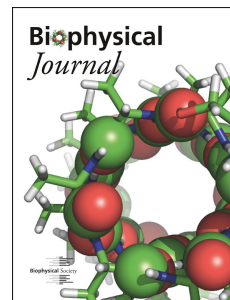


Journal Pre-proof

Hypocalcaemia-Induced Slowing of Human Sinus Node Pacemaking

Axel Loewe, Yannick Lutz, Deborah Nairn, Alan Fabbri, Norbert Nagy, Noemi Toth, Xiaoling Ye, Doris H. Fuertinger, Simonetta Genovesi, Peter Kotanko, Jochen G. Raimann, Stefano Severi



PII: S0006-3495(19)30626-5

DOI: <https://doi.org/10.1016/j.bpj.2019.07.037>

Reference: BPJ 9788

To appear in: *Biophysical Journal*

Received Date: 21 March 2019

Accepted Date: 24 July 2019

Please cite this article as: Loewe A, Lutz Y, Nairn D, Fabbri A, Nagy N, Toth N, Ye X, Fuertinger DH, Genovesi S, Kotanko P, Raimann JG, Severi S, Hypocalcaemia-Induced Slowing of Human Sinus Node Pacemaking, *Biophysical Journal* (2019), doi: <https://doi.org/10.1016/j.bpj.2019.07.037>.

This is a PDF file of an article that has undergone enhancements after acceptance, such as the addition of a cover page and metadata, and formatting for readability, but it is not yet the definitive version of record. This version will undergo additional copyediting, typesetting and review before it is published in its final form, but we are providing this version to give early visibility of the article. Please note that, during the production process, errors may be discovered which could affect the content, and all legal disclaimers that apply to the journal pertain.

© 2019 Biophysical Society.

1 Hypocalcaemia-Induced Slowing of Human Sinus Node Pacemaking

2
3 Axel Loewe^{1*}, Yannick Lutz¹, Deborah Nairn¹, Alan Fabbri^{2,3}, Norbert Nagy⁴, Noemi Toth⁴, Xiaoling Ye⁵, Doris
4 H Fuertinger⁵, Simonetta Genovesi⁶, Peter Kotanko^{5,7}, Jochen G Raimann⁵, Stefano Severi²

5
6 ¹Institute of Biomedical Engineering, Karlsruhe Institute of Technology (KIT), Karlsruhe, Germany

7 ²Department of Electrical, Electronic and Information Engineering “Guglielmo Marconi”, University of
8 Bologna, Cesena, Italy

9 ³Department of Medical Physiology, University Medical Center Utrecht, Utrecht, The Netherlands

10 ⁴Department of Pharmacology and Pharmacotherapy, University of Szeged, Szeged, Hungary

11 ⁵Renal Research Institute, New York City, NY, USA

12 ⁶Department of Medicine and Surgery, Università degli Studi di Milano-Bicocca, Monza, Italy

13 ⁷Icahn School of Medicine at Mount Sinai, New York City, NY, USA

14
15 *Corresponding author: Axel Loewe, Institute of Biomedical Engineering, Karlsruhe Institute of Technology
16 (KIT), Kaiserstr. 12, 76131 Karlsruhe, Germany, publications@ibt.kit.edu

17
18 Running Title: Sinus Node Pacemaking in Hypocalcaemia

19 Abstract

20 Each heartbeat is initiated by cyclic spontaneous depolarization of cardiomyocytes in the sinus node forming the
21 primary natural pacemaker. In patients with end-stage renal disease undergoing hemodialysis, it was lately
22 shown that the heart rate drops to very low values before they suffer from sudden cardiac death with an
23 unexplained high incidence. We hypothesize that the electrolyte changes commonly occurring in these patients
24 affect sinus node beating rate and could be responsible for severe bradycardia. To test this hypothesis, we
25 extended the Fabbri et al. computational model of human sinus node cells to account for the dynamic
26 intracellular balance of ion concentrations. Using this model, we systematically tested the effect of altered
27 extracellular potassium, calcium, and sodium concentrations. While sodium changes had negligible
28 (0.15bpm/mM) and potassium changes mild effects (8bpm/mM), calcium changes markedly affected the beating
29 rate (46bpm/mM ionized calcium without autonomic control). This pronounced bradycardic effect of
30 hypocalcemia was mediated primarily by I_{CaL} attenuation due to reduced driving force particularly during late
31 depolarization. This in turn caused secondary reduction of calcium concentration in the intracellular
32 compartments and subsequent attenuation of inward I_{NaCa} and reduction of intracellular sodium. Our in silico
33 findings are complemented and substantiated by an empirical database study comprising 22,501 pairs of blood
34 samples and in vivo heart rate measurements in hemodialysis patients and healthy individuals. A reduction of
35 extracellular calcium was correlated with a decrease of heartrate by 9.9bpm/mM total serum calcium ($p<0.001$)
36 with intact autonomic control in the cross-sectional population. In conclusion, we present mechanistic in silico
37 and empirical in vivo data supporting the so far neglected but experimentally testable and potentially important
38 mechanism of hypocalcaemia-induced bradycardia and asystole, potentially responsible for the highly increased
39 and so far unexplained risk of sudden cardiac death in the hemodialysis patient population.

40 Statement of Significance

41 We propose a pathomechanism potentially responsible for the >10,000 yearly sudden cardiac deaths in
42 hemodialysis patients. Using a computational model of human sinus node cells, we show how a reduction of
43 extracellular calcium causes severe slowing of spontaneous sinus node beating by attenuation of I_{CaL} , particularly
44 during late diastolic depolarization. Secondary reduction of calcium in the intracellular compartments and
45 subsequent attenuation of inward I_{NaCa} and reduction of intracellular sodium occurs. These findings are
46 substantiated by an in vivo analysis of >22,000 blood samples showing a highly significant bradycardic effect of
47 hypocalcaemia. In conclusion, we present mechanistic in silico and empirical in vivo data supporting the
48 experimentally testable hypothesis of hypocalcaemia-induced bradycardia, potentially responsible for sudden
49 cardiac death in hemodialysis patients.

50 Introduction

51 The heart is driven by regular excitations generated in the sinus node as the natural pacemaker. The spontaneous
52 beating of sinus node myocytes and its rate is governed by a delicate balance of inward and outward
53 transmembrane currents in the diastolic depolarization (DD) phase of the action potential (AP) and the intricate
54 interplay of the calcium and membrane clocks, known as the coupled clock mechanism (1, 2). A key factor
55 affecting sinus node cellular electrophysiology is the extracellular milieu, which is tightly controlled in
56 mammals. Among others, the kidneys play a crucial role in maintaining homeostasis and keeping electrolyte
57 concentrations in the blood and the extracellular milieu within narrow ranges. In end-stage renal disease (ESRD)
58 patients undergoing hemodialysis (HD) however, the renal system fails to maintain electrolyte homeostasis with
59 consequences for several other organ systems including the heart and its electrical conduction system with the
60 sinus node as the intrinsic natural pacemaker. The ESRD population is large with >700,000 patients in Europe
61 alone (3).

