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Cheng, F., Watton, P.N. orcid.org/0000-0002-5531-5953, Kurobe, M. et al. (4 more authors) (Submitted: 2021) A mechanobiological model of the urinary bladder : integrative modelling of outlet obstruction. Journal of the Mechanical Behavior of Biomedical Materials. ISSN 1751-6161 (Submitted)

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# A mechanobiological model of the urinary bladder: integrative modelling of outlet obstruction

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#### Abstract

We present the first model to simulate the adaptive growth and remodeling (G&R) response of the bladder wall to bladder outlet obstruction (BOO). The model is calibrated and validated with an experimental rodent model of BOO. The bladder is modeled as a multi-layered, nonlinear elastic spherical membrane using a constrained mixture model that includes both passive and active components. The mechanical model is integrated with a shorter time scale micturition model that accounts for the active mechanics of voiding and dependence of flowrate on urethral resistance. Over a second time scale, constituents are configured and subsequently remodel to achieve a homeostatic state at the onset of voiding. Simulations of remodeling in response to the tenfold increase in outlet resistance arising from BOO, predict an initial loss of voiding capacity. Subsequent smooth muscle cell (SMC) hypertrophy enables the bladder wall to generate sufficient active tension to restore

Preprint submitted to Journal of the Mechanical Behaviour of Biomedical MaterialsSeptember 15, 2021

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voiding functionality. Consistent with the experimental observations, the model predicts: hypertrophy of SMC and enlargement of the bladder over realistic timescales; collagen remodeling to maintain its role as a protective sheath; and increased voiding duration with lower average flow rate. This integrative G&R modeling approach provides fundamental insight into the adaptation of the bladder's structural-functional relationship in response to outlet obstruction.

Keywords: bladder, growth, remodelling, biomechanics, mechanobiology

## 1 1. Introduction

The function of the bladder is to serve as a low pressure reservoir for stor-2 ing urine and then efficiently expel this urine at a convenient time. Bladder outlet obstruction (BOO) is a urodynamic diagnosis that signifies the exis-4 tence of increased urethral resistance, sufficient to alter the voiding process. 5 Over time, BOO can lead to changes in the bladder's storage capacity as 6 well. A clinical diagnosis of BOO is based on the presence of specific changes 7 to the bladder pressure flow relationship that are defined in the International 8 Continence Society (ICS) Standardisation report and can be measured using 9 urodynamic studies [1]. The mechanical causes of BOO include an enlarged 10 prostate, such as induced by benign prostatic hyperplasia (BPH) [2, 3, 4] 11 and urethral narrowing from scarring or strictures [5, 6, 7]. BPH induced 12 BOO is increasingly prevalent for men over the age of 50, with 50 - 75%13 of men over age 50 and 80% of men over age 70 experiencing lower urinary 14 tract symptoms (LUTS) as a result of BPH[8], voiding hesitancy, prolonged 15 micturition, incomplete bladder emptying, increased urination frequency, ur-16

gency, and incontinence, which dramatically lower the quality of life, both physically and psychologically [9]. Two-thirds or more of the men with BOO have storage problems where there is increased urinary frequency associated with urgency to void, and the majority of these patients have bladder overactivity that is measurable in urodynamic testing [10]. The economic burden of BPH induced BOO is significant; 4 billion dollars annually in 2006, a sum that will only increase as the US population continues to age [11].

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The structure of the bladder wall is often considered with respect to three 25 layers: the mucosa, the muscularis propria (herein referred to as the detrusor 26 smooth muscle (DSM) layer) and the adventitia. The mucosa is the inner-27 most layer and is composed of an urothelium, a basement membrane and a 28 lamina propria (LP) which contains a densely packed, interwoven network 29 of collagen fibers. The DSM is a composite of smooth muscle cell (SMC) 30 bundles intermixed with collagen and elastin fibers and the outer surface of 31 the bladder is formed of loose connective tissue commonly termed the ad-32 ventitia. During filling, the unfolding of the tissue layers allow the bladder 33 to expand under low pressure [12]. To void, the contraction of the muscle 34 cells is triggered to generate active stress and initiate flow by overcoming the 35 urethral resistance. 36

37

In silico models of the bladder that have been developed to date can, broadly
speaking, be classified into two main types: constitutive models [13, 14, 15,
16, 17, 18, 19, 12, 20, 21] and whole bladder micturition models [22, 23, 24,
25, 26, 27]. The constitutive models focus on the strain-stress relation for

the passive and, in some cases, active mechanical response, whilst the micturition models focus on simulating the pressure-flow relation of the bladder
during voiding.

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The bladder, like other soft tissues can alter its constituents and geome-46 try through a growth and remodeling process. Recently, we developed an 47 integrated constitutive model that combines a constrained-mixture model of 48 this G&R process for the bladder wall with a micturition model[28]. Us-49 ing this model, urodynamic curves can be interpreted with respect to the 50 underlying microstructure (and vice-versa), providing fundamental insight 51 into the structure-function relation of the bladder during filling and voiding. 52 This coupled micturition/GR model has the potential to provide insights into 53 bladder pathophysiology and its effect on bladder function. In the present 54 work, we extend this model to the BOO bladder. 55

56

In bladders with BOO, the urethral resistance increases, requiring the SMC 57 in the wall to generate larger pressures to void, inducing a growth and re-58 modeling (G&R) response that leads to changes in bladder size and tissue 59 composition [29]. While this G&R response can restore voiding, there can be 60 associated deficits in mechanical function such as weak stream, incomplete 61 emptying, and increased voiding frequency. The changes to bladder function-62 ality are intimately related to changes in the mechanics and microstructure 63 of the tissue. Although experimental and computational models of the G&R 64 process, can potentially provide insight into the evolving pathophysiology of 65 the BOO bladder, thus far, no computational models have been developed 66

<sup>67</sup> to simulate the G&R evolution of any bladder disease.

68

In the present work, we extend Cheng et al. [28] model to incorporate G&R 69 scheme and apply the model to simulate the adaptive response of the bladder 70 to BOO. An integrative interdisciplinary modelling approach is adopted in 71 which an experimental rat model of outlet obstruction is used to inform the 72 in silico model. The model is parameterized using data from a healthy rat 73 bladder, BOO is simulated by an increase in outlet resistance and competing 74 hypotheses for the adaptive response of the bladder to increased urethral flow 75 resistance are investigated. 76

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The structure of the paper is as follows: Section 2 details the experimental model, protocols for tissue characterization and computational methodology; Section 3 illustrates model simulations and compares predictions with experimental observations. Lastly, Section 4 concludes with a summary and critique of the model and provides an outlook for future research.

# 83 2. Methods

We utilise an integrative *in vivo in-vitro in-silico* modelling approach (see Fig. 1). An *in silico* model is developed that simulates the mechanics of the micturition cycle in healthy bladder and it's G&R in response to outlet obstruction. Where possible, model parameters are informed from *in vivo* pressure-flow experiments and *in vitro* planar biaxial testing coupled with multi-photon microscopy of the collagen fibers.



Figure 1: An integrative in vivo in-vitro in-silico modelling approach.

