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1 Land Subsidence Surrogate Models for Normally
2 Consolidated Sedimentary Basins

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7 **Abstract**

8 This article presents a methodology for building a computationally-fast “surrogate model” to simulate land subsidence due to fluid extraction from normally
9 consolidated sedimentary basins. The model relies on the extension of the classic nucleus of strain solution (NoS) in a homogeneous semi-infinite continuum
10 to heterogeneous basins, in which the uniaxial vertical compressibility c_M varies along the depth z following either a power or an exponential law. The NoS solution
11 represents the horizontal and vertical components of the surface displacement associated with a unit volume at a given depth c in which a unit change
12 of pore pressure occurs. The modified NoS solution is obtained by fitting the horizontal and vertical components of the surface displacement calculated using
13 a finite-element (FE) numerical model. This is achieved through a regression algorithm that identifies four fitting parameters. By repeating such a regression
14 over a set of combinations of the coefficients of the basin compressibility model $c_M(z)$, it is possible to identify four functions that emulate the variability of the
15 four fitting parameters with respect to the compressibility model coefficients. The surrogate land subsidence model is then built by integrating the modified
16 NoS equations within the subsurface region (e.g. an aquifer) where a change in pore pressure occurs due to fluid abstraction. Such formulation results in an explicit
17 “response-matrix” approach, where the forcing terms depend on the pore pressure variations, and the matrix coefficients account for the selected basin
18 compressibility model. The implementation approach is quite straightforward

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29 and powerful, as it allows, for example, to easily construct a land subsidence
30 package “online” over any groundwater flow model, or estimate “offline” the
31 land surface displacement associated with any simulated or observed 3D pore
32 pressure change field. The surrogate land subsidence model is tested with a se-
33 ries of numerical experiments, and is shown to produce accurate results within
34 the working assumptions of the model.

35 *Keywords:* Land Subsidence, Nucleus of Strain, Model Surrogates

36 **1. Introduction**

37 Land subsidence is one of the major unintended effects of the extraction of
38 fluids (water, gas, oil) from the subsurface and has long been observed world-
39 wide, in several regions of North America (Ortiz-Zamora and Ortega-Guerrero,
40 2010; Castellazzi et al., 2016; Kasmarek et al., 2016; Sneed et al., 2018) and
41 South America (de Luna et al., 2017), Europe (Teatini et al., 2006, 2012;
42 González et al., 2012; Fokker et al., 2018), Africa (Cian et al., 2019; Ikuemonisan
43 and Ozebo, 2020), Asia (Erban et al., 2014; Abidin et al., 2015; Wang et al.,
44 2019), Australia and Oceania (Ng et al., 2015; Allis et al., 2009).

45 Land subsidence can have negative impacts on environment, economy and
46 society, including, among others, damage to buildings and infrastructure (roads,
47 railways, bridges, power plants, water distribution systems, wastewater treat-
48 ment plants, wells, landfills, etc.), changes in flow in channel networks and
49 drainage systems, increased flood frequency and increased sea water intrusion.
50 As such, land subsidence has been a matter of concern in densely populated
51 coastal regions where the elevation of the ground surface is just a few tens
52 of centimetres above the mean sea level, where it may significantly limit the
53 sustainability of anthropogenic activities related to subsurface development.

54 In recent years, the role played by land subsidence on the vulnerability of
55 coastal regions has been even more important, as it has the potential to signifi-
56 cantly add to the current projections of sea level rise (Kulp and Strauss, 2019).
57 Characterizing land subsidence is thus key for urban planning and development,

58 environmental management, as well as hydrogeological risk assessment and mit-
59 igation. Such a characterization requires the development and implementation
60 of systematic and regular monitoring and modelling programs.

61 According to Galloway and Burbey (2011) mitigation of land subsidence
62 due to groundwater withdrawal can be achieved by limiting pumping, through
63 conjunctive use and regulating water demand, and possibly by artificial ground-
64 water recharge. Models are key tools for predicting land displacement associated
65 with changes in water management policies. There are essentially two categories
66 of models that may be used for simulating the surface displacement induced by
67 subsurface fluid extraction: numerical models and analytical models.

68 Numerical models rely on the solution of the classical equations of poro-
69 elasticity (Biot, 1941, 1955; Verruijt, 1969) by methods such as finite elements,
70 finite differences, finite volumes or combinations of these. These models are quite
71 flexible, in that they allow for simulating complex hydrogeological settings under
72 generic conditions of heterogeneity. In some cases, they have been extended
73 to including non-linear elastic, elasto-plastic and viscous constitutive laws and
74 led to an unprecedented level of sophistication and accuracy in the simulation.
75 Detailed reviews of numerical models may be found in the works of Galloway
76 and Burbey (2011) and Gambolati and Teatini (2015).

77 Before numerical models, analytical models were the only tools available
78 for simulating or predicting land subsidence due to subsurface fluid extrac-
79 tion. Early analytical solutions were developed by Verruijt (1969) and Bear
80 and Corapcioglu (1981a,b), who addressed the problem of land subsidence dis-
81 placement induced from the continuous pumping from a single well in an either
82 perfectly confined or leaky aquifer. In these instances, the solution was de-
83 rived through the integration of the poro-elasticity equations (Biot, 1941) using
84 Hankel and Laplace transforms in conditions of radial symmetry and uniaxial
85 vertical strain.

86 Another famous land subsidence model was presented by Geertsma (1966,
87 1973)), who derived a close-from analytical solution for the surface displacement
88 induced by a disk-shaped axial-symmetric reservoir subject to a constant change

89 in pore pressure, and embedded in a homogeneous, linearly-elastic, semi-infinite
90 domain. Geerstma derived his solution by integrating the so-called "nucleus
91 of strain" (NoS) equations (Mindlin, 1936; Mindlin and Chen, 1950) over the
92 reservoir volume. NoS equations represent the surface displacements induced
93 by a unit change in fluid pressure, within a point source having a unit volume,
94 and located at the same depth as the reservoir.

95 Following the same approach as Geertsma's, van Opstal (1974) proposed
96 a model to estimate surface vertical displacement assuming that the reservoir
97 lies above a rigid basement. More recently, van Opstal's models was extended
98 by Tempone et al. (2010) to include both vertical and horizontal displacement
99 for the full half space based on the the work of Sharma (1956).

100 Of related interest is also the work of Morita et al. (1989), who conducted nu-
101 merical tests to derive coefficients that can be used to extend Geertsma (1973)'s
102 solution for the land subsidence and the strain at the reservoir center, as well
103 as the average reservoir volumetric compressibility, to those cases where a con-
104 trast between the elastic properties of the reservoir and the surrounding medium
105 exists.

106 The volume integral with which Geertsma's model was obtained, relies on
107 the hypotheses of linear elasticity and a semi-infinite system subject to homo-
108 geneous boundary conditions (i.e. no displacement) at large radial distance
109 and depth. Such integral is practically an application of the principle of su-
110 perposition of effects, in which the NoS equations (Mindlin and Chen, 1950)
111 constitute "Green" functions. Note that it is possible to apply the same princi-
112 ple to reservoirs of generic shape and subject to a spatially distributed change
113 in pore pressure. In general, such an integral would be calculated numerically,
114 but in some particular conditions an analytical solution is possible. For ex-
115 ample, Jayeoba et al. (2019) have recently proposed an analytical solution for
116 the transient vertical displacement above a well pumping at a constant rate
117 from a cylindrical confined homogeneous aquifer. Since in this instance the
118 pore pressure change is radial-symmetric, the integration is made possible using
119 Geertsma's vertical surface displacement at the center of a disk-shaped reservoir

120 as the Green function.

121 The analytical and semi-analytical models described above heavily rely on
122 the assumption that the reservoir and the surrounding formations are homoge-
123 neous. However, the use of NoS equations as Green functions is actually not
124 limited by the assumption of homogeneity made by Mindlin and Chen (1950).
125 Indeed, it is possible to extend such an approach to heterogeneous systems that
126 do not violate the conditions radial symmetry, that is, semi-infinite domains
127 with elastic properties varying along the depth only, as in the case, for example,
128 of normally consolidated sedimentary basin where c_M is observed to decrease
129 with the depth. This approach was applied by Gambolati et al. (1991) to esti-
130 mate the land subsidence due to the development of a gas pool in Ravenna, Italy.
131 In that case, however, a FE axial-symmetric model was necessary to calculate
132 the NoS solution due to the system heterogeneity.

133 Nowadays numerical models constitute undoubtedly the most powerful tool
134 for simulating land subsidence in real-world scenarios, but require conspicuous
135 datasets to validate model assumption and calibrate. Lack of data, however,
136 often poses significant limitations for the construction of reliable land subsidence
137 models. In addition, these models typically imply a considerable cost in terms of
138 time and skills for model construction and computational running time. When
139 these limitations are tangible, analytically based closed-form solutions have the
140 advantage of being less data-demanding, easier and faster to implement, as well
141 as computationally more efficient.

142 The advantages of closed-form solutions become even more relevant when the
143 sparsity and the uncertainty in geomechanical data need to be addressed through
144 uncertainty quantification analyses for purposes, for example, of quantitative
145 risk assessment in support of decision making. These analyses are typically
146 based on Monte Carlo stochastic simulations, which may require on the order
147 of hundreds or thousands of model runs, which may result quite overwhelming
148 when using fully numerical models. While in these situations analytical or
149 semi-analytical models appear to be better suited than numerical models, it is
150 also important to improve their ability to deal with more realistic conditions

151 of heterogeneity, such as those observed in normally consolidated sedimentary
 152 basins.

153 This article presents a novel, computationally-fast surrogate land subsidence
 154 models that relies on the extension of the NoS equations for normally consol-
 155 idated sedimentary basins, where the uniaxial vertical compressibility c_M de-
 156 creases with the depth according to either a power or an exponential model.
 157 Such a model is developed around three major components: a basin compress-
 158 ibility model, a semi-analytical surrogate form of the NoS equations for het-
 159 erogeneous subsurface systems, and finally a surrogate land subsidence model.
 160 These components are presented in Sections 2, 3, and 4, respectively.