62 A particularly severe complication is sudden cardiac death (SCD), which is abnormally frequent in the HD
63 population. Indeed, the SCD-related mortality is increased 14-fold in ESRD patients undergoing HD when
64 compared to subjects with a history of cardiovascular disease and normal kidney function (4). Traditional
65 cardiovascular risk factors do not explain the exceptionally high rate of SCD in HD patients (4, 5). While the
66 most common pathomechanisms underlying SCD in the general population are tachyarrhythmias (ventricular
67 tachycardia, ventricular fibrillation), several independent studies recently indicated that bradycardia and asystole
68 are likely to be the dominant pathomechanisms of SCD in ESRD patients. Wong et al. implanted cardiac
69 monitors in 50 HD patients (6). The monitors could be interrogated in 6 patients who died from SCD in the 18±4
70 months follow-up period. All these patients died from severe bradycardia followed by asystole and none of them
71 showed ventricular tachyarrhythmia before or after bradycardic events (6). All SCDs occurred in the long
72 interdialytic period suggesting a major role for accumulation or depletion of certain substances between dialysis
73 sessions affecting the electrical pacemaking and conduction system of the heart as a key pathomechanism. Up to
74 date, the actual pathomechanism behind the unexplained high rate of SCD in HD patients remains elusive (4, 7)
75 and very recently, unconventional ideas like plastic chemical exposure were put forward (8). Interestingly, the
76 findings by Wong et al. were confirmed and complemented by other studies collectively comprising 317 dialysis
77 patients as recently reviewed (7, 9). These in vivo data indicate that bradycardia and asystole are more frequent
78 than ventricular fibrillation as a cause of SCD in ESRD patients and led us to hypothesize that there is a role of
79 the cardiac pacemaking system and that spontaneous sinus node beating rate in humans is modulated to a degree
80 that could cause severe bradycardia by electrolyte concentration changes in the extracellular space as frequently
81 occurring in ESRD patients on HD.

82 In this study, we test this hypothesis in a computational model based on the Fabbri et al. model of human sinus
83 node cells (10). A computational approach provides controlled conditions and allows to investigate the role of
84 electrolyte changes on cellular sinus node pacemaking in a human setting. This is challenging experimentally as
85 human sinus node cells are very rarely available. Given the vastly different beating rates of commonly used
86 laboratory animals (mouse: 500bpm, rabbit: 300bpm) and humans (60bpm), it cannot be assumed that the
87 delicate balance of competing effects on pacemaking can be transferred from animal models to humans in
88 general and in particular during late DD, which only exists at comparatively low beating rates as typical for
89 humans. Indeed, a computational inter-species analysis revealed fundamental differences regarding the response

90 to extracellular ion concentration changes between human and animal (rabbit, mouse) models with a markedly
91 higher effect in humans (11).
92 Our computational study yields mechanistic insight and an experimentally testable hypothesis regarding the
93 regulation of sinus node pacemaker cell function suggesting a pathomechanism that could be responsible for a
94 large number of sudden bradycardic deaths in ESRD patients. To complement and substantiate our in silico
95 findings, we analyze the statistical in vivo relation between heart rate and blood electrolyte concentration in
96 large HD and cross-sectional populations.

Journal Pre-proof

97 **Materials and Methods**

98 *Model Development and Validation*

99 The intracellular ion concentrations depend on the extracellular milieu, which is tightly controlled under
 100 physiological conditions. Therefore, it is common to consider constant $[K^+]_i$ and $[Na^+]_i$ in cyclic steady-state
 101 simulations, as proposed in the original Fabbri et al. model (10). However, when modeling the effects of altered
 102 extracellular concentrations as occurring in ESRD patients, this assumption is not valid anymore as intracellular
 103 concentrations will respond to changes of the extracellular milieu. Therefore, we extended the original model as
 104 described in detail in (11). In brief, we considered the dynamic balance of intracellular K^+ and Na^+
 105 concentrations as governed by their influx and efflux. Additionally, we added a small conductance calcium-
 106 activated potassium current (I_{SK}) as proposed in (12, 13). Lastly, the formulation of the maximum I_{Kr}
 107 conductivity g_{Kr} was adapted to take the dependency on $[K^+]_o$ into account as described for other
 108 cardiomyocytes (14):

109

$$I_{Kr} = g_{Kr} \cdot \sqrt{\frac{[K^+]_o}{5.4mM}} (V_m - E_K) \cdot (0.9pA + 0.1pA) \cdot \pi y .$$

110

111 A schematic of the updated model is shown in Figure 1. All parameters and initial values of the updated model
 112 are available in (11) together with the unaltered equations of the original model as detailed in (10). AP features
 113 of the updated model (11) were closer to experimental values than those of the original model except for APD,
 114 AP overshoot, and the diastolic depolarization rate during the first 100ms (DDR₁₀₀), which is higher in the
 115 updated model leading to a more pronounced biphasic DD. The resulting model was validated against the same
 116 experimental data as the original model (10). The effect of I_f , I_{Na} , and I_{Ks} mutations was not markedly affected by
 117 the changes to the model. The response to complete I_f block (cycle length +25.9%) was in accordance with the
 118 available experimental human data (+26% (15)). In summary, the updated model exhibits homeostasis of
 119 intracellular ion concentrations across time spans of minutes and thereby puts further physiological constraints
 120 on the free parameters compared to the original version without impairing reproduction of experimental AP and
 121 CaT features.

122

123 *Figure 1: Schematic diagram of the updated human SAN cell model. Compared to the original Fabbri et al. model (10), a*
 124 *small conductance calcium-activated potassium current (I_{SK}) was added and the model took into account the dependency of*
 125 *g_{Kr} on $[K^+]_o$ as well as the dynamic intracellular concentration changes of not only calcium but also sodium and potassium.*
 126 *Details regarding the updated model including the full list of parameters and initial values can be found in (11).*

127 *Simulation Study*

128 Based on a pilot study (16), we performed a simulation study varying the extracellular electrolyte concentrations
 129 in ranges also including the interval observed in HD patients. $[Na^+]_o$ was varied between 120 and 160mM, $[K^+]_o$
 130 between 3 and 9mM, and $[Ca^{2+}]_o$ between 0.8 and 2.9mM. The single cell model was numerically integrated with
 131 MATLAB's (The MathWorks Inc., Natick, MA, USA) variable order stiff ordinary differential equation solver
 132 *ode15s*. Absolute and relative tolerances were set to 1e-6 and the maximum allowed time step for the solver was
 133 1ms. Each setup was run for 100s after which a cyclic steady state was reached (cycle length standard deviation