# 90 2.1. Experimental Studies of BOO Model

# 91 2.1.1. Creation of BOO model

Male Sprague Dawley rats were used for producing the experimental BOO 92 model [30]. Briefly, under isoflurane anesthesia, the bladder and the proximal 93 ure thra were exposed via a lower abdominal midline incision. A 4-0 silk 94 ligature was placed around the urethra and tied at the urethrovesical junction 95 level proximal to the urethral fenestration with a metal rod (outside catheter 96 diameter of 1.27 mm) placed alongside the urethra, and then the rod was 97 removed. The abdominal wound was closed. This ligation was maintained 98 in place throughout the duration of the experiments. Sham rats underwent 90 similar procedures without urethral ligation. 100

## <sup>101</sup> 2.1.2. In vivo measurements: pressure-flow study

Twenty four Sprague Dawley rats (twelve BOO and twelve SHAM) were 102 used in the cystometry (pressure-flow) studies, performed 4 weeks after induc-103 ing BOO, [30]. Under isoflurane anaesthesia, a PE-50 polyethylene catheter 104 (Clay-Adams, Parsippany, NJ) was inserted through the bladder dome and 105 a purse-string suture was placed tightly around the catheter. The implanted 106 catheter was exteriorized through the abdominal wall, and the wound was 107 closed with 4-0 silk sutures. After the surgery, the rats were placed in re-108 straining cages (W 80 mm  $\times$  L 300 mm  $\times$  H 150 mm, Yamanaka Chemical 109 Ind., Ltd, Osaka, Japan) and allowed to recover from isoflurane anaesthesia 110 for 1–2 h before starting cystometry. After recovery, a three-way stopcock 111 was used to connect the intravesical catheter to a pressure transducer (Trans-112 bridge 4M, World Precision Instruments, Sarasota, FL, USA) for recording 113 intravesical bladder pressure and to a syringe pump (*company*) for infusing 114

saline at a fixed flowrate. Because variability in bladder capacity among
BOO rats is typical of this model, saline was initially infused at 0.1 ml/min;
subsequently, the infusion rate was adjusted to 0.04–0.3 ml/min to obtain an
intercontraction interval around 10-15 min [31]. Intravesical pressure changes
were measured using data acquisition software (AD Instruments, Castle Hill,
NSW, Australia) at a sampling rate of 100 Hz using a PowerLab. Saline
infusion was continued until stable voiding cycles were established.

122

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Figure 2: Schematic representation of the pressure flow curve during the cystometry study

The recorded data was used to construct the pressure/flow curves (Fig. 2), from which the following parameters were evaluated: (i) maximum voiding pressure  $P_{max}^{voiding}$  (the peak pressure minus the basal pressure during each voiding cycle); (ii) maximum passive filling pressure  $P_{max}^{passive}$  (the pressure immediately after the reflex contraction minus the basal pressure; the basal pressure is the the passive pressure in the empty bladder and measured from

Quantities	symbol	SHAM	BOO
void volume $(ml)$	$V_{void}$	$0.84 \pm 0.03$	$0.82 \pm 0.12$
residual volume $(ml)$	$V_{residual}$	$0.02 \pm 0.008$	$1.2\pm0.23$
void duration (s)	$t_{void}$	$12 \pm 0.4$	$45 \pm 5$
max filling pressure (Pa)	$P_{max}^{passive}$	$300 \pm 80$	$280\pm70$
max void pressure (Pa)	$P_{max}^{voiding}$	$3900 \pm 220$	$8900 \pm 640$

Table 1: In vivo measured parameters for SHAM and BOO experimental models.

the lowest pressure during cystometry). We define the maximum active voiding pressure  $(P_{max}^{active})$  as the difference between maximum voiding pressure and maximum passive filling pressure, i.e.  $P_{max}^{active} = P_{max}^{voiding} - P_{max}^{passive}$ . Measured quantities are summarised in Table 1.

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Voided urine was collected using a plastic cup placed underneath the restraining cage and measured to determine the voided volume  $(V_{void})$ , and post-void residual volume  $V_v$  was collected and measured by draining the post-void bladder using the bladder catheter with gravity [30]. Bladder capacity  $(V_F)$  was calculated as the sum of voided and residual volumes. After the bladder was harvested, the ex-vivo unloaded width  $(W_0)$ , height  $(D_0)$ and thickness of the bladder were measured (see Tables. 2 and 3).

# <sup>142</sup> 2.2. Constitutive Modeling for the Bladder Wall Mechanics

The bladder wall experiences large displacements that are modeled as quasi-static and constrained to be isochoric (as the bladder is idealized as incompressible). In the absence of external body forces, the displacement

Sham	S01	S02	S03	S04	Average	STD
unloaded width $W_0$ (mm)	4.31	5.05	4.76	4.84	4.74	0.27
unloaded height $D_0$ (mm)	11.10	10.32	9.64	9.36	10.10	0.67
unloaded thickness (mm)	0.72	0.71	0.85	0.82	0.78	0.06

Table 2: Dimensions of Sham bladders (n=4)

BOO	B01	B02	B03	B04	Average	STD
unloaded width $W_O$ (mm)	7.92	8.40	9.38	10.08	8.95	0.84
unloaded height $D_0$ (mm)	19.14	17.39	13.75	15.35	16.41	2.04
unloaded thickness (mm)	1.61	1.53	1.98	1.10	1.56	0.36

Table 3: Dimensions of BOO bladders (n=4)

field therefore must satisfy the following equilibrium equation  $\nabla \cdot \underline{\sigma} = 0$ where  $\underline{\sigma}$  is the Cauchy stress tensor. We assume an additive decomposition of the stresses due to the passive and active components

$$\underline{\underline{\sigma}} = \underline{\sigma}_p + \underline{\underline{\sigma}_a}.\tag{1}$$

# 149 2.2.1. Kinematics

The Lagrangian formulation used in this work denotes the deformation 150 gradient as  $\underline{F}$ , and the right Cauchy-Green tensor as  $\underline{C} = \underline{F}^T \underline{F}$ . The tensor 151 invariants are  $I_1 = tr(\underline{C}), I_2 = (tr(\underline{C})^2 - tr(\underline{C}^2))/2$  and  $I_3 = det(\overline{C}) = 1$ . 152 The direction of the collagen fibers is denoted by the unit vector  $\boldsymbol{a}_c^i$  where i154 ranges over number of orientations at a point within the tissue. The stretch 155  $\lambda_{4c}^i$  in the fibre direction is

$$\left(\lambda_{4c}^{i}\right)^{2} = I_{4c}^{i} = \boldsymbol{a}_{c}^{i} \cdot \underline{\underline{C}} \boldsymbol{a}_{c}^{i}$$

$$\tag{2}$$

i.e., associated with  $I_{4c}^i$ , a pseudo-invariant of  $\underline{\underline{C}}$  and  $\boldsymbol{a}^i$ . Similarly, denoting the SMC direction by the unit vector  $\boldsymbol{a}_m$ , the stretch  $\lambda_{4m}$  in the SMC direction is

$$\left(\lambda_{4m}\right)^2 = I_{4m} = \boldsymbol{a}_m \cdot \underline{C} \boldsymbol{a}_m \tag{3}$$

## 159 2.2.2. Strain-energy functions

The strain energy function for the passive response of each layer L (where L = LP denotes lamina propria, L = DSM denotes the destrusor muscle layer and L = ADV denotes the advential layer) receives contributions from elastin, passive smooth muscle cells and collagen fibers (anisotropic components). Hence

$$\Psi_L = \Psi_{L,e}(I_1) + \sum_i \Psi^i_{L,c}(I^i_{4c}).$$
(4)

#### 165 Elastinous constitutents

<sup>166</sup> The isotropic components are modeled as a neo-Hookean material [32]:

$$\Psi_{L,e} = K_{L,e} \left( I_1 - 3 \right), \tag{5}$$

<sup>167</sup> with  $K_{L,e}$  being stiffness-like material constants.