161 2. Compressibility Models in Normally Consolidated Sedimentary 162 Basins

163 Considered here is the case of a fully saturated sedimentary basin in condi-
 164 tion of “normal consolidation”, that is, where the compaction in any given point
 165 depends solely on the current effective stress exerted by the “overburden”, and
 166 no overloading has ever occurred. In such a basin, the total vertical stress σ_z at
 167 any given depth z can be estimated as:

$$\sigma_z(z) = \int_0^z \rho_{bw}(z') \cdot g \cdot dz' \quad (1)$$

168 where g is gravity, and ρ_{bw} is the wet bulk density, given by:

$$\rho_{bw} = \rho_s \cdot (1 - \phi) + \rho_w \cdot \phi \quad (2)$$

169 In Eq. (2), ρ_s is the solid density, ρ_w is the water density, and ϕ is the porosity.
 170 While all these properties may vary with z , ρ_s and ρ_w are assumed to be constant
 171 ($\rho_s=2650 \text{ kg/m}^3$; $\rho_w=1000 \text{ kg/m}^3$). The so-called “overburden gradient” $obg(z)$
 172 is associated with $\sigma_z(z)$ by the following relationship:

$$obg(z) = \frac{\sigma_z(z)}{z} \quad (3)$$

173 Because of Eq. (1), $obg(z)$ represents the average soil specific weight ($\rho_{bw} \cdot g$) over
 174 the “column” $[0, z]$. Assuming the pore pressure p as hydrostatically distributed

175 (i.e. $p = \rho_w \cdot g \cdot z$), Terzaghi's principle establishes a link between the total
 176 vertical stress σ_z and the effective vertical stress σ'_z at any depth z (Terzaghi,
 177 1936):

$$\sigma_z(z) = \alpha \cdot \rho_w \cdot g \cdot z + \sigma'_z(z) \quad (4)$$

178 where α is Biot's coefficient (Biot, 1941; Biot and Willis, 1957), expressed as:

$$\alpha = 1 - \frac{c_s}{c_M} \quad (5)$$

179 with c_s being the compressibility of the particles (solid phase). Merging Eqs. (3)
 180 and (4) yields the following relation between the overburden gradient and the
 181 vertical effective stress:

$$\sigma'_z(z) = obg(z) \cdot z - \alpha \cdot \rho_w \cdot g \cdot z \quad (6)$$

182 It is worth pointing out that, within the normal consolidation assumption,
 183 the sedimentary basin is assumed to have been formed under a "slow" and
 184 "homogeneous" deposition process. In this process, the progressive increase in
 185 total stress produces a consolidation of the porous medium, in which the in-situ
 186 porosity decreases as z and thus σ'_z increase (Eq. 6). It is then possible to derive
 187 an expression for the basin compressibility c_M as a function of z based on the
 188 variations of ϕ observed through the overburden gradient $obg(z)$. To do so, two
 189 assumptions are made: (a) soil particles are incompressible; and (b) the porous
 190 medium undergoes no horizontal strain (oedometric conditions).

191 Note that hypothesis (a) applies to "soft" porous media, in which c_s is neg-
 192 ligible with respect to c_M , so that $\alpha \cong 1$ (Eq. 5). This is typically justifiable
 193 since c_s is of the order of 10^{-11} - 10^{-10} Pa $^{-1}$ for most common sediment miner-
 194 als (Zisman, 1933).

195 For a representative elementary porous volume (REV) of thickness H sub-
 196 ject, during deposition, to a thickness reduction dH due to an effective stress
 197 increase $d\sigma'_z$, the uniaxial vertical compressibility is defined as:

$$c_M = -\frac{1}{H} \cdot \frac{dH}{d\sigma'_z} \quad (7)$$

198 Since the sample volume V and the solid phase volume V_s are related to one an-
 199 other by $V_s = V \cdot (1 - \phi)$, and taking into account of the grain incompressibility
 200 and the oedometric assumptions, the following is relation is obtained:

$$dV_s = d[V \cdot (1 - \phi)] = A \cdot d[H \cdot (1 - \phi)] = 0 \quad (8)$$

201 where A is the REV base area ($V = A \cdot H$). From Eq. (8):

$$dH \cdot (1 - \phi) - H \cdot d\phi = 0 \quad (9)$$

202 and thus:

$$\frac{dH}{H} = \frac{d\phi}{1 - \phi} \quad (10)$$

203 Substituting Eq. (10) in (7) yields:

$$c_M = -\frac{1}{1 - \phi} \cdot \frac{d\phi}{d\sigma'_z} \quad (11)$$

204 Eq. (11) provides a basis for exploring the relationships between c_M , σ'_z and z .

205 By taking the derivative with respect to z of Eq. (1), and using Eqs. (2) and (3):

206

$$\frac{d}{dz} [obg(z) \cdot z] = \frac{d}{dz} \int_0^z \{\rho_s \cdot [1 - \phi(z')] + \rho_w \cdot \phi(z')\} \cdot g \cdot dz' = \rho_s \cdot g - (\rho_s - \rho_w) \cdot g \cdot \phi(z) \quad (12)$$

207 Eq. (12) can be rearranged to obtain ϕ as a function of $obg(z)$ and z :

$$\phi(z) = \frac{\rho_s}{\rho_s - \rho_w} - \frac{1}{(\rho_s - \rho_w) \cdot g} \cdot \frac{d}{dz} [obg(z) \cdot z] \quad (13)$$

208 Eq. (13) is the first element needed to evaluate Eq. (11). $\frac{d\phi}{d\sigma'_z}$ can be calculated

209 by noting that: $\frac{d\phi}{d\sigma'_z} = \frac{d\phi}{dz} / \frac{d\sigma'_z}{dz}$. From Eq. (13):

$$\frac{d\phi}{dz} = -\frac{\frac{d^2}{dz^2} [obg(z) \cdot z]}{(\rho_s - \rho_w) \cdot g} \quad (14)$$

210 and from Eq. (6):

$$\frac{d\sigma'_z}{dz} = \frac{d}{dz} [obg(z) \cdot z] - \rho_w \cdot g \quad (15)$$

211 Substituting Eqs. (13-15) into (11) gives, after a few rearrangements:

$$c_M(z) = \frac{\frac{d^2}{dz^2} [obg(z) \cdot z]}{\left\{ \frac{d}{dz} [obg(z) \cdot z] - \rho_w \cdot g \right\}^2} \quad (16)$$

212 Eq. (16) can be used to estimate $c_M(z)$ from $obg(z)$. One can observe that if
 213 $obg(z) \cdot z$, that is $\sigma_z(z)$, is linear, then $c_M(z) = 0$, that is, the porous medium
 214 results incompressible. Thus, in a normally consolidated basin, for $c_M(z)$ to be
 215 positive, $\sigma_z(z)$ must be a convex function.

216 The derivation of Eq. (16) is valid so long as $\alpha = 1$, which, for practical
 217 applications, requires c_M to be at least 10 times larger than c_s . This translates
 218 into a maximum depth value, within which c_M is correctly estimated by Eq. (16).
 219 Such a value depends on the adopted overburden gradient model $obg(z)$. Beyond
 220 that depth one can assume that, since the porosity cannot be further reduced,
 221 the compressibility of the continuum approaches c_s .

222 Note that the combination of Eqs. (6) and (16) would allow for deriving
 223 an implicit non-linear elastic constitutive law, which could be used to simulate
 224 changes of c_M occurring due to fluid abstraction. This approach was followed,
 225 for example, by Baú et al. (2002) and Ferronato et al. (2003), but is not used
 226 here. Instead, a plain linear-elastic model is adopted, which assumes that during
 227 depletion c_M remains constant and equal to the in-situ conditions prior to fluid
 228 abstraction (Eq. 16).

229 2.1. Homogeneous Systems

230 In a basin characterized by a homogeneous c_M , Eq. (11) can be easily in-
 231 tegrated by separation of variables to derive the following porosity function:

232

$$\phi(z) = 1 - (1 - \phi_0) \cdot e^{c_M \cdot \sigma'_z(z)} \quad (17)$$

233 where the boundary conditions $\phi(0) = \phi_0$ and $\sigma'(0) = 0$ have been imposed.

234 From Eqs. (1-2) and (4):

$$\sigma'_z(z) = \int_0^z (\rho_s - \rho_w) \cdot (1 - \phi) \cdot g \cdot dz' \quad (18)$$

235 Substituting Eq. (17) into (18) yields:

$$\sigma'_z(z) = (\rho_s - \rho_w) \cdot g \cdot (1 - \phi_0) \cdot \int_0^z e^{c_M \cdot \sigma'_z(z')} \cdot dz' \quad (19)$$

236 The integral function at the right-hand side of Eq. (19) is removed by taking
 237 the derivative of it with respect to z , which produces:

$$\frac{d\sigma'_z(z)}{dz} = (\rho_s - \rho_w) \cdot g \cdot (1 - \phi_0) \cdot e^{c_M \cdot \sigma'_z(z)} \quad (20)$$

238 Eq. (20) can be integrated by separation of variables, which leads to the following
 239 expression:

$$\sigma'_z(z) = -\frac{1}{c_M} \cdot \ln[1 - c_M \cdot (\rho_s - \rho_w) \cdot g \cdot (1 - \phi_0) \cdot z] \quad (21)$$

240 Substituting Eq. (21) into (17) allows to determine the porosity:

$$\phi(z) = 1 - \frac{1 - \phi_0}{1 - c_M \cdot (\rho_s - \rho_w) \cdot g \cdot (1 - \phi_0) \cdot z} \quad (22)$$

241 Substituting Eq. (21) into (4) provides the total stress:

$$\sigma_z(z) = \rho_w \cdot g \cdot z - \frac{1}{c_M} \cdot \ln[1 - c_M \cdot (\rho_s - \rho_w) \cdot g \cdot (1 - \phi_0) \cdot z] \quad (23)$$

242 The overburden gradient (Eq. 3) can thus be expressed as:

$$obg(z) = \rho_w \cdot g - \frac{\ln[1 - c_M \cdot (\rho_s - \rho_w) \cdot g \cdot (1 - \phi_0) \cdot z]}{c_M \cdot z} \quad (24)$$

243 Example profiles for $\phi(z)$ (Eq. 22) and $obg(z)$ (Eq. 24) are given in Figure 1
 244 (see the blue solid lines).

245 Note that Eq. (22) holds so long as $\phi(z) \geq 0$. According to such a model,
 246 the porosity decreases with the depth, from ϕ_0 at $z = 0$, to zero at a depth
 247 $z = z_{max}$, so that Eq. (22) can be deemed valid only if:

$$0 \leq z \leq z_{max} = \frac{\phi_0}{1 - \phi_0} \cdot \frac{1}{c_M \cdot (\rho_s - \rho_w) \cdot g} \quad (25)$$

248 The constraints (25) reveal that the conditions of normal consolidation and
 249 homogenous c_M result incompatible beyond the depth z_{max} . Indeed, since at
 250 that depth the porosity vanishes, the porous medium underneath behaves like
 251 an elastic continuum, with a compressibility c_s that is much smaller than c_M ,
 252 which violates the homogeneity assumption.

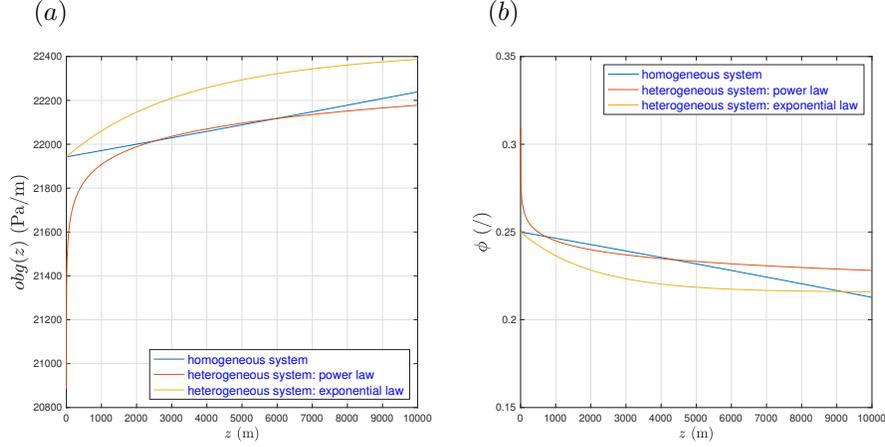


Figure 1: Examples of (a) overburden gradient and (b) porosity profiles vs. depth for normally consolidated sedimentary basins where c_M is considered either homogeneous, or heterogeneous according to a power law (Eq. 30) and an exponential law (Eq. 36).