134 for the last 5 beats < 0.1%). To disentangle the contribution of the 3 currents directly affected by changes of
 135 $[Ca^{2+}]_o$, namely I_{CaL} , I_{CaT} , and I_{NaCa} , we performed additional simulation in which just one of the currents was
 136 exposed to the altered $[Ca^{2+}]_o$ whereas the other two were computed using the reference concentration of 1.8mM.
 137 We evaluated the following AP and CaT features for each of the simulated scenarios: cycle length, AP duration
 138 at 90% repolarization (APD_{90}), maximum diastolic potential (MDP), AP overshoot, DDR_{100} as a first order
 139 approximation of the DD rate during the first 100ms, maximum AP upstroke velocity dV/dt_{max} , $t_{takeoff}$ and $V_{takeoff}$
 140 at AP takeoff identified as the first time step after $t_{MDP} + 100ms$ for which $d^2V/dt^2 > 1000mV/s^2$, CaT duration
 141 at 50% (CaTD50), and CaT amplitude. To study the contribution of individual currents in the different temporal
 142 phases of DD, we split this phase into early DD (first 100ms after t_{MDP}) and late DD (the remainder). Moreover,
 143 we linearly extrapolated the effect of the first 100ms of DD onto the whole DD phase:

$$t_{dia,100} = \frac{V_{takeoff} - MDP}{DDR_{100}},$$

144 and defined $t_{dia,late}$ as the remaining DD not captured by this first order approximation based on the first 100ms:

$$t_{dia,late} = t_{takeoff} - t_{dia,100}.$$

145 *Retrospective Analysis of Clinical Data*

146 To identify the in vivo relationship between heart rate and blood electrolyte concentrations, two large HD and
 147 cross-sectional populations were used. Our analysis included 741 HD patients over 4391 observations receiving
 148 chronic maintenance HD treatment for at least 3 months but not longer than one year. Patients that had 4 or more
 149 calcium and potassium measurement accompanied with an assessment of predialysis heart rate were included in
 150 the analysis. The longitudinal association was quantified using a linear mixed effects model with the additional
 151 random effect of considering the time from the first dialysis. The Western IRB determined this study in HD
 152 patients as exempt and in compliance with the Health Insurance Portability and Accountability Act of 1996
 153 (HIPAA). As an independent second population, 18,141 individuals were assessed from the 2011-2016 National
 154 Health and Nutrition Examination Survey (NHANES) US cross-sectional database (15). Appropriate sample
 155 weights were used to ensure the results are representative for the US population as a whole. In comparison to the
 156 HD patients, the NHANES study did not contain a longitudinal aspect. Therefore, a linear regression model was
 157 used. Additionally, both datasets were split into three age categories: younger than 50 years, between 50 and 69
 158 years and 70 years or older and analysis was done per sex. Statistical significance was assessed by Student's t-
 159 test after checking for normal distributions. All results are given as mean \pm standard deviation.

160 Results

161 Hypocalcaemia Severely Slows Pacemaking in silico

162

163 *Figure 2: Action potential (A) and calcium transient (B) of the reference model (blue), as well as hypokalemic (red) and*
 164 *hypocalcaemic (yellow) setups.*

165

166 *Figure 3: Action potential (AP) and calcium transient (CaT) feature dependency on extracellular calcium concentration*
 167 *$[Ca^{2+}]_o$. (A) cycle length of spontaneous sinus node cell beating, (B) AP duration at 90% repolarization, (C) maximum*
 168 *diastolic potential, (D) AP overshoot, (E) diastolic depolarization rate during the first 100ms after MDP, (F) AP upstroke*
 169 *velocity, (G) CaT duration at 50%, (H) CaT amplitude. The thick blue line represents the scenario in which all currents were*
 170 *exposed to the altered $[Ca^{2+}]_o$ whereas the thin lines represent scenarios in which only one current was exposed to the*
 171 *altered concentration while the other two were computed with 1.8mM.*

172 The spontaneous beating cycle length of the human sinus node cell model as well as AP and CaT morphology
 173 changed when varying extracellular calcium and potassium concentrations (

174 Figure 2). The cycle length showed a pronounced inverse relation with the extracellular calcium concentration
 175 $[Ca^{2+}]_o$. The super-linear course, particularly for low $[Ca^{2+}]_o$, led to cycle lengths up to 2300ms at 0.8mM, i.e.,
 176 beating rates down to 26bpm (Figure 3A). APD₉₀ was shortened by both hyper- and hypocalcaemia, however by
 177 less than 8ms (Figure 3B) similar to AP overshoot (Figure 3D) and dV/dt_{max} (Figure 3F). MDP showed a
 178 monotonic relation with a maximum reduction of 1.2mV at 0.8mM $[Ca^{2+}]_o$ (Figure 3C) similar to DDR₁₀₀, which
 179 was slowed by a maximum of 20mV/s at 0.8mM compared to 1.8mM $[Ca^{2+}]_o$ (Figure 3E). CaTD was longer and
 180 CaT amplitude smaller for lower $[Ca^{2+}]_o$ (Figure 3F+G).

181 The marked hypocalcaemia-induced increase in CL by up to 1472ms (Figure 4A), was only to a minor degree
 182 caused by changes in MDP, DDR₁₀₀, and $V_{takeoff}$ (Figure 4D) as quantified by $t_{dia,100}$ (up to 203ms, Figure 4B).
 183 The strongest driver of CL increase at low $[Ca^{2+}]_o$ was prolonged late DD, i.e. slowed DDR after the first 100ms
 184 (Figure 4C). APD₉₀ changes (up to -8ms) mildly attenuated the hypocalcaemia-induced CL increase.

185 Changes of $[K^+]_o$ affected spontaneous beating rate and AP morphology to a smaller degree than $[Ca^{2+}]_o$ changes.
 186 Hyperkalemia led to a mild decrease of CL up to -225ms at 8.8mM compared to 5.4mM (Figure 5A). The
 187 tachycardic effect of hyperkalemia was mainly caused by faster late DD (Figure 5C) and to a lesser degree by
 188 early DD (Figure 5B) and APD shortening whereas the takeoff potential was unaffected (Figure 5D).

189 Varying the extracellular sodium concentration had a minor effect on the spontaneous beating of the human
 190 sinus node cell model. Cycle length increased by only 3.9% when decreasing $[Na^+]_o$ from 140 to 120mM and
 191 decreased by 3.9% when increasing $[Na^+]_o$ from 140 to 160mM. Other AP features were hardly affected as well
 192 (maximum changes of 2.6mV for overshoot, 0.18mV for MDP, 7ms for APD₉₀, 2.2mV/ms for DDR₁₀₀).

193

194 *Figure 4: Changes of action potential characteristics upon changes of extracellular calcium concentration $[Ca^{2+}]_o$. (A) cycle*
 195 *length of spontaneous sinus node cell beating, (B) first order approximation of diastolic depolarization time based on the*
 196 *first 100ms including effects of MDP, DDR₁₀₀, and the takeoff potential, (C) diastolic depolarization time change not covered*
 197 *by the first order approximation $t_{dia,100}$, (D) action potential takeoff potential. The thick blue line represents the scenario in*
 198 *which all currents were exposed to the altered $[Ca^{2+}]_o$ whereas the thin lines represent scenarios in which only one current*
 199 *was exposed to the altered concentration while the other two were computed with 1.8mM.*

200

201 *Figure 5: Changes of action potential characteristics upon changes of extracellular potassium concentration $[K^+]_o$. (A) cycle*
 202 *length of spontaneous sinus node cell beating, (B) first order approximation of diastolic depolarization time based on the*

203 *first 100ms including effects of MDP, DDR_{100} , and the takeoff potential, (C) diastolic depolarization time change not covered*
 204 *by the first order approximation $t_{dia,100}$, (D) action potential takeoff potential.*

