# CHAPTER 9: Model for puffs and slugs in pulsatile pipe flow

Turbulence in pulsatile pipe flow first appears in the form of localized turbulent patches. These patches are similar to the puffs and slugs observed in steady pipe flow (**Dani**: *Esta informacion estara en otros capitulos, secciones. Citalos aqui*.). Depending on the flow parameters, puffs and slugs show different behaviours. At low  $Wo \lesssim 4$  they behave quasisteadily and are solely affected by the instantaneous Reynolds number  $Re_i = U(t)Re$ . When  $Re_i \lesssim 2000$  they tend to quickly decay, whereas when  $Re_i \gtrsim 2300$  they tend to elongate and grow in magnitude. At high pulsation frequencies  $Wo \gtrsim 20$  they are unaffected by the pulsation and depend only on the mean Re, as in steady pipe flow (**Dani**: *Cita Xu Avila 2017 2018*). In the intermediate regime  $5 \lesssim Wo \lesssim 17$  puffs are modulated by the pulsation. In this intermediate regime, the front speed and survival of puffs depends on the combination of Re, Wo and A. Moreover at these pulsation frequencies, and at  $A \gtrsim 0.5$  our results suggest that puffs take advantage of the instantanous linear instability of the laminar profile to survive (**Dani**: *Cita Entropy, capitulos, secciones y eventualmente un paper del modelo de Barkley*).

In this chapter we adapt the BM of steady pipe flow (**Dani**: *Cita el capitulo o seccin*) to pulsatile pipe flow at  $Wo \ge 4$ . At lower Wo puffs behave quasi-steadily, and we understand that there is no need to model their behaviour. The motivation to develop a simple model for puffs and slugs in pulsatile pipe flow is two-fold.

On the one hand, we would like to have a tool that, in an efficient way, can perform simulations of turbulence in a huge parameteric regime of pulsatile pipe flow. We have mentioned how the behaviour of puffs and slugs can dramatically change, when changing one of the flow parameters. A simple model could approximate the puffs survival or front speed changes when changing the parameters in a fast way. It could be eventually used to develop control laws of puffs and slugs in pulsatile pipe flow.

On the other hand, a simple model could help us understand the dynamics behind puffs and slugs in pulsatile pipe flow. At either very low or very large frequencies the behaviour of puffs and slugs are almost identical to the case of steady pipe flow. In the former, puffs and slugs adjust to the instantaneous mean shear, while on the latter to the time averaged mean shear. As seen in (Dani: Citar capitulo (seccion) del modelo de Barkley), in the case of steady pipe flow, the dynamics of puffs and slugs are mainly determined by the non-linear interaction between the mean shear and the turbulence intensity. Thus it is safe to assume that slight changes to the original BM, that include the changes on the mean shear due to the pulsation, can approximate well the behaviours of puffs and slugs in these frequencie regimes. At intermediate frequencies the behaviour of puffs and slugs is more complex. They are elongated and modulated by the pulsation, and, according to our results, they make use of other dynamics, apart from the state of the mean shear, to survive. It is thus worth it to try modify the model, and study which dynamics should be included in order to model puffs at these frequencies.

The rest of the chapter is organized as follows. First we describe our proposed changes and extensions to the original model of Barkley, to adapt it to pulsatile pipe flow. We provide some justification to the changes, together with examples of other design options. Second, we present the results of the extended Barkley model (EBM) alone and compared with results of individual DNS of pulsatile pipe flow. We finally comment on the limitations of the model.

# 1 Extension to the BM for pulsatile pipe flow

In this section we describe the modifications we propose in order to extend the BM to pulsatile pipe flow. The core idea of the extended Barkley model (EBM) is the same idea behind the original BM: the non-linear interaction between the turbulence intensity q and the mean shear u. As in the BM, in the EBM u corresponds to the centerline velocity, as a proxy to the mean shear. The instantaneous laminar profile of pulsatile pipe flow can be much complex than a simple parabolic profile (Dani:

Aqui quizas sera interesante citar un posible apendice donde incluya un catalogo de perfiles laminares de flujos pulsatiles, una ristra de plots parecidos a la figura 4 del paper de waveforms. En el caso del paper podra citar algun paper (el de Womersley?)), and therefore the shape of the shear can not be described by a single parameter like in steady pipe flow. We here assume that at relatively small pulsation amplitudes  $A \lesssim 0.5$ , the centerline velocity still represents a good approximation to the state of the mean shear. We further assume that the state of the mean shear at higher amplitudes  $A \gtrsim 0.5$ , can be approximated with a parameter inspired by the physics of pulsatile pipe flow, without the need of an additional model variable.