#### 168 Collagenous constituents

The constitutive model for the collagen accounts for the experimental observation that collagen fibers have a distribution of waviness in the unloaded configuration and thus have a distribution of recruitment [33]. The strain energy function involves integrating the strain energy for a fiber  $(\tilde{\Psi}_{L,c}^{i})$ over the distribution of recruitment stretches  $(\rho_{RL}^{i})$ ,

$$\Psi_{L,c}(I_4^i) = m_{L,c} \cdot \sum_i \int_1^{\sqrt{I_4^i}} \tilde{\Psi}_{L,c}^i \left(\lambda_c^i\right) \rho_{RLc}^i \left(\lambda_{RLc}^i\right) d\lambda_{RLc}^i.$$
(6)



Figure 3: Schematic of triangular distribution of collagen recruitment stretch

where  $m_{L,c}$  is the (dimensionless) normalized mass density of collagen fibers that can adapt to simulate collagen growth/atrophy[34]. We model each individual fiber to have a linear relationship between its 1st Piola-Kirchoff stress and its stretch  $(\lambda_c^i)([35, 36])$ 

$$\tilde{\Psi}_{L,c}^{i}\left(\lambda_{c}^{i}\right) = \begin{cases} \frac{k_{L,c}^{i}}{2} \cdot \left(\lambda_{c}^{i}-1\right)^{2} & \lambda_{c}^{i} \geq 1\\ 0, & \text{otherwise} \end{cases}$$
(7)

where  $K_{L,c}$  is a stiffness-like material constant and the fibre stretch  $\lambda_c^i$  is given by

$$\lambda_c^i = \frac{\lambda_{4c}^i}{\lambda_{RLc}^i} \tag{8}$$

 $\lambda^{i}_{RLc} = \sqrt{I^{i}_{Rc}}$  denotes the recruitment stretch of the collagen fiber in layer L, and  $\lambda^{i}_{4c} = \sqrt{I^{i}_{4c}}$ .

The fiber recruitment distribution is represented with a triangular probability density function  $\rho_{Rc}^i$  [37, 35, 38, 36];  $\lambda_{Rc}^{i,q}$  relates to the the minimum (q = min), modal (q = mode) and maximum (q = max) recruitment <sup>186</sup> stretches of the distribution (see Fig. 3). More specifically:

$$\rho_{RL}^{i}\left(\lambda_{RLc}^{i}\right) = \begin{cases}
0, & \lambda_{RLc}^{i} \leq \lambda_{RLc}^{i,min} \\
g_{1}(\lambda_{RLc}^{i}), & \lambda_{RLc}^{i,min} < \lambda_{RLc}^{i} \leq \lambda_{RLc}^{i,mode} \\
g_{2}(\lambda_{RLc}^{i}), & \lambda_{RLc}^{i,mode} < \lambda_{RLc}^{i} \leq \lambda_{RLc}^{i,max} \\
0, & \lambda_{RLc}^{i,max} < \lambda_{RLc}^{i},
\end{cases} \tag{9}$$

187 where

$$g_{1}(\lambda_{RLc}^{i}) = \frac{2\left(\lambda_{RLc}^{i} - \lambda_{RLc}^{i,min}\right)}{\left(\lambda_{RLc}^{i,max} - \lambda_{RLc}^{i,min}\right)\left(\lambda_{Rc}^{i,mode} - \lambda_{RLc}^{i,min}\right)}$$

$$g_{2}(\lambda_{RLc}^{i}) = \frac{2\left(\lambda_{RLc}^{i,max} - \lambda_{4RLc}^{i}\right)}{\left(\lambda_{RLc}^{i,max} - \lambda_{RLc}^{i,min}\right)\left(\lambda_{RLc}^{i,max} - \lambda_{RLc}^{i,mode}\right)}.$$
(10)

Insertion of equations 12 and 9 into 6 and integration yields analytic expressions for the strain energy from which analytic expressions for the collagen stress can be derived (see [36]). The three main parameters of the distribution ( $\lambda_{Rc}^{i,min}$ ,  $\lambda_{Rc}^{i,mode}$ ,  $\lambda_{Rc}^{i,max}$ ) are inferred from collagen fibre attachment stretch distributions at the onset of voiding.

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## 194 2.2.3. SMC active stress

The active stress generated by the bladder during voiding is correlated to nerve activity [39] and occurs over a large range of bladder contractility [40], i.e. the active stress is generated within a range of SMC stretch,  $\lambda_m^{min}$  to  $\lambda_m^{max}$ , and is zero outside this range. We define the active (Cauchy) stress,  $\sigma_m^{act}$ , to be a function of SMC stretch ( $\lambda_m$ ), nervous stimuli S(t) and normalised SMC mass-density  $m_m$ , i.e.  $\sigma_m^{act} = \sigma_m^{act}(S(t), m_m(\tau), \lambda_m(t)).$ 

$$\sigma_m^{act} = \begin{cases} S(t)m_m k_m^{act} (\lambda_m)^4 (\lambda_m - \lambda_m^{min}) (\lambda_m^{max} - \lambda_m) & \lambda_m^{min} \le \lambda_m \le \lambda_m^{max} \\ 0 & \text{otherwise} \end{cases}$$
(11)

201 where the SMC stretch  $\lambda_m$  is related to the tissue stretch by

$$\lambda_m = \frac{\lambda_{4m}}{\lambda_{Rm}} \tag{12}$$

and  $\lambda_{Rm}$  is the SMC recruitment stretch. We set  $\lambda_m^{min} = 0.25$  and  $\lambda_m^{max} = 2.5$ . Examples of SMC stretch and active pressure curves are shown in Fig. 13.

The stimuli S(t) ramps up at the onset of voiding and incorporates a feedback mechanism to decrease the stimulus and when the flow rate falls below a critical value  $Q_{crit}$  ( $Q_{crit} = 0.02ml/s$ ) at  $t = t_{crit}$ , i.e.

$$S(t) = \begin{cases} 1 - \frac{1}{1 + (t/k_1)^4} & 0 \le t \le t_{crit} \\ \left(1 - \frac{1}{1 + (t_{crit}/k_1)^4}\right) \left(\frac{1}{1 + ((t - t_{crit})/k_2)^4}\right) & t_{crit} < t \le t_{end} \\ 0 & t > t_{end} \end{cases}$$
(13)

where  $k_1 = 1$  and  $k_2 = 2$  control the rate of increase and decrease of signal strength, respectively;  $t_{end}$  denotes when Q(t) = 0.