205 *Attenuated Late Diastolic I_{CaL} and Secondary Attenuation of I_{NaCa} are the Drivers of*
 206 *Hypocalcaemia-Induced Cycle Length Prolongation*

207 To quantify the net effect of altered $[Ca^{2+}]_o$ on DD, we analyzed temporal means of currents for i) the entire DD
 208 (t_{MDP} to $t_{takeoff}$), ii) early DD (t_{MDP} to $t_{MDP+100ms}$), and iii) late DD ($t_{MDP+100ms}$ to $t_{takeoff}$) (Figure 6). We observed an
 209 almost linear inverse relation between diastolic total transmembrane current I_{tot} and reduction of $[Ca^{2+}]_o$ (Figure
 210 6Ai), particularly during late DD (Figure 6Aiii). The strongest contributors to this effect were I_{NaCa} (Figure 6Bi)
 211 and I_{CaT} (Figure 6Ci) as reduced inward currents, the latter particularly during early DD. Decreased outward
 212 currents I_{Kr} and I_{NaK} (Figure 6Di) and to a smaller extent I_{SK} (Figure 6Ei) partly counterbalanced the reduced
 213 influx.

214 By exposing only a single current of the three that are directly affected by changes of $[Ca^{2+}]_o$ (I_{CaL} , I_{CaT} , and
 215 I_{NaCa}) to the altered extracellular calcium concentration, I_{CaL} could be identified as the primary driver of
 216 hypocalcaemia-induced CL prolongation (red lines in Figure 3 & Figure 4, dashed lines in Figure 6 & Figure 7).
 217 Even if I_{CaT} and I_{NaCa} still experienced the reference $[Ca^{2+}]_o$ of 1.8mM, the bradycardic effect of hypocalcaemia
 218 was retained almost completely (prolongation by 1261ms vs. 1472ms at 0.8mM, Figure 4A). The contribution of
 219 I_{CaT} during early DD (Figure 6Aii+Cii) had only a markedly smaller effect on CL (prolongation by 83ms at
 220 0.8mM, Figure 4A).

221 The mechanism by which I_{CaL} markedly prolonged CL under hypocalcaemic conditions could be identified as
 222 the following: Lower $[Ca^{2+}]_o$ sustainably reduced the I_{CaL} driving force (up to twofold) and therefore its
 223 amplitude during late DD where it is active (Figure 6Biii). The smaller calcium influx into the intracellular and
 224 subsarcolemmal space over time led to lower concentrations there (Figure 7C+D) and also in the sarcoplasmic
 225 reticulum compartments (Figure 7E+F). In turn, I_{NaCa} became smaller (Figure 6B), which led to a $[Na^+]_i$ decrease
 226 (Figure 7B) ending up in a new cyclic steady state. The intracellular potassium concentration was not markedly
 227 affected by changes of $[Ca^{2+}]_o$ (Figure 7A).

228
 229 *Figure 6: Changes of ionic current and flux mean values during diastolic depolarization upon changes of extracellular*
 230 *calcium concentration $[Ca^{2+}]_o$. (i) mean over entire diastolic depolarization phase, (ii) mean over first 100ms of diastolic*
 231 *depolarization, (iii) mean over the late depolarization phase (excluding the first 100ms). The solid lines represent the*
 232 *scenario in which all currents were exposed to the altered $[Ca^{2+}]_o$, whereas the dashed lines represent scenarios in which*
 233 *only I_{CaL} was exposed to the altered concentration while the other two (I_{CaT} , I_{NaCa}) were computed with 1.8mM.*

234
 235 *Figure 7: Changes of ionic concentrations during diastolic depolarization upon changes of extracellular calcium*
 236 *concentration $[Ca^{2+}]_o$. (i) maximum and minimum concentrations over entire diastolic depolarization phase, (ii) maximum*
 237 *and minimum concentrations over first 100ms of diastolic depolarization, (iii) maximum and minimum concentrations over*
 238 *the late depolarization phase (excluding the first 100ms). The solid lines represent the scenario in which all currents were*
 239 *exposed to the altered $[Ca^{2+}]_o$, whereas the dashed lines represent scenarios in which only I_{CaL} was exposed to the altered*
 240 *concentration while the other two (I_{CaT} , I_{NaCa}) were computed with 1.8mM.*

241 *Hypocalcaemia is Correlated with Lower Heart Rate in vivo*242 *Table 1: Characteristics of the two populations used to study the empirical in vivo correlation between electrolyte*
243 *concentrations and heart rate.*

	number of individuals (observations)	% male	age (years)	heart rate (bpm)	total serum calcium (mM)	serum potassium (mM)
Dialysis	741 (4391)	59	63.9 ± 15.73	77.91 ± 11.29	2.22 ± 0.15	4.64 ± 0.54
< 50	138 (815)	60	38.63 ± 9.23	84.46 ± 10.05	2.20 ± 0.16	4.75 ± 0.55
50 - 69	341 (2038)	63	61.02 ± 5.77	78.11 ± 10.65	2.22 ± 0.15	4.67 ± 0.58
≥ 70	262 (1538)	52	78.97 ± 6.17	74.19 ± 11.12	2.25 ± 0.13	4.53 ± 0.47
male	436 (2594)	100	62.30 ± 16.01	78.21 ± 11.17	2.21 ± 0.15	4.67 ± 0.55
female	305 (1797)	0	64.47 ± 15.24	77.48 ± 11.46	2.25 ± 0.14	4.59 ± 0.54
NHANES	18141	49	43.01 ± 20.57	73.34 ± 11.96	2.36 ± 0.09	3.97 ± 0.34
< 50	10918	49	28.70 ± 11.39	74.78 ± 11.79	2.36 ± 0.09	3.94 ± 0.31
50 to 69	4917	49	59.21 ± 5.64	71.86 ± 11.94	2.35 ± 0.09	3.99 ± 0.38
≥ 70	2306	49	76.20 ± 3.73	69.62 ± 11.61	2.35 ± 0.10	4.10 ± 0.41
male	8915	100	42.79 ± 20.73	71.75 ± 12.00	2.36 ± 0.09	4.03 ± 0.34
female	9226	0	43.22 ± 20.40	74.87 ± 11.71	2.35 ± 0.09	3.92 ± 0.34

244

245 As an initial validation step, we studied the empirical in vivo correlation between blood electrolyte
246 concentrations and heart rate in two large independent populations (baseline characteristics given in Table 1).

247 Compared to the in silico single cell experiments, one would expect marked attenuation of the hypocalcaemic

248 effect by an intact autonomic nervous system comprising a control loop for heart rate. Indeed, we found

249 statistically highly significant evidence of an inverse relation between total serum Ca and heart rate (Figure 8) in

250 both populations. In HD patients, the effect became more pronounced with age with no significant correlation for

251 patients younger than 50 years, 5.35 ± 1.83 bpm/mM total Ca for 50-70 years ($p < 0.005$), and 6.32 ± 2.29 bpm/mM

252 total Ca for individuals of age > 70 years ($p < 0.01$). This age dependency was not seen in the NHANES

253 individuals, which overall had a good renal clearance (eGFR (17) 102.1 ± 28.5 ml/min/1.73m²; < 15 ml/min/1.73m²

254 in only 0.29% of individuals). The strength of the linear dependency of total serum calcium and heart rate was

255 more pronounced in the NHANES data across age groups: < 50 years (9.63 ± 1.30 bpm/mM total Ca, $p < 0.001$), 50-

256 70 years (8.75 ± 1.99 bpm/mM total Ca, $p < 0.001$), and > 70 years (9.94 ± 2.42 bpm/mM total Ca, $p < 0.001$).