253 2.2. The Heterogeneous Case

254 Let us now consider a hypothetical basin where the vertical effective stress
 255 increases with depth according to a power law:

$$\sigma'_z(z) = a_1 \cdot z^{b_1} \quad (26)$$

256 where a_1 and b_1 are two strictly positive coefficients. Based on Eq. (4), the total
 257 vertical stress is:

$$\sigma_z(z) = \rho_w \cdot g \cdot z + a_1 \cdot z^{b_1} \quad (27)$$

258 and the overburden gradient (Eq. (3)) is:

$$obg(z) = \rho_w \cdot g + a_1 \cdot z^{b_1-1} \quad (28)$$

259 The power law (26) is thus adequate for sedimentary basins in which overburden
 260 data, typically calculated from density logs (Ellis and Singer, 2008), can be fit
 261 to a function such as (28). Substituting Eq. (28) into (13) yields:

$$\phi(z) = 1 - \frac{a_1 \cdot b_1 \cdot z^{b_1-1}}{(\rho_s - \rho_w) \cdot g} \quad (29)$$

262 Figure 1 shows example profiles (the orange solid lines) for $obg(z)$ and $\phi(z)$
 263 based on Eqs. (28) and (29).

264 Substituting Eq. (28) into (16) gives the basin compressibility:

$$c_M(z) = \frac{b_1 - 1}{a_1 \cdot b_1} \cdot z^{-b_1} \quad (30)$$

265 Basin compressibility models based on Eq. (30) have been derived and adopted
 266 for land subsidence simulation by, among others, Baú et al. (2002), Ferronato
 267 et al. (2003), Teatini et al. (2011), and Jha et al. (2015).

268 Note that for c_M to be strictly positive, the condition $b_1 > 1$ must hold.
 269 In turn, since ϕ (Eq. 29) needs be theoretically between 0 and 1, the following
 270 condition is also necessary:

$$0 < \frac{a_1 \cdot b_1 \cdot z^{b_1-1}}{(\rho_s - \rho_w) \cdot g} \leq 1 \quad (31)$$

271 Such inequality is met if:

$$0 \leq z \leq z_{max} = \left[\frac{(\rho_s - \rho_w) \cdot g}{a_1 \cdot b_1} \right]^{\frac{1}{b_1-1}} \quad (32)$$

272 Similar to (25), condition (32) indicates that at depth larger than z_{max} the
 273 porosity vanishes, and the porous medium behaves like an elastic continuum,
 274 with a negligible compressibility or, in other words, an almost rigid basement.
 275 One may also observe that, according to Eq. (29), the porosity at $z = 0$ is equal
 276 to 1, which implies unrealistically high values of ϕ at shallow depth. This may
 277 be observed from the orange profiles in Figure 1b.

278 An attractive alternative to the power compressibility model (Eqs. 26-30)
 279 may be derived by assuming an “exponential” porosity model:

$$\phi(z) = \phi_{min} + (\phi_0 - \phi_{min}) \cdot e^{-\frac{z}{\lambda}} \quad (33)$$

280 where ϕ_0 and ϕ_{min} are the porosity values at $z = 0$ and $z \rightarrow \infty$, and λ is a scale
 281 length that regulates the rate of decrease of ϕ along the depth z . This model
 282 appears to be more robust than the previous one, since realistic values of ϕ can
 283 be prescribed even at shallow depth. In addition, the porosity vanishes asymp-
 284 totically (i.e., only at large depth) and no constraints, such as (25) and (32),
 285 are needed.

286 Based on Eqs. (1-2), the total vertical stress associated with the porosity
 287 model (33) is given by:

$$\begin{aligned} \sigma_z(z) = & [\rho_s \cdot (1 - \phi_{min}) + \rho_w \cdot \phi_{min}] \cdot g \cdot z \\ & + (\rho_s - \rho_w) \cdot (\phi_0 - \phi_{min}) \cdot g \cdot \lambda \cdot (e^{-\frac{z}{\lambda}} - 1) \end{aligned} \quad (34)$$

288 from which (Eq. (3)):

$$obg(z) = [\rho_s \cdot (1 - \phi_{min}) + \rho_w \cdot \phi_{min}] \cdot g + (\rho_s - \rho_w) \cdot (\phi_0 - \phi_{min}) \cdot g \cdot \lambda \cdot \frac{e^{-\frac{z}{\lambda}} - 1}{z} \quad (35)$$

289 Example profiles for $\phi(z)$ (Eq. (33)) and $obg(z)$ (Eq. (35)) are given by the
 290 yellow solid lines in Figure 1.

291 The compressibility $c_M(z)$ associated with the exponential porosity model
 292 (Eq. (33)) can be calculated by substituting Eq. (35) into (16), which yields:

$$c_M(z) = \frac{(\phi_0 - \phi_{min})}{(\rho_s - \rho_w) \cdot g \cdot \lambda} \cdot e^{-\frac{z}{\lambda}} \quad (36)$$

293 According to Eq. (36), c_M decreases exponentially with z , from a surficial value
 294 equal to $\frac{(\phi_0 - \phi_{min})}{(\rho_s - \rho_w) \cdot g \cdot \lambda}$, to zero asymptotically.

295 Here, it is worth highlighting the role played by the scaling coefficient λ . Low
 296 values of λ represent highly compressible and heterogeneous basins, where c_M
 297 decreases sharply as z increases. Vice versa, large values of λ represent generally
 298 low-compressible and pseudo-homogeneous basins, where c_M is reduced very
 299 smoothly as z increases.

300 **3. The Nucleus of Strain Equations**

301 The nucleus of strain (NoS) equations (Mindlin, 1936; Mindlin and Chen,
 302 1950; Geertsma, 1966) describe the displacement of the traction-free horizontal
 303 surface of a three-dimensional homogeneous semi-infinite system, in which a unit
 304 increase in pore pressure occurs in a small unit volume located at depth c from
 305 the surface (Figure 2). The horizontal and vertical displacement components

306 (u_h, u_v) are (Geertsma, 1973):

$$\begin{aligned}
 \text{(a): } u_h(r) &= \frac{c_M^* \cdot (1 - \nu)}{\pi} \cdot \frac{r}{(c^2 + r^2)^{1.5}} \\
 \text{(b): } u_v(r) &= \frac{c_M^* \cdot (1 - \nu)}{\pi} \cdot \frac{c}{(c^2 + r^2)^{1.5}}
 \end{aligned}
 \tag{37}$$

307 where c_M^* and ν are the vertical uniaxial compressibility and the Poisson ratio
 308 of the (homogeneous) porous medium, respectively, and r is the radial coordi-
 309 nate with respect to a vertical axis crossing the NoS location. Note that since
 310 $u_h/u_v = r/c$, u_h and u_v are equal for $r = c$.

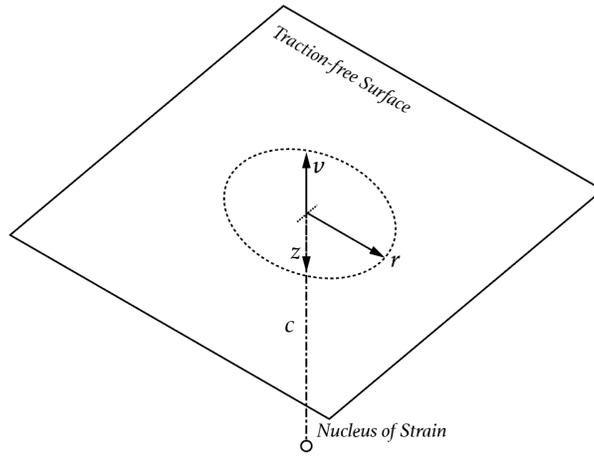


Figure 2: Three-dimensional semi-infinite space in which the NoS is situated. Because of the homogeneity assumption, the displacement components are symmetric with respect the vertical axis crossing the NoS.

311 For this analysis, it comes in handy to normalize Eqs. (37) with respect to
 312 the displacement $u_v(0) = \frac{c_M^* \cdot (1 - \nu)}{\pi \cdot c^2}$, which leads the following dimensionless NoS
 313 equations:

$$\begin{aligned}
 \text{(a): } \bar{u}_h(r) &= \frac{u_h(r)}{\frac{c_M^* \cdot (1 - \nu)}{\pi \cdot c^2}} = \frac{c^2 \cdot r}{(c^2 + r^2)^{1.5}} \\
 \text{(b): } \bar{u}_v(r) &= \frac{u_v(r)}{\frac{c_M^* \cdot (1 - \nu)}{\pi \cdot c^2}} = \frac{c^3}{(c^2 + r^2)^{1.5}}
 \end{aligned}
 \tag{38}$$

314 Introducing the dimensionless radial coordinate $R = r/c$ in Eqs. (38) yields:

$$\begin{aligned} \text{(a): } \bar{u}_h(R) &= R \cdot (1 + R^2)^{-1.5} \\ \text{(b): } \bar{u}_v(R) &= (1 + R^2)^{-1.5} \end{aligned} \quad (39)$$

315 Eqs. (39) indicate that the normalized NoS displacement components depend on
 316 the scaled radial coordinate R , rather than the radial coordinate r itself. Note
 317 also that since the NoS depth c is not an independent variable for $\bar{u}_h(R)$ and
 318 $\bar{u}_v(R)$, these are invariant with respect to c . This is due to the nature of the
 319 system, which is semi-infinite, and any variation of c is equivalent to a simple
 320 change of the spatial scale. Consequently the shape of the displacement bowl
 321 remains the same, while only the displacement amplitude is changed.

322 The NoS Eqs. (37) may be used to assess the land subsidence due to fluid
 323 extraction from subsurface formations (see Section 4), using a value of c_M esti-
 324 mated at the formation depth (Geertsma, 1966, 1973). For example, in the case
 325 of the compressibility model (30) the medium compressibility c_M^* is:

$$c_{M,1}^* = \frac{b_1 - 1}{a_1 \cdot b_1} \cdot c^{-b_1} \quad (40)$$

326 Eq. (40) allows for expressing Eq. (30) in the following equivalent form:

$$c_M(z) = c_{M,1}^* \cdot \left(\frac{z}{c}\right)^{-b_1} \quad (41)$$

327 Similarly, in the case of the compressibility model (36) the medium compress-
 328 ibility c_M^* takes on the value:

$$c_{M,2}^* = \frac{(\phi_0 - \phi_{min})}{(\rho_s - \rho_w) \cdot g \cdot \lambda} \cdot e^{-\frac{c}{\lambda}} \quad (42)$$

329 Using Eq. (40), Eq. (36) can be modified as:

$$c_M(z) = c_{M,2}^* \cdot e^{-\frac{z-c}{\lambda}} \quad (43)$$

330 Figure 3 shows the profiles of c_M vs. z according to Eqs. (41) (the orange solid
 331 line) and (43) (the yellow solid line). In these examples, the two profiles are
 332 characterized by the same compressibility value c_M^* at a NoS depth $c = 2,000$
 333 m. The same value is used to draw the profile of $c_M(z)$ in the homogeneous
 334 case (the blue solid line).

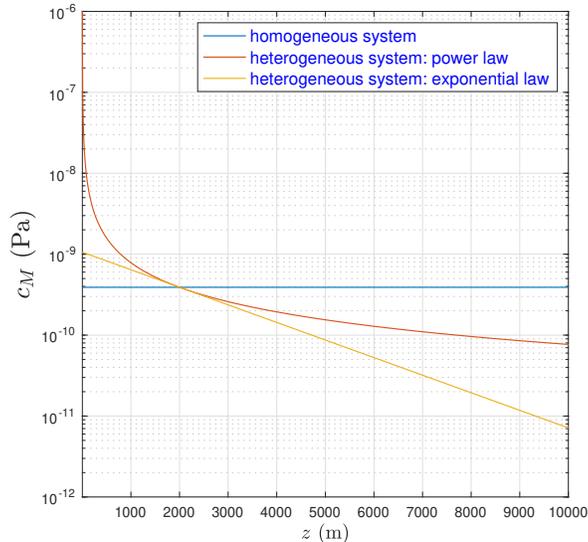


Figure 3: Examples of compressibility models for normally consolidated sedimentary basins where c_M is either constant, or decreasing with the depth according to a power law (Eq. (30)) or an exponential law (Eq. 36)).

