	COD ratio
COD	466±42	1
Soluble COD	174±9	0.4
Flocculated COD	122±9	0.26
Readily biodegradable, S _F	60	0.13
Fermentation products, S_A	40	0.09
Inert biodegradable organics, S_{I}	22	0.05
Non-biodegradable organics, X_{I}	61	0.11
Slowly biodegradable substrate, $X_{\rm S}$	245	0.56
Heterotrophic biomass, $X_{\rm H}$	38	0.06
Autotrophic biomass, X_{AUT}	0	0

Table 3 – Average steady-state influent composition of the pilot-scale WWTP used for

influent characterization (2016/2017 data)

Parameters	Measurements
Total COD (gCOD.m ⁻³)	521
Soluble COD (gCOD.m ⁻³)	174
Flocculated COD (gCOD.m ⁻³)	137
BOD ₇ (gCOD.m ⁻³)	234
TN (gN.m ⁻³)	48
Ammoniacal nitrogen NH ₄ (gN.m ⁻³)	37
Nitrate, NO_x (gN.m ⁻³)	0.12
Total phosphorus, Ptot (gP.m ⁻³)	6.23
Orthophosphate phosphorus (gP.m ⁻³)	3.3
Total organic carbon, TOC (g.m ⁻³)	141
Total inorganic carbon, TIC (g.m ⁻³)	75
Total suspended solids, TSS (gTSS.m ⁻³)	249
Volatile suspended solids, VSS (gVSS.m ⁻³)	223
VFA (gCOD.m ⁻³)	40

Table 4 – Average steady-state influent composition of the pilot scale WWTP used for
 influent steady state model validation. COD ratios determined previously was used for the

 influent composition.
 Image: State state

Model influent composition (ASM2d variables)	Values
Dissolved oxygen, S_{O2} (g.m ⁻³)	0
Readily biodegradable, $S_{\rm F}$ (gCOD.m ⁻³)	67
Fermentation products (acetate), S_A (gCOD.m ⁻³)	45
Ammoniacal nitrogen, $S_{\rm NH4}$ (gN.m ⁻³)	37
Nitrate (plus nitrite), S_{NO3} (gN.m ⁻³)	0.12
Phosphate, S_{PO4} (gP.m ⁻³)	3.3
Inorganic carbon, $S_{\rm IC}$ (gC.m ⁻³)	75
Inert biodegradable organics, S_{I} (gCOD.m ⁻³)	25
Inert non-biodegradable organics, X_{I} (gCOD.m ⁻³)	47
Slowly biodegradable substrate, $X_{\rm S}$ (gCOD.m ⁻³)	314
Heterotrophic biomass, $X_{\rm H}$ (gCOD.m ⁻³)	24
Volatile suspended solids, X_{VSS} (g.m ⁻³)	223
Inorganic suspended solids, X_{ISS} (g.m ⁻³)	26





















Research Highlights

- A plant-wide model calibrated against extensive pilot-plant data describing phosphorus (P) dynamics with iron (Fe) dosing
- Good agreement between measured and modelled P (5–10% (relative) difference).
- P concentration strongly depends on pH, Fe/P ratio and influent P load.
- P removal control strategies substantially reduce FeSO₄ dose.
- Model shows aerobic tanks are the most suitable dosing location for $FeSO_4$, due to fast oxidation of Fe^{2+} to Fe^{3+} .