257 Potassium on the other hand had a similar inverse correlation to heart rate for all age groups in the HD

258 population: < 50 years (-2.09 ± 0.66 bpm/mM K, $p < 0.005$), 50-70 years (-1.55 ± 0.42 bpm/mM K, $p < 0.001$), and > 70

259 years (-1.73 ± 0.54 bpm/mM K, $p < 0.005$). The effect was similar in the NHANES individuals with only a lower

260 significance in the age group 50-70 years.

261 The bradycardic effect of hypocalcaemia was markedly stronger in males with a factor of approximately 2
262 between the results for males and females seen in both the NHANES and HD populations. $[K^+]_o$ had a significant
263 inverse correlation with HR in both sexes.

264

265 *Figure 8: Forest plot of linear dependency between total serum calcium (blue) and potassium (red) concentrations and in*
266 *vivo heart rate. Data from a linear mixed effects model of 741 hemodialysis patients (4391 observations) are indicated by*
267 *squares, circles represent a linear regression of 18145 individuals from the NHANES cross-sectional study representative of*
268 *the US population.*

269

270 *Figure 9: Histogram of heart rate (A), total serum calcium (B), and serum potassium (C) distributions in the NHANES and*
271 *hemodialysis populations.*

Journal Pre-proof

Discussion

In this study, we tested the hypothesis that human sinus node cellular spontaneous beating rate is affected by changes in extracellular ion concentrations as occurring in ESRD patients undergoing HD. Using a computational model, we show that hypocalcaemia has a pronounced bradycardic effect in isolated human sinus node cells with healthy electrophysiology. The beating rate was reduced by 46bpm when reducing extracellular ionized calcium concentration $[Ca^{2+}]_o$ by 1mM from the in vitro (and in silico) reference value of 1.8mM. The beating rate sensitivity to changes in $[K^+]_o$ (hypokalemia) was 4.1x smaller than that due to changes in $[Ca^{2+}]_o$ (hypocalcaemia). Moreover, as beating rate acceleration was observed for hyperkalemia, $[K^+]_o$ changes are unlikely to contribute to the high risk of severe bradycardia towards the end of the interdialytic period during which potassium is accumulated rather than depleted in HD patients.

By leveraging the advantages of a computational approach, we could dissect the following mechanism underlying the pronounced bradycardic effect of reduced $[Ca^{2+}]_o$: primarily I_{CaL} is attenuated because of reduced driving force particularly during late depolarization, which causes a secondary reduction of calcium concentration in the intracellular compartments and subsequent attenuation of I_{NaCa} also being a diastolic inward current, thus causing further slowing of DD. The net bradycardic effect is the result of a delicate balance of inward and outward currents during DD and changes thereof. While the DD integral of individual currents showed changes of up to 10nA*ms upon changes of $[Ca^{2+}]_o$, they were partly counterbalanced by other changes yielding a net effect on the DD integral of only 1.2nA*ms. The slowing of spontaneous beating induced by hypocalcaemia was predominantly due to changes of late DD: only 14% of the CL increase observed at the lowest $[Ca^{2+}]_o$ could be attributed to changes of MDP, DDR_{100} and $V_{takeoff}$. The fact that 83% of this CL increase were retained when only I_{CaL} was affected by the change of $[Ca^{2+}]_o$ highlights the key role of late diastolic I_{CaL} in hypocalcaemia-induced slowing of sinus node pacemaking.

While we further constrained the human sinus node cell model by posing the physiological constraint of homeostasis, there still is a degree of uncertainty due to sparse experimental data. Therefore, experimental validation of our in silico derived hypothesis is desirable. However, such experiments would need to be performed using human sinus node cells because of crucial inter-species differences in the response of sinus node cells to changes of $[Ca^{2+}]_o$ (11). We could show that rabbit experimental data matches well with rabbit model predictions of the effect of hypocalcaemia both qualitatively and quantitatively but the effect is less pronounced by a factor of ≈ 10 compared to human sinus node cells (11). Considering that the bradycardic effect of hypocalcaemia observed here was mainly due to changes in late DD (beyond 100ms), the inter-species differences are little surprising given that this phase is not present in species with high baseline heart rate as typical for common laboratory animals. The effect on early depolarization was comparable across species (11).

Therefore, we decided to substantiate and complement our in silico findings by studying the empirical correlation between heart rate and serum total calcium in two large populations. We found statistically highly significant correlations in both the HD as well as the NHANES populations in qualitative agreement with the model predictions for calcium but not potassium. The mismatch for potassium might indicate that the square root formulation underestimates the degree of modulation of g_{Kr} by $[K^+]_o$ and could imply that hyperkalemic conditions as typical for the later interdialytic period exacerbate the bradycardic effect of hypocalcaemia. The bradycardic effect of hypocalcaemia was increasingly stronger with higher age for the HD population, which could be an indication of a gradual loss of function of the autonomic control of heart rate with age in this population experiencing chronic sympathetic over-activity driven by afferent sensory renal nerves stimulated by

313 renal injury (4, 18). Surprisingly, the effect was stronger in the healthier NHANES population than in the HD
314 population. A potential reason could be the smaller magnitude of calcium excursion and therefore also heart rate
315 in the healthier NHANES population (Figure 9), which might not cause immediate counteraction by the
316 autonomic nervous system. To quantitatively relate these *in vivo* results with the cellular *in silico* results, the
317 relation between $[Ca^{2+}]_o$ and total serum calcium is important. The distribution of free cations in the vascular, i.e.
318 serum, and interstitial, i.e. extracellular, compartments has been reported to agree with Donnan theory predicting
319 a ratio of 0.98 (19). Moreover, around 45% of the total serum calcium is free ionized calcium whereas the rest is
320 complexed or bound. Taken together, this yields a factor of ≈ 2.27 . Thus, the overall linear effect in the
321 NHANES population of 9.9bpm/mM total calcium relates to an effect of ≈ 21.56 bpm/mM $[Ca^{2+}]_o$. This *in vivo*
322 effect is about half as strong as the observed *in silico* effect, whose linear regression would likely be smaller than
323 the factual value of 46bpm/mM $[Ca^{2+}]_o$ assuming sampling of the super-linear course centered around the
324 reference value. However, it may not be forgotten that the empirical data were acquired *in vivo*, i.e. in a setting
325 where the heart rate is tightly controlled through various feedback loops via the autonomic nervous system,
326 which should to a high degree compensate changes of basal cellular beating rate caused by changes of $[Ca^{2+}]_o$.
327 Considering this, it rather seems surprising that the *in vivo* effect is not even smaller.