335 Eqs. (41) and (43) show that $c_M(z) \geq c_M^*$ for $0 \leq z \leq c$, and $c_M(z) < c_M^*$
 336 for $z > c$ (see also Figure 3). In both scenarios, the porous medium is stiffer
 337 below and softer above the depth c with respect to the homogeneous case. Con-
 338 sequently, the homogeneity assumption is likely to lead to an underestimation
 339 of the surface displacement. The amplitude of this error depends largely on the
 340 degree of heterogeneity of c_M , which is determined by the coefficients b_1 and λ
 341 for the compressibility models (41) and (43), respectively.

342 It is worth noting that the NoS Eqs. (37) and (39) are valid under the homo-
 343 geneity assumption, which, however idealized, is subject to the constraint (25).
 344 In practical terms, it seems reasonable to apply Eqs. (37) if the depth z_{max} in
 345 Equation (25) is significantly larger, say 10 times, than c , since at this depth the
 346 displacement amplitude is negligible compared to that at the surface. And since
 347 z_{max} is inversely proportional to c_M (see Eq. (25)), such application seems more
 348 suited for low-compressible basins. By imposing the condition $z_{max} \geq 10 \cdot c$, the

349 following constraint is thus derived:

$$c_M \leq c_{M,max}^* = \frac{\phi_0}{1 - \phi_0} \cdot \frac{1}{(\rho_s - \rho_w) \cdot g \cdot 10 \cdot c} \quad (44)$$

350 where $c_{M,max}^*$ represents the compressibility upper bound that ensures that the
 351 hypothesis of homogeneity is physically meaningful for the application of the
 352 NoS equations (37). Inequality (44) indicates that $c_{M,max}^*$ is inversely propor-
 353 tional the NoS depth c , and increases with the surface porosity ϕ_0 . Profiles of
 354 $c_{M,max}^*$ vs. ϕ_0 are graphed in Figure 4 for different values of c . "Feasible" values
 355 of c_M are represented by the regions below each of the profiles.

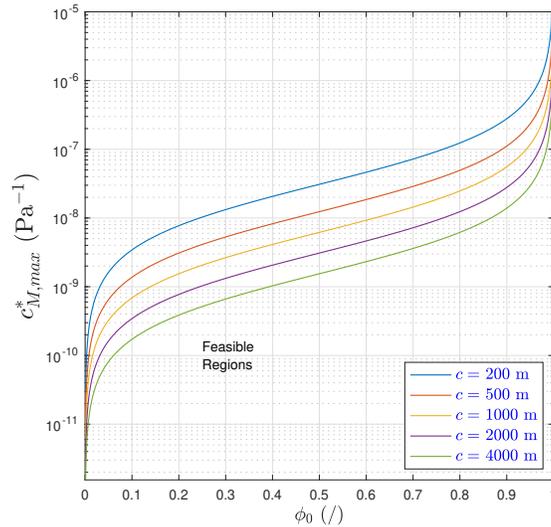


Figure 4: Feasible regions of the homogeneous compressibility c_M as functions of the surface porosity ϕ_0 and the NoS depth c . Note, for example, that for values of ϕ_0 around 0.4, and $c=2000$ m, c_M^* should not exceed $2 \times 10^{-9} \text{ Pa}^{-1}$.

356 3.1. The heterogeneous case

357 The main goal of this work is derive surrogate forms of Eqs. (37) applicable
 358 to sedimentary basins with a compressibility heterogeneously distributed as in
 359 Eqs. (30) and (36). This analysis relies on an extensive series of numerical tests

360 conducted using the finite-element (FE) model SUBAXS (Gambolati et al.,
 361 2001), which solves the equilibrium equations governing the deformation of an
 362 axial-symmetric medium. Such a model uses a “infinite gradient” formulation
 363 to simulate reservoirs with a pore pressure discontinuity at their boundary, and
 364 is thus particularly suited to simulate the NoS effects.

365 3.1.1. Numerical setup

366 In these numerical tests, the semi-infinite domain is approximated by a
 367 cylindrical domain with a 50,000-m radius and a 20,000-m depth, with the
 368 NoS located on the cylinder axis at depth $c=2,000$ m from the upper bound-
 369 ary. Both the lower and the lateral boundaries of the domain are subject to
 370 no-displacement constraints, while the upper boundary, representing the land
 371 surface, is “traction-free”, that is, unconstrained. Because of the radial symme-
 372 try, the three-dimensional (3D) problem is reduced to a two-dimensional (2D),
 axial-symmetric problem. Such setting is depicted in Figure 5.

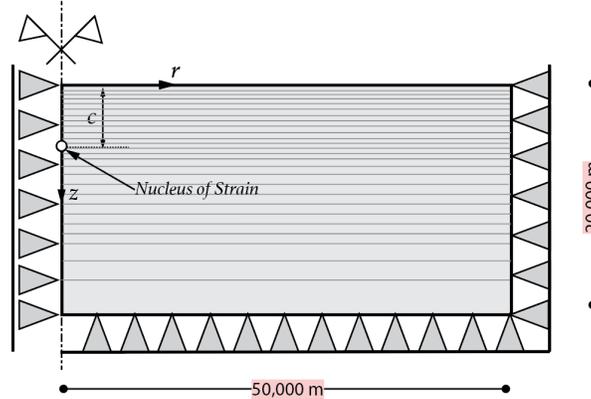


Figure 5: Axial-symmetric conceptual model for the FE simulation of the surface displacement components associated with the NoS. The surface boundary is unconstrained and the left boundary (*i.e.* the axial-symmetry axis) is fixed horizontally ($u_h = 0$). Both the bottom and the lateral boundaries are fully fixed ($u_h = u_v = 0$).

373

374 To discretize such system, a FE mesh is created with 64,186 nodes and
 375 127,148 triangular elements. The mesh includes 291 horizontal layers char-

376 acterised by different values of c_M based on the compressibility models (30)
 377 and (36). A uniformly distributed change in pore pressure of $\Delta p = 1$ Pa is
 378 prescribed within the elements of a “small” cylinder, of radius $r_r=10$ m and
 379 thickness $b_r=10$ m, centered at the location of the NoS. In order to calculate
 380 the surface displacement components associated with the NoS, the surface dis-
 381 placements obtained numerically are divided by $V_r \cdot \Delta p$, where $V_r = b_r \pi r_r^2$ is the
 382 volume of the ”activated” cylinder. Figure 6 shows a comparison of the surface
 383 displacement profiles obtained with the analytical solution (39) and with SUB-
 384 AXS. The differences are negligible, which indicates the constructed FE mesh
 has a sufficiently fine resolution.

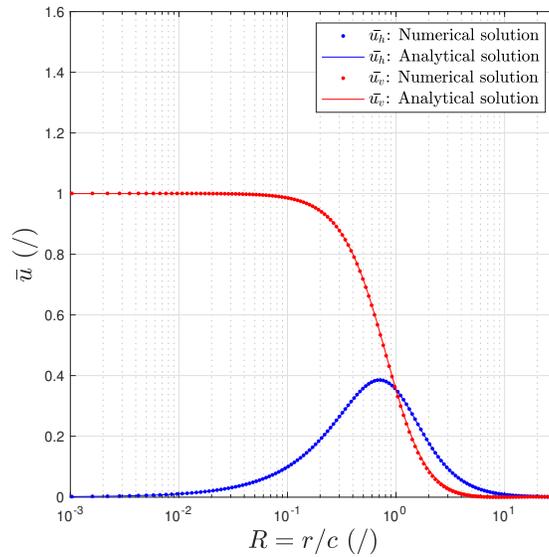


Figure 6: Radial profiles of the surface displacement horizontal and vertical components for a generic nucleus of strain located at depth c , obtained analytically (solid lines) and numerically (dotted lines). The displacements are normalised with respect to the axial vertical surface displacement (Eq. 37b for $r=0$), whereas the radial distance is scaled with respect to the NoS depth, c .

385

386 *3.1.2. NoS Semi-analytical Solution*

387 Preliminary numerical tests conducted with SUBAXS reveal that Eqs. (39)
 388 can be extended to the conditions of heterogeneity of sedimentary basins char-
 389 acterised by the compressibility models (41) and (43). The following normalized
 390 NoS equations are thus proposed:

$$\begin{aligned} \text{(a): } \quad \bar{u}_h(R) &= \alpha_h \cdot R \cdot (1 + R^2)^{\beta_h} \\ \text{(b): } \quad \bar{u}_v(R) &= \alpha_v \cdot (1 + R^2)^{\beta_v} \end{aligned} \quad (45)$$

391 where α_h , β_h , α_v , and β_v are coefficients to be determined by fitting the Eqs. (45)
 392 to the numerical solutions obtained using SUBAXS (see Section 3.1.3). Once
 393 these coefficients are calculated, the Eqs. (45) are substituted back into Eqs. (37)
 394 in place of Eqs. (39), which leads to the following surrogate NoS solution:

$$\begin{aligned} \text{(a): } \quad u_h(r) &= \frac{c_M^* \cdot (1 - \nu)}{\pi \cdot c^2} \cdot \alpha_h \cdot \frac{r}{c} \cdot \left[1 + \left(\frac{r}{c} \right)^2 \right]^{\beta_h} \\ \text{(b): } \quad u_v(r) &= \frac{c_M^* \cdot (1 - \nu)}{\pi \cdot c^2} \cdot \alpha_v \cdot \left[1 + \left(\frac{r}{c} \right)^2 \right]^{\beta_v} \end{aligned} \quad (46)$$

395 In Eqs. (46), c_M^* represents the vertical uniaxial compressibility calculated at
 396 the depth c , that is, $c_{M,1}^*$ (Eq. 40) for the compressibility power model, and $c_{M,2}^*$
 397 (Eq. 42) for the compressibility exponential model.

398 Using basic principles of linear elasticity, it is possible to demonstrate that,
 399 even in the heterogeneous case, the normalized displacement functions $\bar{u}_h(R)$
 400 and $\bar{u}_v(R)$ (Eqs. (45)) do not depend on the NoS depth c , and thus on the c_M^*
 401 value, but only of the degree of heterogeneity of c_M , as quantified by b_1 for the
 402 compressibility model (41), and by the length λ scaled to the NoS depth c , that
 403 is $\lambda' = \lambda/c$, for the compressibility model (43).

404 This is has important implications on the computational cost of this analysis,
 405 since the coefficients α_h , β_h , α_v and β_v can be quantified using a single reference
 406 value of c , which is set to 2,000 m in these tests. Of course, the NoS depth will
 407 still affect the actual surface displacement amplitude through the terms c and
 408 c_M^* in Eqs. (46).