Our modifications have a constraint and fulfil a requirement. The EBM is constrained to pulsatile pipe flows with  $\bar{U}(t) \geq 0$ . As we show below the resultant EBM returns to the original BM when either Wo = 0 or A = 0. As we did in (Dani: chapter 5, (section ?)) with the BM, in the rest of the chapter we describe the EBM from its local to its spatially extended dynamics.

### 1.1 Local dynamics of the mean shear

In pulsatile pipe flow, the laminar centerline velocity  $U_c(t)$  and bulk velocity  $\bar{U}(t)$  are functions of time. While the bulk velocity is set by the pulsation, the evolution of  $U_c(t)$  can be obtained from the NSE. First we assume laminar pipe flow,  $\mathbf{u}(r, \theta, x, t) \to (0, 0, U(r, t))$ :

$$\frac{\partial U}{\partial t} = Gp(t) + F_{visc}(r,t), \qquad (1)$$

and secondly we set  $r \to 0$ . Here,

$$Gp(t) = -\frac{\mathrm{d}P}{\mathrm{d}x}(t),$$
 (2)

is the pressure gradient that drives the flow at the desired  $\bar{U}(t)$ , and:

$$F_{visc}(r,t) = \frac{1}{Re} \left( \frac{\partial^2 U}{\partial r^2} + \frac{1}{r} \frac{\partial U}{\partial r} \right). \tag{3}$$

When  $r \to 0$ ,

$$F_{v_0}(t) = \lim_{r \to 0} F_{visc} = \lim_{r \to 0} \left[ \frac{1}{Re} \left( \frac{\partial^2 U}{\partial r^2} + \frac{1}{r} \frac{\partial U}{\partial r} \right) \right]. \tag{4}$$

If one applies L'Hopital's rule to the limit in equation 4,

$$F_{v_0} = \frac{2}{Re} \frac{\partial^2 U}{\partial r^2},\tag{5}$$

and, for  $U_c(t) = U(t, r = 0)$ ,

$$\frac{\partial U_c}{\partial t} = Gp(t) + F_{v_0}(t). \tag{6}$$

Note that the time average of the right hand side of equation 6 yields  $\langle Gp(t) + F_{v_0}(t) \rangle = 0$ 

The equilibrium of forces described in equation 6 must be included in the model since, when the flow is locally laminar (q = 0),  $u \equiv U_c$ . Thus the original equation (**Dani**: Citar la ecuacion locu del capitulo 5 de la tesis, en el caso del paper de la seccion correspondiente), is extended to:

$$\dot{u} = g_{EBM}(q, u) = \epsilon_1 \left( U_c(t) - u \right) + \epsilon_2 \left( \bar{U}(t) - u \right) q + Gp(t) + F_{v_0}(t), \qquad (7)$$

where  $U_c$ ,  $G_p$  and  $F_{v_0}$  are the corresponding laminar centerline velocity, pressure gradient and the viscous force at the center of the pipe. They can be precomputed by numerically integrating equation 6.