# 210 2.3. Micturition Model

Due to the induction of BOO, the pressure required to void the bladder increases. Initially, the SMCs cannot generate sufficient tension to achieve this pressure and urine only exits the bladder through leakage. As remodeling progresses, the SMC mass increases and the bladder recovers the capacity for voiding. As elaborated on below, the micturition model of the BOO bladder
therefore has two different states (see Fig.4): *active bladder* and *leaky bladder*.
The animal model initially exhibited the early phase of leaky bladder shown
by overflow incontinence due to BOO-induced high urethral resistance. Then,
the active bladder phase with micturition events gradually developed along
with SMC hypertrophy.



Figure 4: Schematic implication of the bladder maximum passive state under two different modes: functional mode (left) and leakage mode (right)

Active bladder. In the active bladder state, the SMCs are able to generate sufficient wall tension to overcome the urethral outlet resistance and induce voiding. For the *in silico* model, this process is simulated through a coupling between SMC stretch and the active stress generated by the SMCs. In particular, as the bladder fills and enlarges, the nervous stimulus function S(t) is triggered when the SMC stretch reaches a critical value, i.e. when  $(\lambda_m = \lambda_m^{at})$ . Consequently, SMC active stress increases and voiding is initiated when the internal bladder pressure (*passive* + *active*) exceeds the cutoff pressure ( $P_c$ ) at which the urethra opens and closes. Voiding is complete when the internal pressure falls below the cutoff pressure.

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The temporal dynamics of the pressure and outflow-rate of the active bladder can be computed during voiding. Following earlier works, we assume a linear relationship between voiding flow rate Q(t) and bladder pressure  $P(\lambda, t)$ [41, 42]:

$$Q(t) = \begin{cases} \frac{1}{\alpha} (P(\lambda, t) - P_c) & P(\lambda, t) > P_c \\ 0 & P(\lambda, t) \le P_c \end{cases}$$
(14)

where  $\alpha$  is the slope of the Pressure-Flow relationship and is a measure of urethral resistance. As voiding progresses, the updated volume is computed to calculate updated pressure  $(P(\lambda, t))$ . On completion of voiding, relevant metrics are calculated (volume voided, residual volume, voiding duration, contractile range).

Leaky bladder. If the bladder cannot generate sufficient active pressure to overcome the BOO cutoff pressure  $P_c^{BOO}$  then it will continue to fill. As it enlarges, the passive pressure increases; when passive pressure exceeds the cutoff pressure, the bladder will begin to leak. A new steady state occurs when the passive pressure increases until the leaky flow rate matches the filling rate of the bladder, i.e.  $Q_{out} = Q_{in}$ . The passive pressure  $(P^{leaky})$  this occurs at can be determined from eqn.14:

$$P^{leaky} = \alpha Q_{in} + P_c^{BOO} \tag{15}$$

# 248 2.4. Homeostasis, Growth and Remodelling

## 249 2.4.1. Homeostasis

<sup>250</sup> Collagen. Collagen recruitment distributions of SHAM and BOO tissue sam-<sup>251</sup> ples were quantified using biaxial mechanical testing and multiphoton mi-<sup>252</sup> croscopy. The distribution of collagen stretches at the onset of voiding is <sup>253</sup> calculated from recruitment stretch distributions and the *in vivo* stretch at <sup>254</sup> the onset of voiding, i.e.  $\lambda|_{\kappa_{max}}^{sham}, \lambda|_{\kappa_{max}}^{boo}$ .



Figure 5: The average collagen stretch distribution at voiding configuration  $\kappa_V$  of BOO and SHAM

We observed that whilst the BOO bladder's onset of voiding radius in-255 creased by around 33%, collagen stretch distributions in this configuration 256 were similar in each layer and maximum stretches were maintained below 1 257 (see Fig.5). Hence we observed that collagen is configured to be a protec-258 tive sheath for the SHAM bladder and remodels during outlet obstruction 259 to maintain this mechanical role. Based on our observations, for the *in sil*-260 *ico* model, we assume that collagen is configured with a preferential stretch 261 distribution at the onset of voiding and this distribution is fixed during re-262

<sup>263</sup> modelling; values for the distribution (see Table 4 are based based on Fig.5)

SMC. We assume SMC configures to achieve a preferred stretch at the onset of voiding, i.e.  $\lambda_m^{at}$ . We further assume that the muscle stretch at the onset of voiding is configured to the left of the maxima of the active pressure-muscle stretch curve which occurs at an SMC stretch of  $\lambda_m^{peak}$ , i.e.

$$\lambda_m^{at} = \lambda_m^{peak} - x \tag{16}$$

268

where we take x = 0.1. The rationale for this choice is as follows: configuring to the left of the peak still enables the bladder to generate active stress to void at a larger size (if voiding is withheld), Fig. 6; we don't configure too far to the left of the peak so that we can simulate a sufficient contractile voiding range.



Figure 6: Schematic of muscle stretch vs. active pressure curve and configuration of muscle stretch at the onset of voiding

# 274 2.4.2. Remodelling

We assume that constituents are configured about the maximum passive state  $\kappa_{max}$  during the voiding cycle, i.e. about the onset of voiding for the *active bladder* and about the steady flow state for the *leaky bladder*.

Collagen. We assume collagen continually remodels to maintain it's mechanical role as a protective sheath at the maximum passive state ( $\kappa_{max}$ ). Collagen recruitment stretch distributions remodel so that the collagen stretch distribution remodels towards the (homeostatic) attachment stretch distribution[35, 38, 36]:

$$\frac{\partial \lambda_{RLc}^{min}}{\partial \tau} = \alpha_c \frac{\lambda_{Lc}^{max}(\tau)|_{\kappa_{max}} - \lambda_{Lc}^{at,max}}{\lambda_{Lc}^{at,max}}$$
(17)

283

$$\frac{\partial \lambda_{RLc}^{mod}}{\partial \tau} = \alpha_c \frac{\lambda_{Lc}^{mod}(\tau)|_{\kappa_{max}} - \lambda_{Lc}^{at,mod}}{\lambda_{Lc}^{at,mod}}$$
(18)

284

$$\frac{\partial \lambda_{RLc}^{max}}{\partial \tau} = \alpha_c \frac{\lambda_{Lc}^{min}(\tau)|_{\kappa_{max}} - \lambda_{Lc}^{at,min}}{\lambda_{Lc}^{at,min}}$$
(19)

where the max, mode and minimum collagen fibre stretches evaluated at  $\kappa_{max}$  are, respectively:

$$\lambda_{Lc}^{max}|_{\kappa_{max}} = \frac{\lambda|_{\kappa_{max}}}{\lambda_{RLc}^{min}}, \qquad \lambda_{Lc}^{mod}|_{\kappa_{max}} = \frac{\lambda|_{\kappa_{max}}}{\lambda_{Rc}^{mod}}, \qquad \text{and} \qquad \lambda_{Lc}^{min}|_{\kappa_{max}} = \frac{\lambda|_{\kappa_{max}}}{\lambda_{RLc}^{max}}.$$
(20)

<sup>287</sup> Muscle cells. We hypothesise that SMCs remodel to maintain their stretch <sup>288</sup> towards a homeostatic value about the onset of voiding, i.e. typical maximum <sup>289</sup> passive state,  $\kappa_{max}$ :

$$\frac{\partial \lambda_{Rm}}{\partial \tau} = \alpha_m \frac{\lambda_m(\tau)|_{\kappa_{max}} - \lambda_m^{at}}{\lambda_m^{at}}|_{\kappa_{max}}$$
(21)

290

<sup>291</sup> Where  $\lambda_{Rm}$  is the SMC recruitment stretch,  $\lambda_m^{at}$  is the SMC attachment

stretch,  $\alpha_m$  is a remodeling rate parameter and  $\lambda_m|_{\kappa_{max}}$  is the SMC stretch at the maximum passive state, i.e. at the onset of voiding or leaky bladder.