409 *3.1.3. Fitting Approach*

410 The coefficients α_h , β_h , α_v and β_v of the surrogate NoS Eqs. (45) can be
 411 determined by minimising separately the square residual non-linear functions:

$$\begin{aligned}
 \text{(a): } F_h(\alpha_h, \beta_h) &= \sum_{i=1}^{N_s} [\overline{u_h}(R_i) - \overline{u_{hi}}]^2 \\
 \text{(b): } F_v(\alpha_v, \beta_v) &= \sum_{i=1}^{N_s} [\overline{u_v}(R_i) - \overline{u_{vi}}]^2
 \end{aligned}
 \tag{47}$$

412 where $(\overline{u_{hi}}, \overline{u_{vi}})$ are the normalized NoS displacement components calculated
 413 –numerically– at the generic surface node i ($i = 1, 2, \dots, N_s$) of the 2D grid used
 414 to discretize the subsurface system, and $(\overline{u_h}(R_i), \overline{u_v}(R_i))$ are the corresponding
 415 components calculated using Eqs. (45). The minimization of the two functions
 416 $F_h(\alpha_h, \beta_h)$ and $F_v(\alpha_v, \beta_v)$ is here carried out using a non-linear least-square
 417 technique, such as the “trust-region-reflective” method (Coleman and Li, 1996).

418 Examples of fit results are presented in Figure 7, which shows the profiles
 419 of the displacement components $\overline{u_h}(R)$ and $\overline{u_v}(R)$, along with the fitted pro-
 420 files based on Eqs. (45), with the coefficients α_h , β_h , α_v , and β_v calculated by
 421 minimizing Eqs. (47). Figure 7a reports the case of a power compressibility
 422 model (Eq. 41) with $b_1 = 1.1$, for which the resulting fitting coefficients are:
 423 $\alpha_h = 3.21097$, $\beta_h = -2.04310$, $\alpha_v = 1.51600$, and $\beta_v = -2.02741$. Likewise,
 424 Figure 7b reports the case of an exponential compressibility model (Eq. 43)
 425 with $\lambda/c = 1$, for which the resulting fitting coefficients are: $\alpha_h = 1.81680$,
 426 $\beta_h = -1.78647$, $\alpha_v = 1.47040$, and $\beta_v = -1.93010$.

427 For both compressibility laws, the fit of the NoS Eqs. (45) to the numer-
 428 ical solution is deemed satisfactory. Some minor discrepancies are observed
 429 for large R values, where the numerical displacement values result somewhat
 430 smaller than the fitted displacement profiles. These discrepancies are due to the
 431 approximation introduced in the numerical simulation by setting up the semi-
 432 infinite space as a laterally finite cylindrical domain with a fixed lateral boundary,
 433 and are expected to have a negligible impact on overall displacement results, as
 434 they are limited to lower-order of magnitude displacements occurring at large
 435 radial distance.

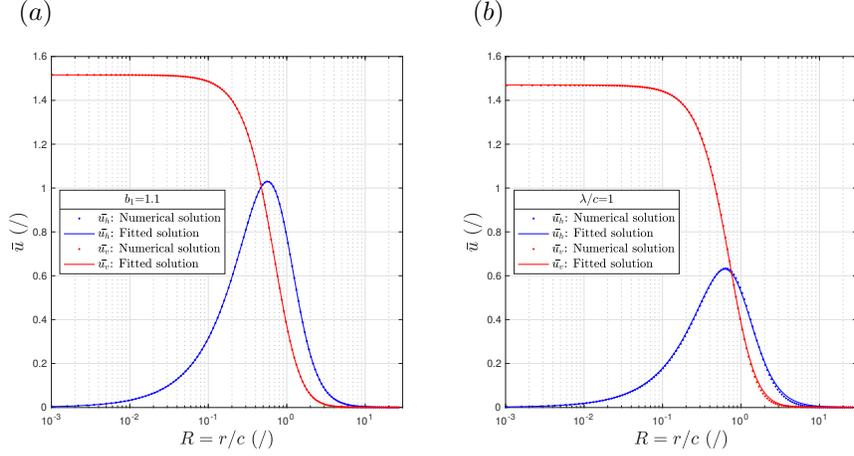


Figure 7: Fitted profiles of the normalized NoS displacement components \bar{u}_h and \bar{u}_v vs. the scaled radial distance $R = r/c$ obtained in the cases of: (a) a power compressibility model (Eq. (41)) with $b_1 = 1.1$; (b) an exponential compressibility model (Eq. (41)) with $\lambda/c = 1$.

3.1.4. Characterizing the Basin Compressibility Model Heterogeneity

In order to extend the NoS Eqs. (45) to the heterogeneity conditions represented by the compressibility models (41) and (43) it is necessary to derive closed-form expressions of the coefficients α_h , β_h , α_v , and β_v as functions of the parameters b_1 and λ/c . To do so, it is important to first identify the intervals of variability of b_1 and λ .

In the case of the compressibility model (41), one needs to recall the constraint (32) and derive a condition similar to inequality (44) for the homogeneous case. The following inequality is thus imposed:

$$z_{max} = \left[\frac{(\rho_s - \rho_w) \cdot g}{a_1 \cdot b_1} \right]^{\frac{1}{b_1 - 1}} \geq 10 \cdot c \quad (48)$$

The last relationship cannot be made explicit with respect to b_1 . However, by extracting the term $a_1 \cdot b_1$ from Equation (40) and substituting it in (48) provides:

$$c_{M,1}^* \geq c_{M,1min}^* = \frac{(b_1 - 1) \cdot 10^{b_1 - 1}}{(\rho_s - \rho_w) \cdot g \cdot c} \quad (49)$$

Inequality (49) quantifies the minimum value of the compressibility $c_{M,1}^*$ for any given value of $b_1 > 1$. These conditions are graphed in Figure 8 for several depth

450 values. Each profile delimits the feasible region of all possible combinations of
 451 $c_{M,1}^*$ and b_1 . While Figure 8 indicates b_1 has no upper bound, typical values
 452 of it are between 1 and 1.5. Indeed (see Eq. (30)), b_1 represents the reduction
 453 in order of magnitude of c_M per order of magnitude of depth increase. Such
 454 effect is graphed in Figure 9a, which shows a series of profiles of c_M vs. z for
 455 increasing values of b_1 . The latter represents the negative slope of the c_M vs. z
 456 profile on a double-log plot. A value $b_1=3$, for example, implies that the basin
 457 compressibility decreases by as many as 1×10^3 times from a depth of 200 m,
 458 down to a depth of 2000 m, which appears to be a far-fetched scenario.

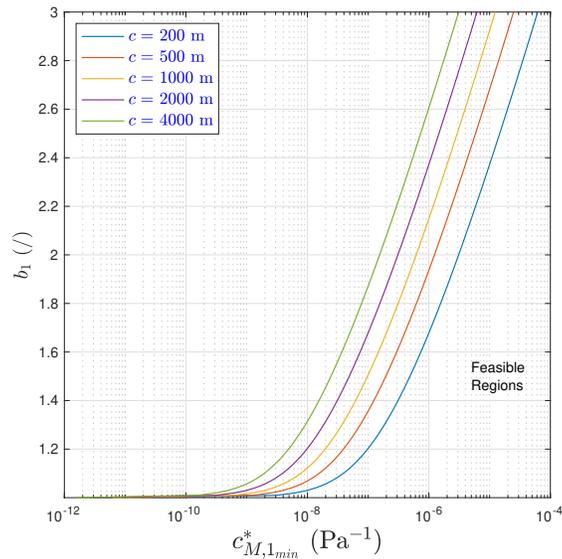


Figure 8: Feasible regions for the compressibility $c_{M,1}^*$ as function of the power coefficient b_1 for several values of the depth c (see condition (49)).

459 In addition, based on the profiles in Figure 8, b_1 values greater than 1.5 are
 460 viable only for relatively large values of the compressibility $c_{M,1}^*$. For example,
 461 for $c=2000$ m, a value of $b_1=2$ is possible only if $c_{M,1}^* \geq c_{M,1min}^* = 3 \times 10^{-7} \text{ Pa}^{-1}$,
 462 which would be representative of an unusually compressible sedimentary basin.

463 Figure 9b shows the ϕ vs. z profiles obtained using Equation (29), for a

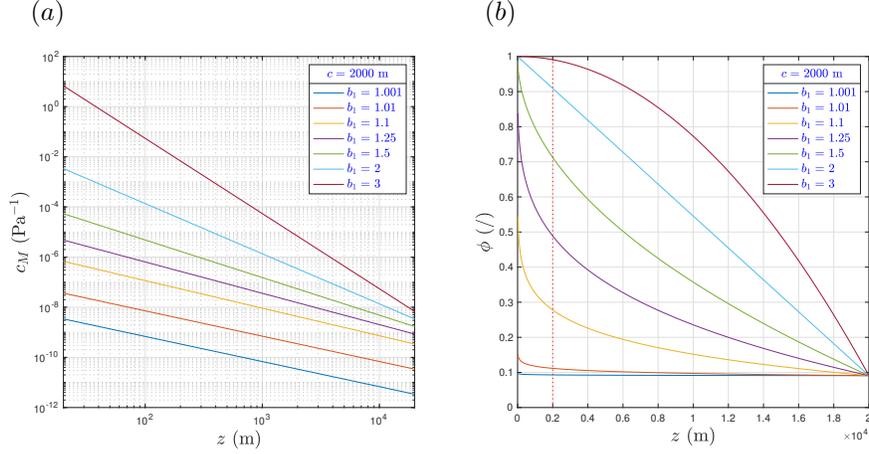


Figure 9: Profiles of (a) c_M vs. z and (b) ϕ vs. z according to a power model with increasing values of b_1 , for a reference NoS depth $c = 2000$ m. In each instance, a $c_{M,1}^*$ value equal to $1.1 \cdot c_{M,1,min}^*$ (see Eq. (49)) is selected.

464 reference depth $c = 2000$ m, different values of b_1 , and assuming $c_{M,1}^*$ values
 465 slightly larger than $c_{M,1,min}^*$ (see (49)). One can observe that, for values of b_1
 466 above 1.5 the porosity results very large even at depths of the order of c or less,
 467 which appears to be quite unrealistic. While this analysis will consider a range
 468 for b_1 values between 1 and 2, it is thus important to bear in mind that values
 469 of such parameter above 1.5 do not seem quite realistic.

470 With respect to the compressibility model (41), any positive value of λ pro-
 471 duces a viable distribution of $c_M(z)$ that does not violate any porosity con-
 472 straints, of course provided that $0 \leq \phi_{min} \leq \phi_0 \leq 1$. Therefore λ can theoret-
 473 ically vary over several orders of magnitude. Still, there appear to be practical
 474 limitations for the selection of λ . Figure 10 shows profiles of c_M and ϕ vs. z
 475 according to an exponential model (Eqs. (33) and (36)) with porosities $\phi_0=0.45$
 476 and $\phi_{min}=0.05$, and increasing values of λ . One can observe that values of
 477 λ lower than c produce a basin compressibility that varies dramatically along
 478 the depth (λ is proportional to the negative slope of the c_M vs. z profile on a
 479 semi-log plot), with extremely high values at shallow depth, and unrealistically
 480 low values at large depth. While this analysis will consider a range of λ values

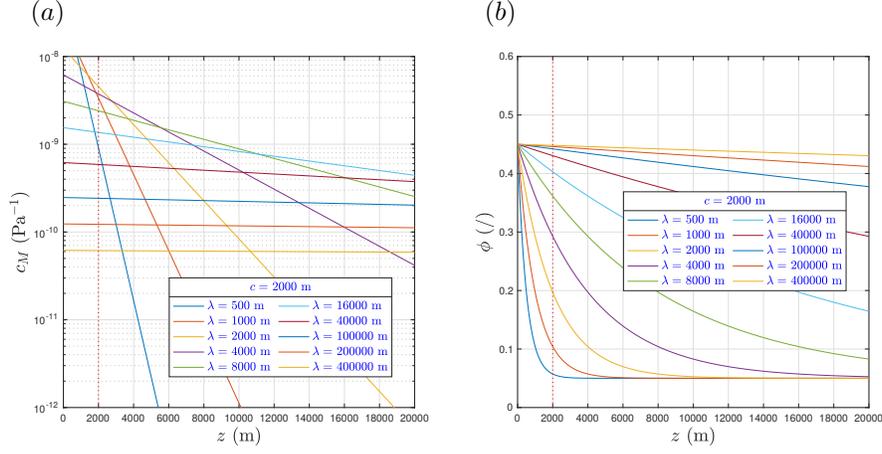


Figure 10: Profiles of (a) c_M vs. z and (b) ϕ vs. z according to an exponential model with increasing values of λ , for a reference NoS depth $c = 2000$ m. In each instance, the porosity is assumed to decrease from a surficial value of 0.45 to 0.05 at large depth.