### 1.2 Local dynamics of turbulence intensity

In the original BM, the control parameter r sets the production of turbulence intensity. As we observe in our DNS (**Dani**: Aqui puedes citar el paper de Entropy (en el caso del paper), o incluso resultados

que puedes incluir de nueva cosecha en el paper (tengo calculada la produccion en cada posicion axial y phase averaged!). En el caso de la tesis cita resultados de probablemente el capitulo 7.) turbulent production is modulated by the pulsation. We model this feature by considering a time dependant  $r_{EBM}(t) = r(Re) \cdot \bar{U}(t+\phi)$ , where r is constant, and it is calculated using the mean Reynolds Re, and  $\bar{U}(t+\phi)$  is a time shifted bulk velocity. In our DNS we observe a time delay between the maximum integrated turbulence intensity  $\langle q \rangle_{r,\theta,z}$  and the bulk velocity  $\bar{U}$  (Dani: Aqu aade una figura que demuestre esto. Quizas puedas coger todas las DNS y generar un plot donde se vea (a Re constante?) como cambia "phi" con Wo. Tambien puedes referenciar otro capitulo (seccion en el paper)). We find that the phase lag  $\phi$  (Wo) between the pressure gradient and laminar profile that it generates, first derived by Womersley (Dani: Cita Womersley), is a good approximation. Moreover, the phase lag is a sole function of the Womersley number, and it has an analytical expresion.

As we show in (Dani: Aqui deberas citar el capitulo 7 y 8, y la sección correspondiente del paper, donde hables del inflection point y de sus effectos en las DNS), at certain  $5 \lesssim Wo \lesssim 17$  and  $A \gtrsim 0.5$ , the laminar profile of pulsatile pipe flow is very different to the parabolic profile of the steady case (Dani: En el caso de la tesis citar el apendice con el catalogo de perfiles laminares), and can even be instantaneously unstable. (Dani: Citar capitulo 6, paper de waveforms en el paper.) The centerline velocity u alone is not able to capture this features of the mean shear. Since in this case we have decided not to add any new variable to the model, the effect of the instantaneous shape and effects of the mean shear are modeled by adding to the local dynamics of q in equation (Dani: Cita la ecuacion locg en el capitulo q) the term  $+\gamma\lambda(t)q$ . Here  $\lambda(t)$  represents how linearly unstable the laminar profile is due to the presence of inflection points, and it is always  $\lambda \geq 0$ . It corresponds to the maximum eigenvalue of the instantaneous laminar profile, as we computed it in (Dani: Cita el capitulo donde hables de la estabilidad lineal instantanea y el catalogo final de flujos pulsatiles con su lambda, y en el caso del paper cita el de waveforms y aade: We compute the eigenvalues of the laminar profile at certain time steps as if the profile was instantaneously steady. We then assume that the maximum eigenvalue is continuous in time and construct  $\lambda(t)$ . The parameter  $\gamma$  models the effect  $\lambda$  has on the growth of q. It represents the accuracy of the quasi-steady assumption used to compute  $\lambda$ . In theory it should scale with the length of the period in terms of flow units  $T = \frac{\pi Re}{2Wo^2}$ . The idea is that, the longer the period is, the slower the mean shear evolves with respect to the turbulent structures. We find a good compromise with:

$$\gamma = 0.23 \log (T). \tag{8}$$

By introducing these changes to the model, the local dynamics of q in the EBM are described by the following ODE:

$$\dot{q} = f_{EBM}(q, u) = q \left[ r\bar{U}(t + \phi) + \gamma\lambda + u - U_c(t) - \left( r\bar{U}(t + \phi) + \delta \right) (q - 1)^2 \right]. \tag{9}$$

### 1.3 Spatially extended and stochastic model

As for the original BM, the local dynamics alone are not able to describe the behavior of localized turbulence in pulsatile pipe flow. One needs to also consider advection, diffusion and stochstic effects. In the case of the centerline velocity the spatially extended equation is equal to equation ( $\mathbf{Dani}$ : Cita  $Capitulo\ 5\ eqPDEu$ ):

$$\frac{\partial u}{\partial t} = -u \frac{\partial u}{\partial x} + g_{EBM}(q, u) + \frac{2}{Re} \frac{\partial^2 u}{\partial x^2}.$$
 (10)

In the original BM (Dani: CITA Cap 5) the velocity at which q is advected is equal to  $u - \eta$  where  $\eta$  acts as a correction parameter. In the case of pulsatile pipe flow, the advection velocity should also depend on the pulsation. We model this by correcting the velocity by  $u - \eta \bar{U}$  instead of simply  $u - \eta$ :

$$\frac{\partial q}{\partial t} = -\left(u - \eta \bar{U}\right) \frac{\partial q}{\partial x} + f_{EBM}\left(q, u\right) + D \frac{\partial^2 q}{\partial x^2} + \sigma\left(Re\right) \tau\left(t, x\right) q,\tag{11}$$