## 294 2.4.3. Growth

The bladder responds to outlet obstruction with SMC hypertropy so that it can generate more force to overcome the outlet resistance and successfully void. In this study, we simulate SMC hypertrophy by evolving the SMC mass density and consider three illustrative mechanisms to drive growth. SMC hypertrophies to maintain: (i) volume voided; (ii) average voiding flow rate; (iii) contractile range.

Muscle growth driven by total voided volume. Based on the experimental observations, the total voided volume of bladder is restored at 4 weeks postobstruction. Thus we assumed that the muscle grows to maintain the total volume voided of bladder.

$$\frac{\partial m_{smc}}{\partial \tau} = \beta_{smc} m_{smc} \left( \frac{V_{void}^0 - V_{void}(\tau)}{V_{void}^0} \right)$$
(22)

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where  $V_{void}^0$  is the volume voided at  $\tau = 0$  (normal bladder) and  $V_{void}(\tau)$  is the volume voided at time  $\tau$ ;  $\beta_{smc}$  is the growth rate parameter of muscle cells.

Muscle growth driven by average flow rate during voiding. The urethra can sense flow[43] and we assume that the the muscle grows was driven by the average flow rate of voiding sensed by urethra. Specifically,

$$\frac{\partial m_{smc}}{\partial \tau} = \beta_{smc} m_{smc} \left( \frac{Q_{avg}^0 - Q_{avg}(\tau)}{Q_{avg}^0} \right)$$
(23)

<sup>313</sup> Where  $Q_{avg}(0)$  is the average voiding flow rate at t = 0 (normal bladder) and <sup>314</sup>  $Q_{avg}(\tau)$  is the average voiding flow rate at time  $\tau$ .

<sup>315</sup> Muscle growth driven by muscle contraction range during voiding. We as-<sup>316</sup> sumed that the muscle grows to maintain the contraction range  $\lambda_{m-cyc}$  dur-<sup>317</sup> ing voiding, which is defined as the difference between the muscle stretch at <sup>318</sup> the filled state  $\lambda_m^F$  and the muscle stretch at the voided state  $\lambda_m^V$ , i.e.

$$\frac{\partial m_{smc}}{\partial \tau} = \beta_{smc} m_{smc} \left( \frac{\lambda_{m-cyc}^0 - \lambda_{m-cyc}(\tau)}{\lambda_{m-cyc}^0} \right)$$
(24)

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where  $\lambda_{m-cyc} = \lambda_m^F - \lambda_m^V$  and,  $\lambda_{m-cyc}^0$  and  $\lambda_{m-cyc}(\tau)$ , are the muscle contractile ranges during voiding at  $\tau = 0$  and  $\tau$ , respectively.

Evolution of wall thickness. Hypertropy of SMC will lead to a thickening of the bladder wall. The evolving wall thickness can be inferred from initial constituent volume fractions and constituent mass-densities; this allows for comparison with experimental observations. For the geometrical model of the bladder considered (spherical membrane), the wall thickness in the voiding configuration,  $h_g(t)$ , is

$$h_g(t) = H_0 \hat{v}(t) \frac{1}{\lambda(t)^2 \mid_{\kappa_{max}}}$$
(25)

where  $\lambda_{onset}(t)$  denotes the stretch at onset of voiding and the normalised tissue volume  $\hat{v}(t)$  is

$$\hat{v}(t) = f_e^0 m_e(t) + f_c^0 m_c(t) + f_m^0 m_m(t), \qquad (26)$$

and  $f_e^0, f_c^0, f_m^0$  are initial volume fractions of elastin, collagen and SMCs. We assumed that at t = 0, the volume fractions of elastin, collagen, and SMCs are 10%, 30% and 60%, respectively.

## 333 2.5. Computational Implementation

## <sup>334</sup> 2.5.1. Spherical membrane model of bladder

We model the bladder as a two-layered nonlinear elastic spherical membrane subject to an internal pressure p. The governing equation for mechanical equilibrium is:

$$p = \frac{2H_0}{R_0\lambda^3} \left( r_{LP}^H \sigma_{c,LP} + r_{DSM}^H (\sigma_e + \sigma_{c,DSM} + \sigma_m^{act}) + r_{ADV}^H \sigma_{c,ADV} \right)$$
(27)

where  $r_L^H$  denotes the ratio of the thickness of layer L to total wall thickness  $H_0$  where L = LP, DSM, ADV.  $\sigma_e$  denotes the Cauchy stress of elastin,  $\sigma_{c_L}$ denotes the Cauchy stress of collagen in layer L and  $\sigma_m^{act}$  denotes the active Cauchy stress of smooth muscle;  $H_0$  and  $R_0$  denotes the thickness and radius at the unloaded state, and  $\lambda$  denotes the tissue stretch with reference to the unloaded state  $\kappa_0$ .

Parameter	Meaning	Value
$k_e$	elastin material parameter	$1.15e^3$ Pa
$k_{LP,c}$	collagen material parameters	$6.4e^6$ Pa
$k_{DSM,c}$	layer L (L=LP,DSM,ADV)	$1.6e^6$ Pa
$k_{ADV,c}$		$6.4e^6$ Pa
$\lambda^{att}_{LPc}$	min/mode/max	0.75,  0.775,  0.9
$\lambda_{DSMc}^{att}$	collagen attachment stretches	0.775,  0.95,  0.975
$\lambda_{ADVc}^{att}$	layer L (L=LP,DSM,ADV)	0.6,  0.7,  0.8
$k_m^{act}$	SMC active modulus	6212 Pa
$\lambda_m^{min}$	SMC active stress parameter	0.25
$\lambda_m^{max}$	SMC active stress parameter	2.5
$\lambda_m^{att}$	SMC attachment stretch	1.6
$P_c^{SHAM}$	cutoff pressure SHAM	380 Pa
$P_c^{BOO}$	cutoff pressure BOO	6300 Pa
$\alpha_{SHAM}$	urethral resistance SHAM	$28570\mathrm{Pa}/(ml/s)$
$\alpha_{BOO}$	urethral resistance BOO	$52630 \mathrm{Pa}/(ml/s)$
$Q_{in}$	bladder filling rate	$0.8ml/{ m day}$
$\alpha_c$	collagen remodeling rate	7.5
$\alpha_m$	muscle remodeling rate	7.5
$\beta_m$	muscle growth rate	4

Table 4: Default model parameters.