481 between $0.25 \cdot c$ and $200 \cdot c$, one must be aware that scenarios where $\lambda \leq c$ are
 482 seemingly unrealistic.

483 3.1.5. Fitting Parameter Functions

484 In order to derive close form expressions of the coefficients α_h , β_h , α_v , and
 485 β_v as function of the parameters b_1 , for the compressibility model (41), and
 486 λ' , for the compressibility model (43), the FE model SUBAXS is run under
 487 the numerical setup presented in Section 3.1.1 for a series of heterogeneous c_M
 488 scenarios identified by a set of b_1 and λ' values. For each of these scenarios, the
 489 normalized surface displacement components obtained numerically are fitted by
 490 the normalized NoS Eqs. (45) by applying systematically the regression approach
 491 presented in Section 3.1.3. The regression results are presented in Tables 1
 492 and 2. In the case of the compressibility model (41), 11 values of b_1 are selected,
 493 spanning between 1.001 and 2. In the case of the compressibility model (43),
 494 25 values of λ' are selected, spanning between 0.25 and 200.

495 The analysis of Tables 1 and 2 reveals that all coefficients tend to vary
 496 smoothly and regularly, which suggests it is possible to derive closed-form ex-

Table 1: Fit coefficients α_h , β_h , α_v , and β_v calculated by minimizing Eqs. (47) for power compressibility laws (Eq. 41) characterized by the b_1 values given in the first column.

b_1	α_h	β_h	α_v	β_v
(/)	(/)	(/)	(/)	(/)
1.001	2.99734	-2.00225	1.49669	-2.00432
1.010	3.01676	-2.00602	1.49865	-2.00662
1.050	3.10309	-2.02266	1.50686	-2.01636
1.100	3.21097	-2.04310	1.51600	-2.02741
1.150	3.31875	-2.06315	1.52393	-2.03718
1.200	3.42631	-2.08281	1.53066	-2.04568
1.250	3.53361	-2.10208	1.53623	-2.05288
1.500	4.06324	-2.19262	1.54758	-2.06925
1.750	4.57535	-2.27356	1.53386	-2.05236
2.000	5.06298	-2.34510	1.49829	-2.00229

497 pressions of each of them as a function of the parameters b_1 and λ' using a
498 non-linear regression approach. This is achieved by employing the same trust-
499 region-reflective algorithm (Coleman and Li, 1996) adopted in Section 3.1.3.

500 Particular care is taken in the selection of the regression models. In the
501 case of the data presented in Table 1, a polynomial equation is adopted. The
502 corresponding expressions for the fitting functions are a follows:

$$\begin{aligned}
\alpha_h(b_1) &= +0.72830 + 2.35740 \cdot b_1 - 0.09090 \cdot b_1^2 \\
\beta_h(b_1) &= -1.50392 - 0.57540 \cdot b_1 + 0.07749 \cdot b_1^2 \\
\alpha_v(b_1) &= +0.98655 + 0.83514 \cdot b_1 - 0.36083 \cdot b_1^2 + 0.03561 \cdot b_1^3 \quad (50) \\
\beta_v(b_1) &= -1.47798 - 0.78966 \cdot b_1 + 0.26372 \cdot b_1^2 \\
1 &< b_1 \leq 2
\end{aligned}$$

503 The regression results are also visualized in Figure 11. Note that (Eqs. 50) the
504 polynomial degree on b_1 is 2 for the three coefficients α_h , β_h , and β_v , whereas for
505 the coefficient α_v a degree equal to 3 is necessary. For all coefficients, the regres-

506 sion produces a coefficient of determination $R^2 \cong 1$, which indicates a practically
 507 perfect fit to the data.

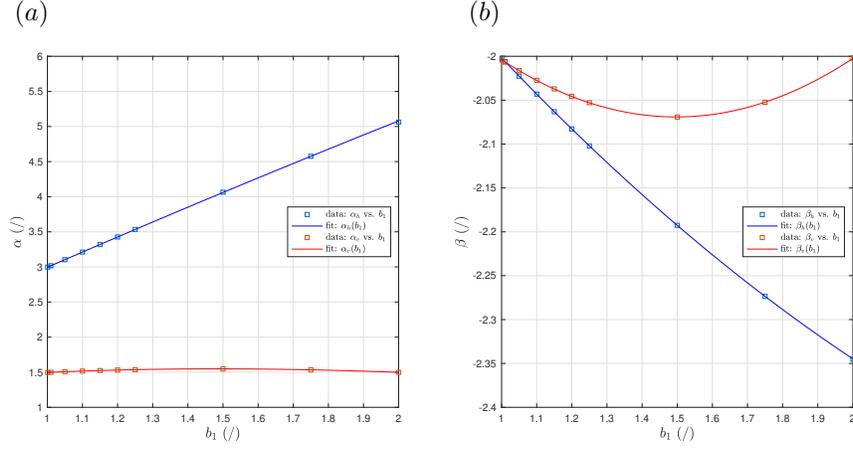


Figure 11: Fitted profiles for the coefficients (a) α_h and α_v , and (b) β_h and β_v , as functions of the power coefficient b_1 . The expressions for the fitting functions are given in Eqs. (50).

507

508 The data given in Table 2 show a more irregular behaviour than those in
 509 Table 1, and thus require devising a more complex regression model. In such
 510 case, the chosen fitting type function for each of the coefficients α_h , β_h , α_v and
 511 β_v , is the following:

$$f(\lambda') = q + \sum_{i=1}^4 m_i \cdot \lambda'^{p_i} \quad (51)$$

512 where q is a fixed constant, m_i and p_i ($i=1, \dots, 4$) are regression coefficients, with
 513 $p_i < 0$. The model (51) consists of a linear combination of four power functions
 514 plus a constant. The choice of the model (51) is driven by the observation that,
 515 for large values of λ' , the compressibility $c_M(z)$ tends to be homogeneous (see
 516 Figure 10a) and thus the modified NoS normalized displacement Eqs. (45) must
 517 tend asymptotically to Eqs. (39). For this to happen, α_h and α_v should tend
 518 to 1, and β_h and β_v should tend to -1.5 for $\lambda' \rightarrow \infty$, which is confirmed by the
 519 regression results reported in Table 2.

520 Adopting power functions with negative exponents (*i.e.* $m_i \cdot \lambda'^{p_i}$) allows for
 521 ensuring that any linear combination of them will tend asymptotically to zero,

522 so that $f(\lambda') \rightarrow q$ for $\lambda' \rightarrow \infty$. Therefore, in order to ensure that the regression
 523 models may fit the data in Table 2, a constant value $q = 1$ is imposed to fit
 524 the coefficients α_h and α_v , and a constant value of $q = -1.5$ is imposed for the
 coefficients β_h and β_v .

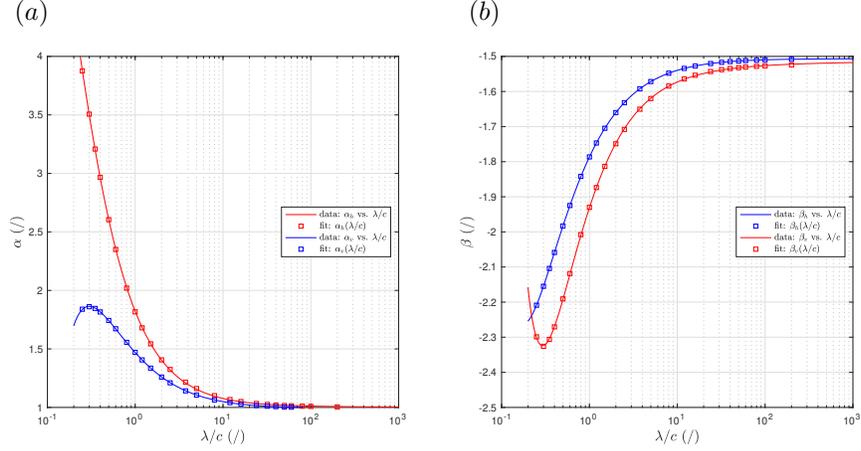


Figure 12: Fitted profiles for the coefficients (a) α_h and α_v , and (b) β_h and β_v , as functions of the coefficient λ scaled to the NoS depth c . The expressions for the fitting functions are given in Eqs. (52).

525

526 The regression results are plotted in Figure 12. The corresponding expres-
 527 sions for the fitting functions are the following:

$$\begin{aligned}
 \alpha_h(\lambda') &= +1.0 + 0.09695 \cdot \lambda'^{-0.43427} - 0.14667 \cdot \lambda'^{-0.66569} + \\
 &\quad + 1.23850 \cdot \lambda'^{-1.17592} - 0.36648 \cdot \lambda'^{-1.57385} \\
 \beta_h(\lambda') &= -1.5 - 0.00702 \cdot \lambda'^{-0.00658} + 0.00663 \cdot \lambda'^{-0.50859} + \\
 &\quad - 0.39860 \cdot \lambda'^{-1.01653} + 0.11240 \cdot \lambda'^{-1.51377} \\
 \alpha_v(\lambda') &= +1.0 - 0.02142 \cdot \lambda'^{-0.20560} + 0.02882 \cdot \lambda'^{-0.63825} + \quad (52) \\
 &\quad + 0.81722 \cdot \lambda'^{-1.08414} - 0.35519 \cdot \lambda'^{-1.50920} \\
 \beta_v(\lambda') &= -1.5 - 0.02460 \cdot \lambda'^{-0.06125} - 0.11286 \cdot \lambda'^{-0.63908} + \\
 &\quad - 0.49834 \cdot \lambda'^{-1.22379} + 0.20450 \cdot \lambda'^{-1.71945} \\
 \lambda &\geq 0.25
 \end{aligned}$$

528 Even in this case, the regression produces a coefficient of determination $R^2 \cong 1$
 529 for all coefficients, which indicates a practically perfect fit to the data.