Note that, in the EBM  $\sigma$  depends on the Re. While fitting the model to our DNS results, we noticed how, at certain parameters the magnitude of the noise was critical in order to validate the front speed

	$Re_0$	$Re_1$	$\zeta$	Di	$\sigma$	$\delta$	$\epsilon$
BM	1920	2250	0.79	0.13	0.5	0.1	0.1
EBM	1820	2250	0.69	0.13	$0.2 < \sigma < 0.85$	0.1	0.1

Table 1: BM parameters as described in [?] and the value of parameters used in the EBM. Colored blue parameters represent changes with respect to the original BM.

and lifetimes of the puffs. We found that a noise intensity that scales linearly with Re, with an upper bound of  $\sigma \leq 0.9$ :

$$\sigma = \begin{cases} 0.1 & if & Re \le 2020\\ \frac{3}{5} \cdot \frac{(Re - 1933)}{1000} & if & 2020 < Re < 2640\\ 0.85 & if & Re \ge 2640 \end{cases}$$
 (12)

produces much better results than a constant value. There are different reasons why the noise amplitude might need to be adjusted to Re, (Dani: CITA la ultima seccion de este captulo). The most obvious one is that, for increasing Re one expects an increase in the chaotic characteristics of the flow that are modeled with the noise term. However at any sufficiently high Re there should be some chaotic dynamics, therefore the upper bound, and the stochastic term cannot become bigger than the main dynamics of the model, therefore the upper limit.

#### 1.4 Overview of the model

Equations 11 and 10 together with the local dynamics 9 and 7 and the parameters defined in equations 8 and 12, define the EBM. Let us highlight three important features of the model.

First, when A=0 or Wo=0 one recovers the original BM. At A=0 or Wo=0, there is no oscillatory component in  $\bar{U}$  or  $U_c$ ,  $G_p+F_{v_0}=0$  and at these A and  $Wo \lambda \equiv 0$ .

Second, the control parameter r of the original BM set the behaviour of the localized turbulent patches. In the case of the EBM, the equivalent parameter  $r_{EBM} = r\bar{U} \, (t+\phi)$  now oscillates between a minima and a maxima, at a frequency set by the combination of Re and Wo. As we show below, at low frequencies  $Wo \lesssim 4$  we see a quasi-steady behaviour of the puffs. When the instantaneous parameter  $r_{EBM} < 0$  puffs tend to shrink and decay, whereas at  $r_{EBM} > 1$  they tend to elongate into slugs. At higher frequencies,  $Wo \gtrsim 17$  we see no effect of the pulsation on the puffs, since the pulsation has such a high frequency for puffs to adapt to it. At intermediate frequencies, at the boundary between these two behaviours, we see more complicated dynamics.

Third, at intermediate frequencies  $5 \lesssim Wo \lesssim 15$ , and sufficiently high  $A \gtrsim 0.5$ ,  $\lambda > 0$ . As we show below there is a competition between the time dependent  $r_{EBM}$  and  $\lambda$  in this regime, that promotes puffs survival.

## 2 Numerical methods and fit of the EBM

We integrate equations 11 and 10 following [?]. We discretise the second order derivatives with central finite differences of second order, and the first order derivatives with a first order upwind scheme. We integrate the system using an explicit Euler method, with a time step size  $\Delta t = 0.0025 D/U$ . We consider a pipe of length L = 100D and a uniform grid spacing  $\Delta x = 0.5D$ . The stochastic term is modeled as white Gaussian noise in space and time. In figure ... we show a grid convergence study of our code.

Our code, after selecting the desired A, Re and Wo first integrates the corresponding laminar profile to obtain all the time dependent parameters:  $\bar{U}$ ,  $U_c$ ,  $G_p$ ,  $F_{v_0}$  and  $\lambda$ . It then uses this pre-computed parameters to integrate the model variables q and u. In the second row of table 1, we include the fitted parameters of the EBM.