2.5.2. Set-up initial configuration: Geometry; material parameters; G&R pa rameter



Figure 7: Schematic of different states encountered during cytometry study.  $\kappa_0$ ,  $\kappa_F$  and  $\kappa_V$  represent the unloaded, filled and voided states of the bladder, respectively.  $R_S$ ,  $H_S$ ,  $P_S$  represents the radius, thickness, and pressure at the corresponding state (S = 0, F, V).  $\lambda_F^{(0)}$  and  $\lambda_V^{(0)}$  denote the bladder stretch in the filled and voided configurations.

Geometric, mechanical, urodynamic features of the *in silico* model are 346 informed from experimental measurements (see Tables 1, 2 and 3). At the 347 onset of voiding, the bladder has a radius of 5.8 mm and a wall thickness 348 of 0.21mm. The passive pressure within the bladder at the onset of voiding 349 is 300Pa and the pressure increases to 3800Pa as the SMC generates active 350 force. Voiding takes 12s during which 0.8ml is voided leaving a residual 351 volume of 0.02ml. The modelling steps to set-up the *in silico* model of the 352 the healthy bladder are as follows: 353

354

• The radii of the unloaded, voided and filled states,  $R_0$ ,  $R_V$  and  $R_F$ 

were computed by assuming the bladder to be a hollow sphere. The unloaded spherical radius is  $R_0 = \left(\frac{3V_0}{4\pi}\right)^{1/3}$  where  $V_0$  is the volume of the unloaded bladder which is assumed to be an ellipsoid. Similarly, the bladder radii at voided state  $\kappa_v$  and filled state  $\kappa_F$  (Fig. 7) were calculated by approximating the bladder as a spherical membrane, i.e.  $R_F = \left(\frac{3V_F}{4\pi}\right)^{1/3}$  and  $R_v = \left(\frac{3V_v}{4\pi}\right)^{1/3}$  where  $V_F$  and  $V_v$  are the filled and voided volumes, respectively.

• The tissue stretches at filled and voided configurations are  $\lambda_F = R_F/R_0$ and  $\lambda_V = R_V/R_0$ , respectively.

• The three recruitment parameters of the collagen triangular recruitment distribution are determined from the collagen attachment stretch distribution parameters (see Fig.8 and Table 4) and the tissue stretch at the filled state  $(\lambda_F)$ .

• The initial value of the muscle recruitment stretch is determined by dividing the tissue stretch at filled state  $\lambda_F$  by the muscle attachment stretch  $\lambda_m^{at}$ , i.e.  $\lambda_M^R = \lambda_F / \lambda_m^{at}$ .

• We observed that collagen was not bearing load at the onset of voiding and hence acts as a protective-sheath against overdistension. Therefore  $k_E$  was computed based on the force balance at the initial maximum passive state  $(R_F)$  and assumption that only elastin is load bearing. Specifically  $K_E = P_{max}^{passive} \frac{R_0 \lambda_F^7}{2H_0 r_{DSM}^H (\lambda_F^6 - 1)}$ .

• Collagen material parameters  $(k_{LP,c}, k_{DSM,c}, k_{ADV,c})$  are determined by fitting the passive model to the mechanical loading data. • In the pressure-flow experiment, we measured the maximum passive filling pressure  $P_{max}^{passive}$  and maximum voiding pressure  $P_{max}^{voiding}$ . The difference between these two is the maximum active pressure  $P_{max}^{act}$ . From the active force balance equation, we can determined  $k_m^{act}$  analytically from  $P_{max}^{act} = k_m^{act} \frac{2H_0 r_{DSM}^H}{R_0 (\lambda_m^r \lambda_m^{at})^3} (\lambda_m^{at})^4 (\lambda_m^{at} - \lambda_m^{min}) (\lambda_m^{max} - \lambda_m^{at}).$ 

• The urethral resistance parameters,  $P_C$  and  $P_C^{BOO}$ , are determined as follows. At the tissue voided stretch  $\lambda_V$ , the flow-rate Q(t) = 0. Hence from eqn.14, we obtain  $P_c = P^{act}(\lambda_m(\lambda_V, \lambda_M^R)) - P_C = 0$  where  $P^{act}$ is the active pressure (and similarly for  $P_C^{BOO}$ ). The slope of urethral resistance relationship,  $\alpha$ , is then determined by matching the voiding duration of the SHAM bladder; we assume  $\alpha$  is a constant and does not adapt during BOO remodelling.

• The collagen remodeling rate  $\alpha_c$  and muscle growth rate  $\beta_m$  are numerically determined so that the final void radius matches the experimental void radius and smooth muscle hypertrophy stabilises after around 2 weeks.

#### 394 2.5.3. Algorithmic workflow

The model is implemented into Matlab and uses two timescales: a longer time-scale  $\tau$  (days/weeks) for G&R; a short-time scale t (seconds) for computation of urodynamics during voiding; parameter values are detailed in Table.4.

The bladder model is subject to a constant inflow rate. To facilitate visual illustration of the model behaviour, we set the inflow to be 0.8ml/day so that the healthy bladder fills and voids once per day. At each time step, as the



Figure 8: Collagen attachment stretch distributions in the lamina propria, detrusor and adventitial layers.

<sup>402</sup> bladder fills, the updated volume (and radius) of the bladder is computed.
<sup>403</sup> The bladder continues to fill until either: voiding is triggered or of it is unable
<sup>404</sup> to void, it leaks. If voiding is triggered, urodynamic metrics are computed,
<sup>405</sup> the bladder is emptied and the cycle of filling begins again.

- For  $\tau < 0$ , the bladder can functionally void and is in a homeostatic state.
- To simulate the creation of outlet obstruction, parameters of the pressureflow relationship (see eqn. 14) are instantaneously changed at  $\tau = 0$ : the cutoff pressure is increased from  $P_c^{SHAM}$  to  $P_c^{BOO}$  and the resistance parameter is increased from  $\alpha_{SHAM}$  to  $\alpha_{BOO}$ .
- Throughout the simulation, maximum stretches of all constituents are
  computed during voiding cycle (or in the leaky state). These are used to
  drive remodelling of collagen and SMC recruitment stretches to maintain a homeostatic state about the voiding configuration (see eqns. 17,

- 416 19, 18 and 21). Voiding metrics are used to control SMC growth using
  417 eqns. 22 or 23 or 24
- Growth and remodelling continues until a new homeostasis is achieved and voiding functionality of bladder restored.
- 420 2.5.4. Simulations

In Section 3, we illustrative the *in silico* model of the bladder and it's adaptive response to BOO. We then investigate how the SMC growth rate parameter influences model behaviour and examine several mechanisms to drive SMC growth. Lastly, we compare of model predictions with experiment at 4 weeks post-BOO.





Figure 9: Bladder adaption from pre-obstruction (t < 0) to post-obstruction (t > 0). (a) Evolution of radius with illustrative filling and voiding cycles. Temporal evolution of (b) volume voided and (c) average flow rate.