530 4. Land Subsidence Surrogate Model

531 The surrogate NoS Eqs. (46) represent Green functions that can be used to
 532 calculate the surface displacement field associated with any generic pore pres-
 533 sure change distribution occurring in the subsurface. Based on the assumption
 534 of linear elasticity, the principle of linear superposition holds, and the surface
 535 displacement components (U_x, U_y, U_z) at any generic location (x, y) and time t
 536 are given by the following volume integrals:

$$\begin{aligned}
 U_x(x, y, t) &= \int_{\Omega} \frac{c_M^*(c) \cdot (1 - \nu)}{\pi \cdot c^2} \cdot \alpha_h \cdot \frac{r \cdot \eta_x}{c} \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_h} \cdot \Delta p_t \cdot d\Omega \\
 U_y(x, y, t) &= \int_{\Omega} \frac{c_M^*(c) \cdot (1 - \nu)}{\pi \cdot c^2} \cdot \alpha_h \cdot \frac{r \cdot \eta_y}{c} \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_h} \cdot \Delta p_t \cdot d\Omega \quad (53) \\
 U_z(x, y, t) &= \int_{\Omega} \frac{c_M^*(c) \cdot (1 - \nu)}{\pi \cdot c^2} \cdot \alpha_v \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_v} \cdot \Delta p_t \cdot d\Omega
 \end{aligned}$$

537 where Ω represents a 3D region of the subsurface where a pore pressure Δp
 538 change occurs (*e.g.* an aquifer or a reservoir). Note that $\Delta p_t = \Delta p(x', y', c, t)$
 539 with $(x', y', c) \in \Omega$, and $d\Omega = dx' dy' dc$. In Eqs. (53), r and (η_x, η_y) are the
 540 length and the cosine directors of the 2D vector $(x - x', y - y')$.

541 For a compressibility power model, $c_M^*(c)$ is given by Equation (40), and
 542 Eqs. (53) can be rearranged to:

$$\begin{aligned}
 U_x(x, y, t) &= e_1 \cdot \alpha_h(b_1) \cdot \int_{\Omega} \frac{r \cdot \eta_x \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_h(b_1)}}{c^{b_1+3}} \cdot \Delta p_t \cdot d\Omega \\
 U_y(x, y, t) &= e_1 \cdot \alpha_h(b_1) \cdot \int_{\Omega} \frac{r \cdot \eta_y \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_h(b_1)}}{c^{b_1+3}} \cdot \Delta p_t \cdot d\Omega \quad (54) \\
 U_z(x, y, t) &= e_1 \cdot \alpha_v(b_1) \cdot \int_{\Omega} \frac{\left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_v(b_1)}}{c^{b_1+2}} \cdot \Delta p_t \cdot d\Omega
 \end{aligned}$$

543 where $e_1 = \frac{(b_1-1) \cdot (1-\nu)}{\pi \cdot a_1 \cdot b_1}$, and the coefficients $\alpha_h(b_1)$, $\beta_h(b_1)$, $\alpha_v(b_1)$ and $\beta_v(b_1)$
 544 are given by the Eqs. (50).

545 For a compressibility exponential model, $c_M^*(c)$ is given by Equation (42),
 546 and Eqs. (53) become:

$$\begin{aligned}
 U_x(x, y, t) &= e_2 \cdot \int_{\Omega} \frac{r \cdot \eta_x \cdot e^{-\frac{c}{\lambda}} \cdot \alpha_h\left(\frac{\lambda}{c}\right)}{c^3} \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_h\left(\frac{\lambda}{c}\right)} \cdot \Delta p_t \cdot d\Omega \\
 U_y(x, y, t) &= e_2 \cdot \int_{\Omega} \frac{r \cdot \eta_y \cdot e^{-\frac{c}{\lambda}} \cdot \alpha_h\left(\frac{\lambda}{c}\right)}{c^3} \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_h\left(\frac{\lambda}{c}\right)} \cdot \Delta p_t \cdot d\Omega \quad (55) \\
 U_z(x, y, t) &= e_2 \cdot \int_{\Omega} \frac{e^{-\frac{c}{\lambda}} \cdot \alpha_v\left(\frac{\lambda}{c}\right)}{c^2} \cdot \left[1 + \left(\frac{r}{c}\right)^2\right]^{\beta_v\left(\frac{\lambda}{c}\right)} \cdot \Delta p_t \cdot d\Omega
 \end{aligned}$$

547 where $e_2 = \frac{(\phi_0 - \phi_{min}) \cdot (1 - \nu)}{\pi \cdot (\rho_s - \rho_w) \cdot g \cdot \lambda}$ and the coefficients $\alpha_h\left(\frac{\lambda}{c}\right)$, $\beta_h\left(\frac{\lambda}{c}\right)$, $\alpha_v\left(\frac{\lambda}{c}\right)$ and
 548 $\beta_v\left(\frac{\lambda}{c}\right)$ are given by the Eqs. (52).

549 4.1. Model Implementation and Testing

550 The implementation of the surrogate land subsidence model relies on the
 551 solution of the integrals (54-55), which is carried out numerically by discretizing
 552 the domain Ω with an irregular grid whose resolution needs to be generally varied
 553 in relation to the spatial gradients of Δp . Note that Ω does not represent the
 554 full subsurface system, but only the portion of it where a pore pressure change
 555 is observed or simulated.

556 To validate the model, the case of a horizontal disk-shaped reservoir (Fig. 14)
 557 is considered. Such a reservoir has a 2000 m radius, a 20 m thickness, an average
 558 depth of 2000 m, and is subject to a uniform pore pressure change of 2 MPa.
 559 Three hypothetical sedimentary basin scenarios are considered: a homogeneous
 560 system with $c_M^* = 1 \times 10^{-9} Pa^{-1}$; a heterogeneous system characterized by the
 561 compressibility model (41) with $c_{M,1}^* = 1 \times 10^{-9} Pa^{-1}$ and $b_1 = 1.0291$; and
 562 a heterogeneous system characterized by the compressibility model (43) with
 563 $c_{M,2}^* = 1 \times 10^{-9} Pa^{-1}$ and $\lambda = 3850 m$. The $c_M(z)$ profiles associated with
 564 these three scenarios are graphed in Figure 13.

565 The disk-shaped reservoir is discretized with a mesh consisting of $N_e =$
 566 4532 prismatic elements with triangular base, which allows for splitting each
 567 of the integrals (53) into the sum of as many terms. The surface displacement
 568 components are calculated at the N_n nodes of a surface grid, either regular or

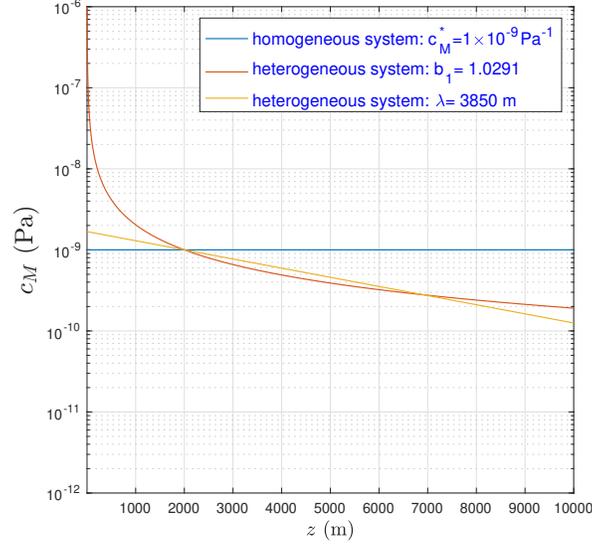


Figure 13: c_M vs. z profiles for a homogeneous basin with $c_M^* = 1 \times 10^{-9} Pa^{-1}$, and two heterogeneous basins with $b_1 = 1.0291$ (Eq. 41), and $\lambda = 3850 m$ (Eq. 43). The c_M^* value at the depth $c = 2000 m$ is the same in all scenarios.

569 irregular, as represented in Figure 14. Note that the reservoir mesh and the
 570 surface grid are independent from one another, and it is possible to reduce the
 571 surface grid to just a few points of interest where one might want to evaluate
 572 the displacement (U_x, U_y, U_z) .

573 Using a matrix notation, the surface displacements can be expressed as:

$$\begin{bmatrix} \mathbf{U}_x \\ \mathbf{U}_y \\ \mathbf{U}_z \end{bmatrix} = \begin{bmatrix} \mathbf{M}_x \\ \mathbf{M}_y \\ \mathbf{M}_z \end{bmatrix} \cdot \mathbf{F} \quad (56)$$

574 where: \mathbf{U}_x , \mathbf{U}_y and \mathbf{U}_z are three $N_n \times 1$ vectors including the displacement components
 575 at the surface points; \mathbf{F} is a $N_e \times 1$ vector, whose generic j th component
 576 equals the product $V_j \cdot \Delta p_j$, where V_j is the volume of element j ($j=1, \dots, N_e$),
 577 and Δp_j is average pore pressure change in it; \mathbf{M}_x , \mathbf{M}_y , and \mathbf{M}_z are $N_n \times N_e$
 578 matrices, whose generic $m_{i,j}$ coefficient are linked to the values of NoS surface

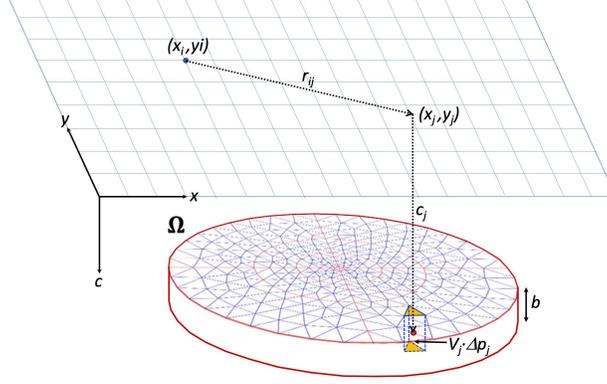


Figure 14: Schematic of the NoS based simulator, representing the reservoir system and the surface domain (see Eqs. (49)).

579 displacement for the radial distance $r_{i,j}$ between the grid node i ($i=1,\dots,N_n$) and
 580 the element j 's centroid, and the element j 's depth c_j (Figure 14).

581 In the case of a c_M compressibility power model, these coefficients are:

$$\begin{aligned}
 m_{x_{i,j}} &= e_1 \cdot \alpha_h(b_1) \cdot \frac{r_{i,j} \cdot \eta_{x_{i,j}}}{c_j^{b_1+3}} \cdot \left[1 + \left(\frac{r_{i,j}}{c_j} \right)^2 \right]^{\beta_h(b_1)} \\
 m_{y_{i,j}} &= e_1 \cdot \alpha_h(b_1) \cdot \frac{r_{i,j} \cdot \eta_{y_{i,j}}}{c_j^{b_1+3}} \cdot \left[1 + \left(\frac{r_{i,j}}{c_j} \right)^2 \right]^{\beta_h(b_1)} \\
 m_{z_{i,j}} &= e_1 \cdot \alpha_v(b_1) \cdot \frac{1}{c_j^{b_1+2}} \cdot \left[1 + \left(\frac{r_{i,j}}{c_j} \right)^2 \right]^{\beta_h(b_1)}
 \end{aligned} \tag{57}$$

582 whereas in the case of a c_M compressibility exponential model, these coefficients
 583 are:

$$\begin{aligned}
 m_{x_{i,j}} &= e_2 \cdot \alpha_h\left(\frac{\lambda}{c_j}\right) \cdot e^{-\frac{c_j}{\lambda}} \cdot \frac{r_{i,j} \cdot \eta_x}{c_j^3} \cdot \left[1 + \left(\frac{r_{i,j}}{c_j} \right)^2 \right]^{\beta_h\left(\frac{\lambda}{c_j}\right)} \\
 m_{y_{i,j}} &= e_2 \cdot \alpha_h\left(\frac{\lambda}{c_j}\right) \cdot e^{-\frac{c_j}{\lambda}} \cdot \frac{r_{i,j} \cdot \eta_y}{c_j^3} \cdot \left[1 + \left(\frac{r_{i,j}}{c_j} \right)^2 \right]^{\beta_h\left(\frac{\lambda}{c_j}\right)} \\
 m_{z_{i,j}} &= e_2 \cdot \alpha_v\left(\frac{\lambda}{c_j}\right) \cdot e^{-\frac{c_j}{\lambda}} \cdot \frac{1}{c_j^2} \cdot \left[1 + \left(\frac{r_{i,j}}{c_j} \right)^2 \right]^{\beta_v\left(\frac{\lambda}{c_j}\right)}
 \end{aligned} \tag{58}$$

584 Eq. (56), together with Eqs. (57-58), indicate that the surrogate surrogate land
585 subsidence model relies substantially on a “response-matrix” approach, where
586 the coefficients of the matrix $[\mathbf{U}_y \mathbf{U}_y \mathbf{U}_z]^T$ depend on the characteristics of the
587 mesh discretizing Ω , and the modified NoS Eqs. (45) which in turn account
588 for the basin compressibility model. It is worth noting that, in the numerical
589 calculation of the integrals (54-55), the resolution of the reservoir mesh needs
590 to be high enough to minimize the truncation errors introduced by neglecting
591 the variability of $r_{i,j}$ and c_j within each element j .