Note that in table 1, two important parameter changes are highlighted,  $Re_0$  and  $\eta$ . In the original BM if  $Re < Re_0$  puffs inmediately decay. We find that, for the case of pulsatile pipe flow,  $Re_0 = 1920$  is too restrictive, and puffs tend to decay far earlier than what they should. Moreover puffs are observed to survive for long times even at Re < 1920, [?]. We find a good compromise by slightly decreasing  $Re_0 = 1820$ .

When  $Re_0$  decreases, the front speeds of puffs change. Therefore as a counter-measure, and in order to correct the front speed of puffs in steady and pulsatile pipe flow, we also decrease the correction parameter  $\eta$ . These parameter changes do not have a big impact on steady pipe flow, as discussed in chapter (Dani: Cita capitulo 5), but do allow the EBM to better compare with a wider parametric space of pulsatile pipe flows.

## 3 Results of the extended model

In this section we describe the results obtained with the EBM, and their qualitative and quantitative comparison with individual DNS results, listed in appendix (**Dani**: *cita el correspondiente apendice con todas los parmetros de las DNS*). We use the cross section axial vorticity square:

$$\langle \omega_x^2 \rangle_{r,\theta} (x,t) = \frac{1}{\pi R^2} \int_0^R \int_0^{2\pi} \omega_z^2 r \, \mathrm{d}r \, \mathrm{d}\theta$$
 (13)

as an indicator of the existence and magnitude of turbulence in each axial x location in the DNS. Throughout this section we refer to this quantity and q as turbulent indicators in DNS and model respectively. The parameter  $q^*$  represents a general turbulent indicator and corresponds to eq. (13) in DNS and  $10 \cdot q$  in the EBM.

In figure 1 we include three examples of DNS and model comparison, and in the appendix (**Dani**: *cita*) comparisons for all the DNS in appendix (**Dani**: *cita* el correspondiente apendice con todas los parmetros de las DNS). The model is able to capture reasonably well the turbulent front speed and turbulence survival in all the cases, as seen qualitatively in figure 1 and the appendix.

### 3.1 Phase averaged puffs in pulsatile pipe flow

In fig ??, we show a comparison between model simulations with  $\sigma = 0$  and phase averaged DNS results. At Re = 2100, Wo = 11 and  $A \le 1$ , turbulence is localized and modulated by the pulsation as in the case shown in fig. 1c) and d), see appendix (**Dani**: Cita el apendice). Although the model does not match perfectly the phase dependence and magnitude of  $q^*$ , see fig ??, both model and DNS show similar behaviours.

According to the local phase space in fig. ??a, b, e and f, the structures at  $t/T \approx 0.5$  and  $t/T \approx 0.75$  are similar to localized turbulent slugs, [?, ?], not to splitting puffs as was previously suggested by [?]. According to the model at A=1, fig. ??f, turbulence elongates into a strong slug, while at A=0.5, fig. ??b, the structure is more similar to a weak slug. As  $\bar{U}^*$  decreases at t/T=1, the magnitude  $q^*$  of slugs also decreases, fig. ??c and g. At  $t/T\approx 1.25$  the slug shrinks to its minimum length and magnitude, becoming a turbulent puff, fig. ??d and h. This modulation is similar for other cases, and depends on the exact combination of Re, Wo and A.

#### 3.2 Effect of $\lambda$ in the EBM

In this section we explore the effects of including  $\lambda$  in the model. As shown in fig ??, for the case of no instantaneous instability  $\gamma=0$  the model behaves in two different ways. At A=0.5, the results are almost identical to the case with  $\gamma\geq0$ . At  $A\leq0.5$   $\lambda$  is still quite small, fig 2b, and the dynamics are only dependant on the modulation due to the unsteady driving of the flow. At higher A=1 however, puffs according to the model quickly decay for  $\gamma=0$ . This behaviour is not observed in DNS, where at Re=2100, Wo=9 and A=1 puffs survive for several pulsation periods.

