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# Sex differences in glutathione metabolism and acetaminophen toxicity

Allison Cruikshank<sup>1</sup>, Michael C. Reed<sup>1</sup>, H. Frederik Nijhout<sup>2</sup>

<sup>1</sup>Department of Mathematics, Duke University, Durham, NC 27708, USA. <sup>2</sup>Department of Biology, Duke University, Durham, NC 27708, USA.

**Correspondence to:** Prof. H. Frederik Nijhout. Department of Biology, Duke University, 130 Science Drive, Durham, NC 27708, USA. E-mail: hfn@gmail.com

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# Abstract

**Aims:** Clinical and experimental evidence has shown that females in humans and other mammals have higher glutathione (GSH) levels than males, which are caused by higher levels of estradiol. Understanding how hepatic GSH level and synthesis velocity depend on the sex hormones is an extremely important question since oxidative stress contributes to the risk for heart disease and cancer, and oxidative stress is reduced by GSH. Our aim is to develop a systems approach to understanding GSH metabolism and use this to explain the causes of GSH differences in males and females, how GSH changes during the menstrual cycle, and why women may be less susceptible to acetaminophen toxicity.

**Methods:** We use mathematical models for hepatic glutathione metabolism, including one-carbon metabolism and acetaminophen detoxification, to investigate how the activation of certain enzymes by estradiol leads to dramatic changes in reaction velocities and metabolite concentrations.

**Results:** The models explain why women of childbearing age have higher glutathione than men, and that this is caused by the balance of activation of glutamyl cysteine synthetase (GCL) and glutathione peroxidase (GPX) by estradiol. The steady-state concentration of glutathione in women depends on the strength of the activation of GCL and GPX and is quite homeostatic over a wide range of activations.

**Conclusions:** During the menstrual cycle, the GSH concentration changes daily but over a relatively narrow range. We explain how this dynamic homeostasis depends on the biochemical network that produces GSH. The model is



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also consistent with published results that show that female mice are less susceptible than males to hepatotoxicity due to acetaminophen overdose and suggests that this might also be true for humans, though the human epidemiological data are contradictory.

Keywords: Sex differences, glutathione, metabolism, liver, acetaminophen toxicity

#### INTRODUCTION

The tripeptide glutathione (GSH) is produced in prodigious quantities by the liver. It is the main antioxidant in the body and conjugates and eliminates a variety of toxicants, reactive oxygen species, and heavy metals. Glutathione is synthesized by a pathway that starts with homocysteine in the methionine cycle [Figure 1]. In the redox reaction catalyzed by glutathione peroxidase (GPX), GSH is converted to glutathione disulfide (GSSG), which can be reconverted to GSH by the enzyme glutathione reductase (GR).

Clinical and experimental evidence has accumulated that females in humans and other mammals have higher GSH levels than males, caused by higher levels of estradiol. In human females, blood GSH drops after ovariectomy from 54.69 to 39.29 nmol/L, but is restored by estrogen replacement therapy<sup>[1]</sup>. Similar results have been obtained in rats<sup>[2,3]</sup>. Adolescent girls have a higher GSH/GSSG ratio than males<sup>[4]</sup>. Antioxidant gene expression is higher in females than in males and is accompanied by lower oxidative damage<sup>[3]</sup>. In addition, there is considerable evidence that estrogen increases substantially the activities of GPX and Glutamate Cysteine Ligase (GCL), an enzyme in the GSH pathway<sup>[5-7]</sup>.