592 The results of the disk-shaped reservoir tests are summarized in Figure 15,
593 which shows the horizontal and vertical surface displacement components along
594 the radial distance from the center of the cylindric reservoir, for three investi-
595 gated $c_M(z)$ scenarios. In each subpanel, surface displacements obtained with
596 the surrogate semi-analytical model are compared with those from the numeri-
597 cal model SUBAXS. All tests indicate a satisfactory match between the results
598 of the two approaches, suggesting the surrogate semi-analytical model is suffi-
599 ciently accurate.

600 In the homogeneous case (Figs. 15a-b), the surrogate model is truly analyt-
601 ically based since the displacements are calculated assuming a heterogeneous
602 basin with an exponential compressibility model with a very large value of λ .
603 Under these conditions, the fitting functions (52) are such that the surrogate
604 NoS Eqs. (45) are the same as the analytical NoS Eqs. (39). In this case, an
605 analytical solution for a horizontal disk-shaped reservoir subject to a uniform
606 pore pressure change was also derived by Geertsma (1973), and that solution is
607 used here to benchmark the surrogate model (Figs. 15a-b).

608 Results for the heterogeneous basins (Figs. 15c-f) demonstrate that both
609 the horizontal and the vertical surface displacement are larger than those for
610 the homogeneous basin (Figs. 15a-b). This is due to the differences in the
611 distribution of $c_M(z)$ for the three investigated scenario (see Fig. 13). In these
612 instances, the compressibility c_M^* at the reservoir depth c is the same, but the
613 degree of heterogeneity is significantly different, with both systems exhibiting
614 a larger compressibility in the overburden and a lower one in the underburden

615 than in the homogeneous case. Consequently, the land subsidence, which reflects
616 the three-dimensional effect of propagation of the aquifer compaction up to the
617 surface, is larger for a system that has a more compressible overburden, which
618 happens consistently with the compressibility models shown in Figure 13). The
619 latter shows also that the power model exhibits a much larger compressibility
620 in the overburden than the exponential model, which explains the larger surface
621 displacements observed in Figure 15c-d as compared to those in Figure 15e-f.

622 5. Conclusions

623 The surrogate land subsidence model presented in this work applies to nor-
624 mally consolidated sedimentary basins, where the compressibility c_M decreases
625 along the depth according to either power or exponential laws. In Section 2,
626 compressibility models of such types have been investigated and simple equa-
627 tions to derive $c_M(z)$ laws based on overburden gradient data have been derived.
628 It is worth pointing that these equations rely on the assumption of “soft soil”,
629 that is a porous medium with a compressibility significantly larger (at least 10
630 times) than the particle compressibility c_s .

631 The surrogate land subsidence model applies to conditions of linear elasticity
632 and stems from a semi-analytical form of the classic NoS equations extended
633 to heterogeneous systems. Such a model is truly a hybrid between a numeri-
634 cal model and an analytical one, as it uses closed-form parametric expressions
635 for the NoS equations, with parameters that are retrieved numerically using a
636 systematic combination of numerical test results and non-linear regressions as
637 functions of the basin compressibility model parameters.

638 While the examples presented here consider specifically power or exponential
639 $c_M(z)$ models, it appears quite possible to apply the same approach to develop
640 semi-analytical NoS equations for different compressibility model types, or even
641 for under-consolidated basins during loading-unloading cycles.

642 One of the strengths of this model lies in its computational parsimony. Built
643 upon the NoS equations and the principle of linear superposition, the model is

644 formulated as an explicit "response-matrix" scheme, where the forcing terms
645 depend on the spatial distribution of the change in pore pressure in the subsur-
646 face, and the matrix coefficients depend on the selected basin compressibility
647 model. The model results quite easy to implement, and can be used estimate
648 the land surface displacement associated with any simulated or observed 3D
649 pore pressure change field. As such, the surrogate model is particularly suited
650 for screening calculations, uncertainty quantification and risk analysis for sub-
651 surface development in sedimentary basins.

652 It is important to recognize that for more general real-world conditions, for
653 example basins in which c_M varies not only vertically but also horizontally,
654 or with more complex (non-linear, elasto-plastic, etc.) constitutive laws, fully
655 numerical models remain the best choice, although their application may be
656 hindered by the limited availability of data needed for their calibration and
657 validation.

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Table 2: Fit coefficients α_h , β_h , α_v , and β_v calculated by minimizing Eqs. (47) for exponential compressibility laws (Eq. 43) characterized by the λ' values given in the first column.

λ'	α_h	β_h	α_v	β_v
(/)	(/)	(/)	(/)	(/)
0.25	3.87569	-2.20892	1.83910	-2.29899
0.30	3.50634	-2.15502	1.86068	-2.32587
0.35	3.20810	-2.10415	1.84590	-2.30632
0.40	2.96651	-2.05858	1.81586	-2.27062
0.50	2.60465	-1.98320	1.74301	-2.19087
0.60	2.34999	-1.92486	1.67230	-2.11877
0.80	2.01967	-1.84198	1.55617	-2.00776
1.00	1.81680	-1.78647	1.47040	-1.93010
1.20	1.68035	-1.74680	1.40604	-1.87369
1.50	1.54339	-1.70477	1.33571	-1.81343
2.00	1.40640	-1.66011	1.25921	-1.74900
2.50	1.32438	-1.63189	1.21032	-1.70810
3.75	1.21548	-1.59237	1.14161	-1.65048
5.00	1.16131	-1.57175	1.10575	-1.62013
8.00	1.10067	-1.54783	1.06422	-1.58460
12.00	1.06714	-1.53422	1.04059	-1.56417
16.00	1.05043	-1.52734	1.02862	-1.55375
24.00	1.03375	-1.52040	1.01656	-1.54321
32.00	1.02543	-1.51691	1.01049	-1.53789
40.00	1.02044	-1.51482	1.00683	-1.53468
50.00	1.01645	-1.51313	1.00390	-1.53211
60.00	1.01379	-1.51201	1.00194	-1.53039
80.00	1.01047	-1.51061	0.99949	-1.52823
100.00	1.00848	-1.50976	0.99802	-1.52693
200.00	1.00450	-1.50807	0.99507	-1.52433

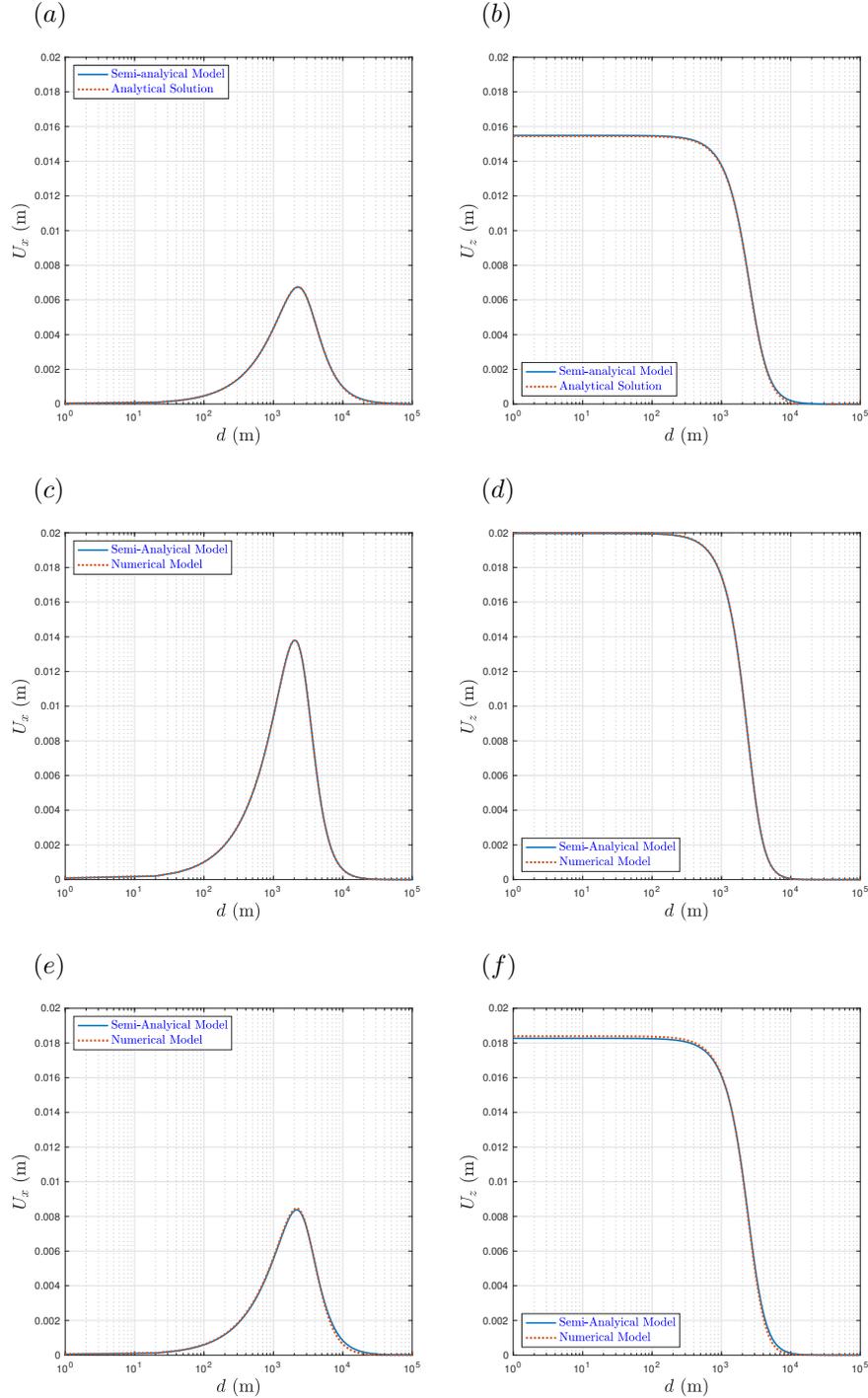


Figure 15: Profiles of the surface displacement components u_r and u_z vs. the radial distance r , obtained using the surrogate semi-analytical model and the numerical model SUBAXS assuming (subpanels (a-b)) an homogeneous system, and and a heterogeneous system with (subpanels (c-d)) $b_1 = 1.0291$ and (subpanels (e-f)) $\lambda = 3850$ m. Note that in the homogeneous case (subpanels (a-b)) the surrogate model is truly based on the classic NoS equations (39), and its solution is compared to the analytical model derived by Geertsma (1973).