This would mean that turbulence in pulsatile pipe flow takes advantage of two mechanisms to survive. The first mechanism is the mean shear, that is maximum in the phases of the period where turbulence perceives  $\bar{U} > U$ . We propose that the second one is the instantaneous instability of the flow, that increases turbulence production during the phases when the laminar profile is instantaneously unstable. In our model the two mechanisms are represented by  $r \cdot \bar{U}^*(t)$  and  $\gamma \cdot \lambda(t)$  respectively.

### 4 Limitations of the extended model

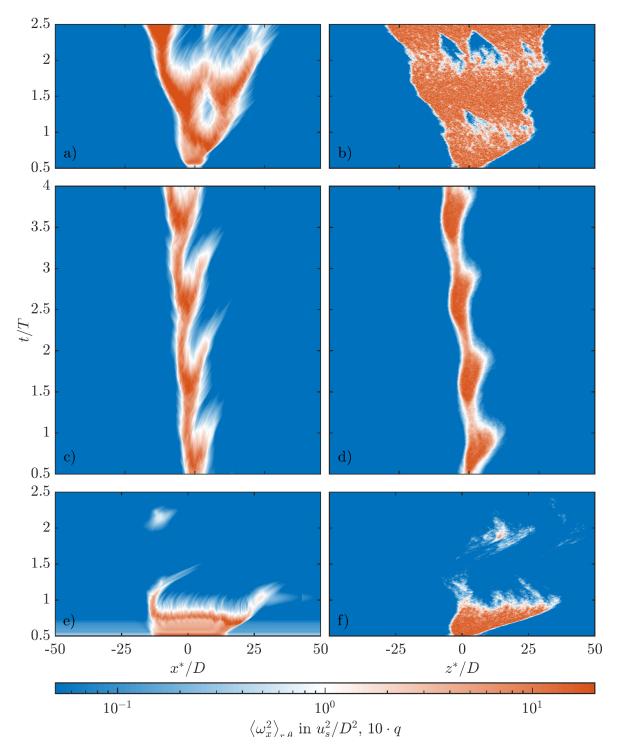


Figure 1: Space-time diagram of the cross section integral of axial vorticity square (eq. (13)) of DNS (left plots: a, c, e) and  $10 \cdot q$  of the model (right plots b, d, f). The results correspond to DNS and model simulations in a 100D pipe. The DNS are initialised with the optimum perturbation scaled to  $|\mathbf{u}_0'| \approx 3e-2$  of magnitude and localized in a span of 5D following [?], while the model simulations with a localized puff of length 5D. The figure is presented with respect to a moving frame  $x^*$ , moving with the bulk velocity  $\bar{U}$ . a) and b) correspond to Re = 3000, Wo = 11, A = 0.5. c) and d) correspond to Re = 2100, Wo = 11, A = 0.75. e) and f) correspond to Re = 2400, Re = 2400

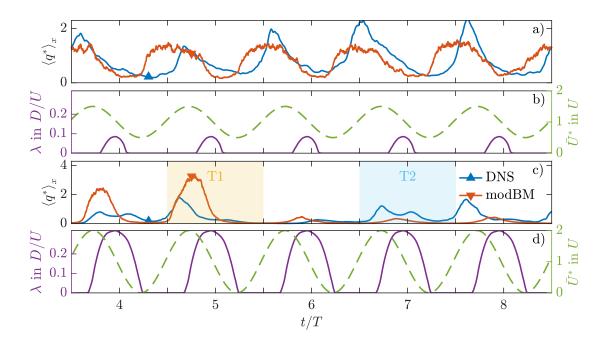


Figure 2: a) and c): Volume integral of turbulence indicator  $q^*$ , with respect to time for two pulsatile pipe flows. b) and d): time evolution of  $\bar{U}^*$  (dashed line) and  $\lambda_{\rm max}$  phase shifted in time a quarter of the period. a) and c) correspond to Re=2100, Wo=9 and A=0.5. b) and d) correspond to Re=2100, Wo=9 and A=1. The shaded areas denote two periods of interest, where different turbulence behaviours are identified.