Figure 9 overviews the voiding behaviour of the *in silico* bladder, prior to, and in response to outlet obstruction. Note that in this illustrative simulation, the bladder is subject a constant inflow rate of 0.8ml/day and conse-

quently, during the pre-obstruction period (t < 0), the healthy bladder voids 430 once per day: the radius varies from around 2mm to 6mm during voiding 431 cycles (see Fig. 9(a)); voiding of 0.8 ml/s takes 12 seconds; the peak flow rate 432 is 0.12 ml/s and the average flow rate is 0.06 ml/s. Following obstruction, 433 the bladder is unable to actively void and consequently continues to fill and 434 enlarge. The increase in size is accompanied by a significant increase in the 435 passive pressure as collagen is recruited to load bearing. When the passive 436 pressure becomes sufficiently large, it overcomes the outlet resistance and 437 the bladder begins to leak (*leaky bladder*). The passive pressure continues to 438 increase until the outflow rate matches the filling rate. 439

440

During the *leaky bladder* phase, the SMC does not generate sufficient force to 441 contract the bladder and thus the (active) volume voided is zero (see Fig.9b). 442 Between 0 < t < 1.5 weekns, the leaky bladder increases in size to around 443 8.5mm as the collagen (which acts as a protective sheath for the healthy 444 bladder) remodels. Once the bladder is able to void again, the maximum 445 stretches of collagen during the voiding cycle reduce below 1 and collagen 44F reverts to being a protective sheath (see Fig. 10). Note that as the bladder 447 enlarges, the collagen recruitment stretch distributions remodel (see Fig. 11) 448 to maintain the collagen stretch distribution towards the attachment stretch 449 distribution at the onset of voiding. 450

451

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Figure 11: Recruitment stretch distributions in the layers of the bladder for the SHAM bladder ((t = 0) and following G&R in response to BOO.



Figure 10: Evolution of collagen stretch distribution (maximum, mode and minimum) for individual layers: (a) lamina propria (b) detrusor and (c) adventitia.

<sup>453</sup> Hypertropy of SMC occurs rapidly during the *leaky bladder* phase (Fig.12). <sup>454</sup> In the model, functional voiding is restored when SMC can generate sufficient <sup>455</sup> force to generate a contraction of the bladder so that the voided SMC stretch <sup>456</sup> is less than the homeostatic SMC voiding stretch ( $\lambda_m^{att} = 1.6$ ). After around <sup>457</sup> 1.5 weeks, the bladder starts to (actively) void again with a small volume and <sup>458</sup> high frequency. As SMC hypertropy increases, the contractile range of SMC <sup>459</sup> during voiding increases and thus the volume voided increases whilst the <sup>460</sup> voiding frequency decreases. After 3 weeks, the total volume voided is fully <sup>461</sup> restored but the average flow rate is only about 50% of the normal bladder <sup>462</sup> (see Fig.9b,c). Interestingly, due to an increase in size, the post-obstructed <sup>463</sup> bladder can void the same amount of urine as the pre-obstructed bladder <sup>464</sup> with a smaller range of contraction (see Figs. 9a and 13).



Figure 12: The change of SMC mass during BOO growth and remodeling



Figure 13: The relation between muscle stretch and active pressure for pre and 30+ days post obstruction. The blue dots showed the onset of voiding and red dots showed the end of voiding

# 465 3.1. Bladder urodynamics pre and post obstruction



Figure 14: The urodynamic curves of selected time points including (a) time vs. flow rate curve and (b) time vs. pressure curve

From Figure. 14a, it can be seen that the maximum flow rate of the bladder decreases by approximately 75% and the voiding duration more than doubles. The maximum voiding pressure doubles during voiding for the BOO
bladder (see Fig. 14b) due to the SMC hypertrophy.

# 470 3.2. Comparison of different growth hypotheses

Three illustrate mechanisms to drive SMC hypertrophy were investigated, 471 restoration of: volume voided; 2. average voiding flow-rate; 3. contractile 472 range. For all cases, the bladder maximum radius was increase by 33% (see 473 Fig.15) following obstruction. It can be seen that if the bladder adapts to 474 restore average flow rate or contractile range then the volume voided increases 475 (Fig. 16(b)). However, significant increases in SMC mass are required to 476 maintain the contractile range (Fig. 16(a)) and it takes a longer time to 477 achieve homeostasis. 478



Figure 15: The simulated time vs. radius with different hypothesis of SMC growth (a) SMC growth driven by voided volume driven (b) SMC growth driven by average flow rate (c) SMC growth driven by SMC contraction range



Figure 16: The time vs. (a) SMC mass and (b) volume voided using different SMC growth evolution functions: GF1 (blue) - SMC hypertrophy acts to restore volume voided; GF2 -(red) SMC hypertrophy acts to restore average flow rate; GF3 - (yellow) SMC hypertrophy acts to restore contractile range

# 479 3.3. Comparison between simulation and experiment

We conclude the results section by comparing predictions of the *in sil*-480 ico bladder model with experimental observations. Figure 18 illustrates the 481 rightward shift of the stress-stretch curves for (a) the experimental model and 482 (b) the *in silico* model. Note for comparison with the experimental model, 483 the BOO mechanical response has been plotted relative to the SHAM refer-484 ence configuration. Figure 17 depicts relevant bladder metrics pre-BOO and 485 4 weeks post-BOO. It can be seen that there is consistency between model 486 predictions and experiment observations, i.e. the *in silico* bladder: enlarges 487 in size and the wall thickens; voiding volume is conserved whilst the residual 488 volume increases; voiding duration increases; a reduction in the passive filling 489 pressure occurs whilst the maximum void pressure approximately doubles. In 490 fact, quantitative consistency is achieved for most quantities; however, the *in* 491



*silico model* underestimates the increase in wall thickness and void duration.

Figure 17: Comparison between *in silico* and experimental model bladder parameters at 4 weeks post-BOO.



Figure 18: The comparison between (a) experimentally measured mechanical loading curves of SHAM (n=4) and 4 week BOO (n=4) and (b) simulated passive mechanical loading curves of SHAM and 4 week BOO. Note for the comparison, the experimentally measured stretch of BOO bladder is defined relative to the unloaded state  $\kappa_0$  of SHAM bladder by multiplying the stretch by the ratio of unloaded radii  $(R_{0,BOO}/R_{0,Sham})$ .

# 493 4. Discussion

We have presented the first G&R model of the urinary bladder and used it 494 to simulate the response of the bladder to outlet obstruction. The model pro-495 vides a mechanistic understanding of how the bladder wall adapts in response 496 to BOO to restore voiding functionality. An integrative in-vivo in-vitro in-497 silico modelling approach underpins the work and enables calibration of the 498 healthy bladder model and informs remodelling assumptions. Consistent 490 with experimental observations in a rat model of BOO, the model predicts 500 that following initiation of BOO, the bladder enters a leaky state after which 501 hypertrophy of SMC restores the ability to void. Moreover, the model cor-502 rectly predicts that whilst volume voiding is restored by this G&R response, 503

residual volume increases, the average voiding flow rate decreases and the
voiding duration increases. Although the model has good consistency with
experiment, it has several limitation, that are discussed below.