328 Our study presents a potential mechanism contributing to SCD in ESRD patients: While in a subject with normal
329 renal function calcium concentrations are generally stable, the course of calcium during the interdialytic period is
330 highly variable and HD patients may experience relevant changes in serum calcium levels during the dialysis
331 session. In particular, significant intradialytic reductions in calcium levels can occur if low calcium dialysis
332 baths (e.g. 1.25mM) are used. Dialysates with low Ca^{2+} concentrations are also associated with a higher risk of
333 intra-dialysis sudden cardiac arrest (20). The patients developing hypocalcemia over the course of the
334 interdialytic days will experience a lower basal sinus node beating rate, which will normally be counterbalanced
335 by an increase in sympathetic tone. However, a sudden loss of sympathetic tone as systematically observed in
336 mouse models of ESRD (21) will unmask the lower basal sinus node beating rate, similar to those resulting from
337 simulations not taking into account autonomic control, and cause extreme bradycardia and eventually asystole
338 within seconds to minutes as reported for bradycardic sudden death in HD patients (22) if secondary pacemakers
339 cannot take over.

340 This hypothesis is in line with a recent epidemiological study comprising 28,471 dialysis patients (23) showing
341 that ESRD patients on HD have an almost 6x increased incidence of requiring pacemaker insertion compared to
342 matched patients with normal kidney function. Of note, all of the 4 patients suffering SCD in the study by Sacher
343 et al. (22) had a preserved ejection fraction, suggesting that the fatal arrhythmia was not due to an underlying
344 severe heart disease. Moreover, all of them had a record of diabetes mellitus, which is associated with autonomic
345 neuropathy, compared to only 55% of those patients alive at the end of the follow-up period. If the crucial role of
346 hypocalcaemia is confirmed, continuous non-invasive remote monitoring of the blood calcium level using ECG-
347 derived features (24, 25) could help to reduce the SCD incidence. In addition, one could envision to explore
348 ways to pharmacologically modulate I_{CaL} in order to reduce dependence on $[Ca^{2+}]_o$, thus yielding a more robust
349 pacemaking behavior over a wider range of extracellular calcium concentrations including hypocalcaemic
350 conditions. In this context, the role of calcium channel blockers that are widely used in ESRD patients and affect
351 myocytes as well as blood vessels should be investigated in light of our hypothesis. In particular, the non-
352 dihydropyridine type blockers that bind preferentially to L type channels in the cardiac muscles appear
353 interesting and a negative chronotropic effect in line with our findings has been reported (26).

354 *Limitations*

355 Several limitations pertain to this study: i) The in silico reference concentrations reflect standard in vitro
356 conditions but not physiological in vivo concentrations. In particular, ionized calcium has been reported to vary
357 in the range 0.9 to 1.6 mM in HD patients (27). The historical reasons and potential implications of this
358 mismatch for calcium were discussed by Severi et al. (28). For the study presented here, one should refrain from
359 taking absolute calcium concentrations into consideration and rather interpret the results in terms of
360 concentration changes. Interestingly, the sensitivity of beating rate to calcium changes (slope of the curve in
361 Figure 4A) becomes steeper in a physiological or para-physiological range ($[Ca^{2+}]_o < 1.5\text{mM}$), and even more in
362 conditions of pronounced hypocalcaemia. ii) The uremic milieu in HD patients has been shown to affect cellular
363 electrophysiology as reviewed in (7). These changes have not been taken into consideration here as it is not clear
364 how they pertain to sinus node cardiomyocytes. Also, we did not consider changes of ion channel properties due
365 to changes of surface charge related to varying $[Ca^{2+}]_o$ (29, 30). iii) Spontaneous cellular pacemaking is a
366 necessary but not sufficient condition for the initiation of a heartbeat. In addition, the ensemble of sinus node
367 cells needs to drive the surrounding working myocardium, which captures the excitation. This aspect will be
368 considered in future work based on a preliminary study (31). iv) The role of the autonomic nervous system has
369 not been considered. While the Fabbri et al. model features sympathetic stimulation, it is only available as a
370 binary on/off switch and beyond the scope of this study. Future work will extend the model to allow for a
371 gradual sympathetic response allowing to assess how intact autonomic control could compensate for
372 hypocalcaemia-induced lower basal beating rate. v) This study is based on the Fabbri et al. model of a human
373 sinus node cell (10). Inherent sinus node heterogeneity and variability has not been considered here and is
374 currently limited by the amount of available experimental recordings. Nevertheless, a population of models
375 approach (32) appears desirable for the future. vi) Sympathetic hyperactivity is a frequent phenomenon in ESRD
376 patients (18) and future studies should extend the statistical analysis to co-morbidities that are associated with
377 autonomic neuropathy to consider these potential additional confounding factors beyond age.

378 **Conclusion**

379 We derived an experimentally testable hypothesis of a pathomechanism underlying the high rate of sudden
380 bradycardic deaths in HD patients. Our computational study suggests that a reduction of extracellular calcium
381 concentration slows down cellular sinus node pacemaking severely by attenuation of I_{CaL} and secondary of I_{NaCa}
382 during late DD. While normally compensated by a higher sympathetic tone, a sudden loss of sympathetic tone
383 could unmask the low basal sinus node beating rate under hypocalcaemic conditions and cause extreme
384 bradycardia. The combination of these two mechanisms (sudden loss of sympathetic tone under hypocalcaemic
385 conditions) could cause bradycardic SCD and contribute to the high prevalence of SCD in HD patients. The
386 mechanistic in silico study is complemented with an in vivo analysis comprising >20,000 observations, which
387 supports the computational findings. Our results could be a crucial first step to elucidate the pathomechanism
388 behind the unexplained high rate of SCD in HD patients and help to reduce its incidence eventually.

389 Author Contributions

390 AL and SS conceived the presented idea; AL, SS, DHF, PK, JGR, AV designed the experiments; YL, NN, NT,
391 DN, XY, JGR, AL performed the experiments and analyzed the results; AL, YL, DN, NN, AF, PK, SG, JGR, SS
392 contributed to the interpretation of the results; AL, YL, DN drafted the manuscript; all authors provided critical
393 feedback, contributed to, and approved of the final manuscript.

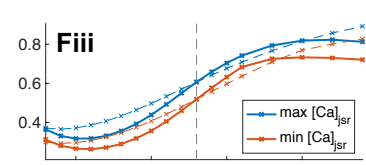
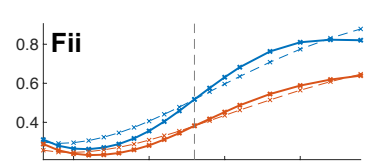
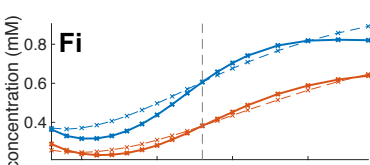
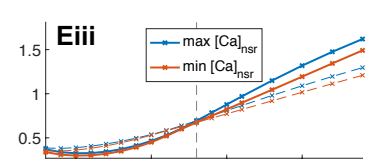
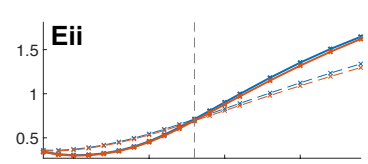
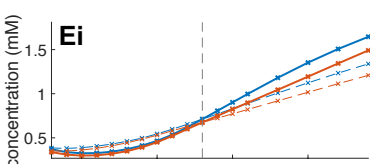
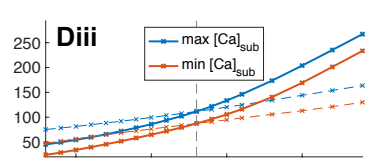
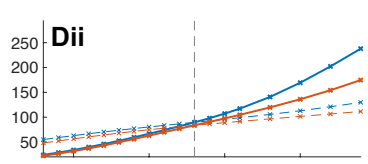
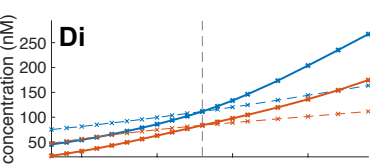
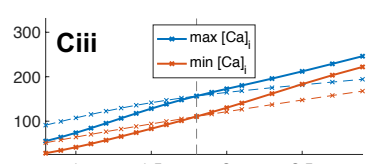
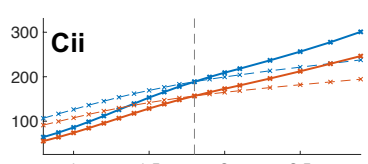
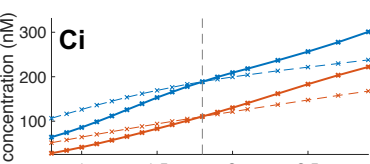
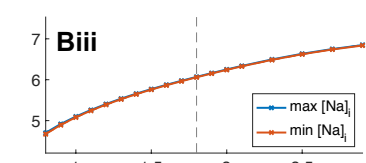
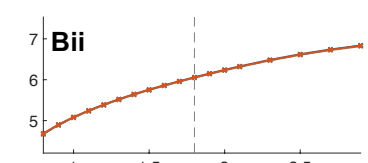
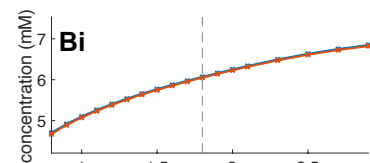
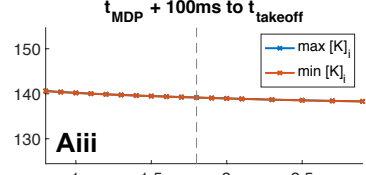
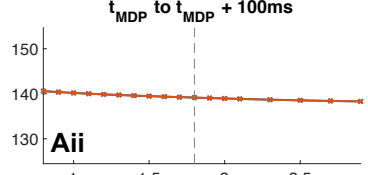
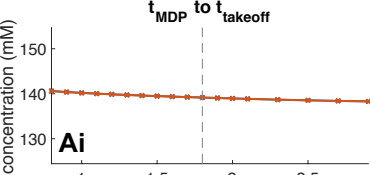
394 Acknowledgments

395 PK, XY, JGR are employees of the Renal Research Institute, a wholly owned subsidiary of Fresenius Medical
396 Care (FMC). DHF is an employee of FMC. PK holds stock in FMC and receives author honoraria from
397 UpToDate. All other authors declare that there are no conflicts of interest. AL gratefully acknowledges financial
398 support by the Ministerium für Wissenschaft, Forschung und Kunst Baden-Württemberg through the Research
399 Seed Capital (RiSC) program and by the Deutsche Forschungsgemeinschaft (DFG, German Research
400 Foundation) – Project-ID 258734477 – SFB 1173 and through grant LO 2093/1-1. NN acknowledges support by
401 the National Research Development and Innovation Office (NKFIH PD-125402 and FK-129117).