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Experimental data confirms the bladder undergoes three stages of remod-508 elling in response to BOO: an initial hypertrophy phase, followed by a com-509 pensation phase, and finally, a decompensation phase [29]. The hypertrophy 510 stage consists of SMC growth accompanied by angiogenesis to meet the in-511 creased metabolic demands of the tissue. During the compensation stage, the 512 bladder maintains effective voiding function but is subject to cyclic ischaemia-513 reperfusion injury; this leads leads to matrix accumulation (fibrosis) and also 514 neuronal loss [44] that is accompanied diminished SMC contractility. Finally, 515 in the decompensation stage, SMC atrophy occurs leading to loss of bladder 516 functionality. In the present work, we only model the hypertrophy and early 517 compensation stages of BOO- without ischaemic damage. Our integrative 518 *in-vivo in-vitro in-silico* modelling approach provides foundations for devel-510 oping a more complete representation of all stages of BOO. We envisage such 520 a model may assist in designing/evaluating pharmacological or surgical in-521 terventional strategies for clinical management of the disease. 522

523

While numerous studies have investigated the relationship between mechanical stimuli and SMC remodeling in arteries as well as the associated set points for homeostasis, very little is known about this type of coupling in the bladder wall. Here, we used the G&R model to investigate hypotheses linking SMC growth to bladder biometrics (volume voided, average voiding flow rate,

contractile range). The first hypothesis we investigated is that the growth of 529 SMC is driven by volume voided. This is based on our experimental observa-530 tions that volume voided was restored following hypertrophy. Interestingly, 531 others have also observed the bladder to increase in size with higher residual 532 volume whilst maintaining volume voided [45]. However, whilst it is known 533 that mechanical stress can activate signals that mediate bladder wall hyper-534 trophy, the mechanobiological mechanisms that would enable the bladder to 535 sense how much volume it has voided (to drive SMC growth) remain an open 536 question. We also evaluated the hypotheses that SMC growth evolves to 537 restore either average voiding flow rate or SMC contractile range. However, 538 both these hypotheses led to larger increases in volume voided than observed 539 in experiment. We therefore enlisted the first hypothesis for much of the 540 present work. Nevertheless, we conjecture that flow or SMC stretch sensors 541 may be relevant for adaption in non-pathological conditions, e.g. bladder 542 enlargement during development. 543

544

Consistent with experiments, the in silico bladder was unable to void follow-545 ing the increase in outlet resistance, resulting in overflow incontinence after 546 which voiding was recovered. Simulations with the G&R model enabled a 547 mechanistic understanding of how this recovery was achieved. Imposition 548 of BOO stimulates rapid SMC hypertrophy. In time, SMC growth is suffi-549 cient to generate adequate intravesical pressures to overcome the increased 550 outlet resistance. However, initially, the remodeled bladder voids smaller vol-551 umes at higher frequency, compared with the normal bladder. Subsequently, 552 the bladder transitions to the compensated phase as smooth muscle growth 553

stabilises in response to recovery of voiding function; by design, this model 554 restored volume voided. Consistent with experiments, the model predicted 555 increased void duration following imposition of BOO. However, the predicted 556 increase in void duration was greater than in experiments: 12s to 32s in in 557 silico model whilst in the rat model it increased from 12s to 45s. This differ-558 ence may be attributed to the modelling idealization that neither the stimulus 559 function S(t) nor the functional form of the active stress-stretch relationship 560 are changed in response to BOO. Experimental guidance is needed to gain 561 greater insight into the evolving functionality of SMC so the model can be 562 sophisticated to more accurately simulate the bladder's evolving structural-563 functional relationship in response to BOO. 564

565

We modelled the bladder as a 1D non-linear elastic incompressible, homoge-566 neous spherical membrane. However, the real bladder is not spherical and has 567 spatially heterogenous material properties [46, 21]. Future developments of 568 the model will build on existing computational growth models that account 560 for anatomical geometries[36]; anisotropic volumetric growth [47]; and incor-570 poration of regulatory fibrotic pathways [35]. Consideration of the molecular 571 aspects of the remodelling, (for example, those associated with ischaemia) 572 during the compensation, decompensation stages of BOO will provide in-573 sights on the reversibility of pathological changes associated with BOO. 574

575

The clinical diagnosis of BOO in the context of a non-neurogenic history, involves taking a detailed urological history and assessing the lower urinary tract symptoms including storage, voiding and post-voiding symptoms. A

variety of symptom score questionnaires are available [10] including the In-579 ternational Prostate Symptom Score, the International Consultation on In-580 continence questionnaire, and the Danish Prostate Symptom Score. There 581 is strong evidence that a validated symptom score questionnaire should be 582 used. More generally, the mainstay of assessment of lower urinary tract symp-583 toms (LUTS) is the use of a bladder diary to assess frequency of voiding and 584 the volumes of urine produced, ideally recorded over a consecutive three-day 585 period. Following a clinical examination and analysis of the urine, the use 586 of a blood test to exclude cancer (prostate specific antigen), a post-voiding 587 residual to check that the bladder is emptying to completion and where ap-588 propriate a flow test to assess the flow of urine from the bladder through the 589 urethra. In this work, we used our silico model to understand the cause of 590 changes to clinical parameters such as residual volume and voided volume 591 during the G&R response to BOO. In the future, simulations of this kind 592 could be extended to other types of data available in clinical evaluations in 593 order to more directly impact clinical practice. 594

595

The animal model of BOO induced by partial urethral ligation has most 596 commonly been used to investigate the pathophysiology of male LUTS asso-597 ciated with BOO resulted from BPH. However, the majority of previous basic 598 research studies on BOO have utilized female animals. Therefore, this project 590 used male rats to produce the BOO condition underlying male LUTS [48]. 600 A recent study also reported that this male BOO model exhibits the early 601 hypertrophy-compensation phase followed by the later decompensation phase 602 of bladder dysfunction, similar to those observed in human BPH/BOO[49]. 603

Animal models may also provide the critical data needed to overcome limita-605 tions in current diagnosis and treatment practices. For example, a pressure 606 flow analysis is the conventional approach for diagnosing and defining the 607 severity of BOO in patients who have a complex situations such as failure 608 to respond to initial therapy, existence of significant post-voiding bladder 609 residual, or prior to surgery. Whilst this test has been considered the "gold 610 standard" evaluation for BOO and is used as a predictor of outcome to any 611 surgical intervention to relieve the outlet obstruction, recent work in a ran-612 domised study looking at the role of urodynamics prior to surgery raised 613 concerns over this previously widely held opinion [50]. We conjecture that a 614 more mechanistic understanding of the relationship between the urodynamic 615 data and progressive changes to the bladder wall during the three stages of 616 BOO pathology is essential for addressing these limitations. Such an un-617 derstanding requires a modelling approach of the kind developed here that 618 integrates a model of filling/voiding with a longer time scale G&R model. 610 Moreover, we envisage future work that leverages the *in vivo in vitro in sil*-620 *ico* approach introduced here will enable the design of new diagnostic tools 621 for assessing bladder dysfunction and provide guidance on developing new 622 treatments. 623

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# 626 5. Conclusion

We present a novel model for the bladder's adaptive G&R response to 627 outlet obstruction. Predictions of the model were consistent with in vivo 628 experiments of bladder outlet obstruction. This work is an important step 629 towards the development of patient specific in silico models of the bladder 630 that can predict changes to bladder functionality and hence guide the se-631 lection and timing of patient treatment. We envisage these models can be 632 leveraged in the future so clinicians can make more effective use of diagnostic 633 data and researchers can design new pharmacological and surgical interven-634 tions. 635

## 636 6. Acknowledgements

Paul Watton acknowledges partial support towards this work from UK
 EPSRC (EP/N014642/1).

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