402 **References**

- 403 1. Yaniv, Y., E.G. Lakatta, and V.A. Maltsev. 2015. From two competing oscillators to one coupled-clock
404 pacemaker cell system. *Front. Physiol.* 6: 28.
- 405 2. Tsutsui, K., O. Monfredi, S. Sirenko, R. Bychkov, L.A. Maltseva, M.S. Kim, B.D. Ziman, K. V.
406 Tarasov, M. Wang, A. V. Maltsev, J.A. Brennan, I.R. Efimov, M.D. Stern, V.A. Maltsev, and E.G.
407 Lakatta. 2018. Self-Organization of Functional Coupling between Membrane and Calcium Clock in
408 Arrested Human Sinoatrial Nodal Cells in Response to Camp. In: *Biophysical Journal*. Elsevier. p. 622a.
- 409 3. Hill, N.R., S.T. Fatoba, J.L. Oke, J.A. Hirst, C.A. O'callaghan, D.S. Lasserson, and F.D.R. Hobbs. 2016.
410 Global Prevalence of Chronic Kidney Disease-A Systematic Review and Meta-Analysis. .
- 411 4. Di Lullo, L., R. Rivera, V. Barbera, A. Bellasi, M. Cozzolino, D. Russo, A. De Pascalis, D. Banerjee, F.
412 Floccari, and C. Ronco. 2016. Sudden cardiac death and chronic kidney disease: From pathophysiology
413 to treatment strategies. *Int. J. Cardiol.* 217: 16–27.
- 414 5. Makar, M.S., and P.H. Pun. 2017. Sudden Cardiac Death Among Hemodialysis Patients. *Am. J. Kidney*
415 *Dis.* 69: 684–695.
- 416 6. Wong, M.C.G., J.M. Kalman, E. Pedagogos, N. Toussaint, J.K. Vohra, P.B. Sparks, P. Sanders, P.M.
417 Kistler, K. Halloran, G. Lee, S.A. Joseph, and J.B. Morton. 2015. Temporal distribution of arrhythmic
418 events in chronic kidney disease: Highest incidence in the long interdialytic period. *Heart Rhythm.* 12:
419 2047–2055.
- 420 7. Poulikakos, D., K. Hnatkova, S. Skampardon, D. Green, P. Kalra, and M. Malik. 2019. Sudden Cardiac
421 Death in Dialysis: Arrhythmic Mechanisms and the Value of Non-invasive Electrophysiology. *Front.*
422 *Physiol.* 10.
- 423 8. Tereshchenko, L.G., and N.G. Posnack. 2019. Does plastic chemical exposure contribute to sudden death
424 of patients on dialysis? *Heart Rhythm.* 16: 312–317.
- 425 9. Kalra, P.A., D. Green, and D. Poulikakos. 2018. Arrhythmia in hemodialysis patients and its relation to
426 sudden death. *Kidney Int.* 93: 781–783.
- 427 10. Fabbri, A., M. Fantini, R. Wilders, and S. Severi. 2017. Computational analysis of the human sinus node
428 action potential: model development and effects of mutations. *J. Physiol.* 7: 2365–2396.
- 429 11. Loewe, A., Y. Lutz, N. Nagy, A. Fabbri, C. Schweda, A. Varró, and S. Severi. 2019. Inter-Species
430 Differences in the Response of Sinus Node Cellular Pacemaking to Changes of Extracellular Calcium.
431 In: *IEEE International Engineering in Medicine and Biology Conference (EMBC)*. Berlin: .
- 432 12. Kennedy, M., D.M. Bers, N. Chiamvimonvat, and D. Sato. Dynamical effects of calcium-sensitive
433 potassium currents on voltage and calcium alternans. *J. Physiol.* 595: 2285–2297.
- 434 13. Fabbri, A., M. Paci, J. Hyttinen, R. Wilders, and S. Severi. Effects of the Small Conductance Calcium-
435 Activated Potassium Current (IsK) in Human Sinoatrial Node. 2017 *Comput. Cardiol. Conf.* 44.
- 436 14. Severi, S., D. Pogliani, G. Fantini, P. Fabbri, M.R. Viganò, E. Galbiati, G. Bonforte, A. Vincenti, A.
437 Stella, and S. Genovesi. 2010. Alterations of atrial electrophysiology induced by electrolyte variations:
438 Combined computational and P-wave analysis. *Europace.* 12: 842–849.
- 439 15. Verkerk, A.O., R. Wilders, M.M.G.J. van Borren, R.J.G. Peters, E. Broekhuis, K. Lam, R. Coronel,
440 J.M.T. de Bakker, and H.L. Tan. Pacemaker current I(f) in the human sinoatrial node. *Eur. Heart J.* 28:
441 2472–2478.
- 442 16. Loewe, A., Y. Lutz, A. Fabbri, and S. Severi. 2018. Severe sinus bradycardia due to electrolyte changes
443 as a pathomechanism of sudden cardiac death in chronic kidney disease patients undergoing
444 hemodialysis. *Heart Rhythm.* 15: S354–S355.
- 445 17. Inker, L.A., C.H. Schmid, H. Tighiouart, J.H. Eckfeldt, H.I. Feldman, T. Greene, J.W. Kusek, J. Manzi,
446 F. Van Lente, Y.L. Zhang, J. Coresh, and A.S. Levey. 2012. Estimating Glomerular Filtration Rate from
447 Serum Creatinine and Cystatin C. *N. Engl. J. Med.* 367: 20–29.
- 448 18. Kotanko, P. 2006. Cause and Consequences of Sympathetic Hyperactivity in Chronic Kidney Disease.
449 *Blood Purif.* 24: 95–99.
- 450 19. Gilányi, M., C. Ikrényi, J. Fekete, K. Ikrényi, and G. Kovách. 1988. Ion concentrations in subcutaneous
451 interstitial fluid: measured versus expected values. *Am. J. Physiol.* 255: F513–F519.
- 452 20. Pun, P.H., J.R. Horton, and J.P. Middleton. 2013. Dialysate Calcium Concentration and the Risk of
453 Sudden Cardiac Arrest in Hemodialysis Patients. *Clin. J. Am. Soc. Nephrol.* 8: 797–803.
- 454 21. Zhao, Y., N.X. Chen, J.T. Shirazi, C. Shen, S.-F. Lin, M.C. Fishbein, S.M. Moe, and P.-S. Chen. 2016.
455 Subcutaneous nerve activity and mechanisms of sudden death in a rat model of chronic kidney disease.
456 *Heart Rhythm.* 13: 1105–12.
- 457 22. Sacher, F., L. Jesel, C. Borni-Duval, V. De Precigout, F. Lavainne, J.-P. Bourdenx, A. Haddj-Elmrabet,
458 B. Seigneuric, A. Keller, J. Ott, H. Savel, Y. Delmas, D. Bazin-kara, N. Klotz, S. Ploux, S. Buffler, P.
459 Ritter, V. Rondeau, P. Bordachar, C. Martin, A. Deplagne, S. Reuter, M. Haissaguerre, J.-B. Gourraud,
460 C. Vigneau, P. Mabo, P. Maury, T. Hannedouche, A. Benard, and C. Combe. 2017. Cardiac Rhythm
461 Disturbances in Hemodialysis Patients. *JACC Clin. Electrophysiol.* .
- 462 23. Wang, I.-K., K.-H. Lin, S.-Y. Lin, C.-L. Lin, C.-T. Chang, T.-H. Yen, and F.-C. Sung. 2016. Permanent

- 463 cardiac pacing in patients with end-stage renal disease undergoing dialysis. *Nephrol. Dial. Transplant.*
464 31: 2115–2122.
- 465 24. Pilia, N., O. Dössel, G. Lenis, and A. Loewe. 2017. ECG as a Tool to Estimate Potassium and Calcium
466 Concentrations in the Extracellular Space. *Comput. Cardiol.* 44.
- 467 25. Corsi, C., M. Cortesi, G. Callisesi, J. De Bie, C. Napolitano, A. Santoro, D. Mortara, and S. Severi.
468 2017. Noninvasive quantification of blood potassium concentration from ECG in hemodialysis patients.
469 *Sci. Rep.* 7: 42492.
- 470 26. Mugendi, G.A., G.F. Strippoli, F.M. Mutua, and T.M. Esterhuizen. 2014. Calcium channel blockers for
471 people with chronic kidney disease requiring dialysis. *Cochrane Database Syst. Rev.* .
- 472 27. Genovesi, S., C. Dossi, M.R. Vigano, E. Galbiati, F. Prolo, A. Stella, and M. Stramba-Badiale. 2008.
473 Electrolyte concentration during haemodialysis and QT interval prolongation in uraemic patients.
474 *Europace.* 10: 771–777.
- 475 28. Severi, S., C. Corsi, and E. Cerbai. 2009. From in vivo plasma composition to in vitro cardiac
476 electrophysiology and in silico virtual heart: the extracellular calcium enigma. *Philos. Trans. A. Math.*
477 *Phys. Eng. Sci.* 367: 2203–23.
- 478 29. Hille, B., A.M. Woodhull, and B.I. Shapiro. 1975. Negative Surface Charge Near Sodium Channels of
479 Nerve: Divalent Ions, Monovalent Ions, and pH [and Discussion]. *Philos. Trans. R. Soc. B Biol. Sci.*
480 270: 301–318.
- 481 30. Coronado, R., and H. Affolter. 1986. Insulation of the conduction pathway of muscle transverse tubule
482 calcium channels from the surface charge of bilayer phospholipid. *J. Gen. Physiol.* 87: 933–53.
- 483 31. Fabbri, A., A. Loewe, R. Wilders, and S. Severi. 2017. Pace-and-Drive of the Human Sinoatrial Node: a
484 Preliminary Computational Investigation. *Comput. Cardiol.* 44.
- 485 32. Britton, O.J., A. Bueno-Orovio, K. Van Ammel, H.R. Lu, R. Towart, D.J. Gallacher, and B. Rodriguez.
486 2013. Experimentally calibrated population of models predicts and explains intersubject variability in
487 cardiac cellular electrophysiology. *Proc. Natl. Acad. Sci. U. S. A.* 110: E2098–E2105.
- 488



■ Serum Ca (HD)
 ● Serum Ca (NHANES)
 ■ Serum K (HD)
 ● Serum K (NHANES)

all

Dialysis N = 741 (4391)
NHANES N = 18141

age < 50 years

Dialysis N = 138 (815)
NHANES N = 10918

age >= 50 to 69 years

Dialysis N = 341 (2036)
NHANES N = 4917

age >= 70 years

Dialysis N = 262 (1538)
NHANES N = 2306

male

Dialysis N = 436 (2594)
NHANES N = 8915

female

Dialysis N = 305 (1797)
NHANES N = 9226