Understanding how GSH level and synthesis velocity depend on the sex hormones is an extremely important question since oxidative stress contributes to the risk for heart disease<sup>[8]</sup> and cancer<sup>[9]</sup>, and oxidative stress is reduced by GSH via the enzyme GPX [Figure 1]. The pathways that regulate GSH production and recycling are extremely complex [Figure 1], and most research on this system has been conducted through association studies which can suggest local mechanisms but cannot fully capture the interactions in the system as a whole. In order to capture this complexity, we have, in collaboration with clinicians and experimentalists, developed mathematical models based on the real underlying physiology<sup>[10-16]</sup>. These models are validated by their ability to reproduce a diversity of new experimental results, and can be used as platforms for in-silico experimentation to determine the underlying mechanisms that give rise to the behavior seen in the clinic and experiments. In this paper, we present a new integrated model for hepatic glutathione metabolism including one-carbon metabolism and use it to investigate how the activation of certain enzymes by estradiol in one-carbon metabolism and glutathione metabolism leads to dramatic changes in reaction velocities and metabolite concentrations, including GSH and the GSH synthesis rate. Since estradiol varies over a very wide range during the menstrual cycle, one might expect that GSH would show similar variability. In fact, we show that GSH shows homeostasis during the menstrual cycle and we explain the reason for this result.

GSH is connected to the hepatotoxicity of acetaminophen because it is used by the liver to bind a toxic byproduct (NAPQI) of acetaminophen metabolism. We study the effect of GSH and sexual dimorphism on acetaminophen toxicity by using a previously constructed model of acetaminophen metabolism<sup>[10]</sup>. We show how the time curve of hepatic cell death depends on the dose of acetaminophen, and how it is affected by the timing of rescue by N-acetylcysteine. Experiments in mice show that female mice are much less sensitive to acetaminophen overdose<sup>[17,18]</sup>. However, this question is controversial in humans<sup>[19-21]</sup>.



**Figure 1.** The male and female steady states. The rectangular boxes and ovals contain the acronyms of the substrates and enzymes, respectively. The yellow ovals in Panel B indicate enzymes whose activities differ between males and menstruating females. The white boxes indicate substrate values ( $\mu$ M) and the blue boxes indicate velocities ( $\mu$ M/hr). Panels A and B are the steady states for males and females, respectively. Full names of enzymes and substrates can be found in the supplementary material. As can be seen, the females have a much higher level of glutathione than males. The flux into the glutathione pathway (CBS) does not vary very much between males and females. So, the large difference in glutathione concentration must be because GCL and GPX are activated by estradiol.

#### **METHODS**

The mathematical models used in this paper were created by combining previous mathematical models and making a few adjustments. We have previously developed a mathematical model of sex differences and the effects of estradiol in one-carbon metabolism<sup>[11,22]</sup>. To create the glutathione model used in this paper, we took the model from<sup>[11]</sup> and added the glutathione pathway, homocysteine, cystathionine, cysteine, glutamylcysteine, GSH, and GSSG [Figure 1] from a previous model of glutathione metabolism<sup>[14]</sup>. All of the velocities are given by Michaelis-Menten kinetics, with the  $K_m$  values taken from the literature, and where available, from human data. The adjustments are as follows: (1) For simplicity, we treat cytosolic serine and glycine as constant; (2) The male steady state is slightly different than in<sup>[11]</sup>, so we adjust the steady states of S-adenosylmethionine (SAM), S-adenosylhomocysteine (SAH), and Bet, which occur in the velocity equation for CBS and the velocity equation for the transport of cysteine from the blood to the cytosol by a factor of 9; (4) We decreased the leakage rate of cytosolic cysteine from the cytosol to the blood from 1 to 0.25 h; (5) We multiplied the  $V_{max}$  of g-cystathionase (CTGL) by 1/3.5; (6) We decreased the velocity for the transport of glutamate from other systems to the blood from 273 to 200  $\mu$ M/hr. All of these velocities can be

#### seen in Figure 1 and all of the abbreviations in the Table of Acronyms in the Supplementary materials.

Now, we discuss the activation of GCL and GPX by estradiol. There is a consensus that GPX and GCL are the two enzymes in the glutathione pathway that are upregulated by estradiol. Pinto and Bartley found 80% higher activity of GPX in female rats compared to males<sup>[23]</sup>. Bellanti *et al.* studied human females and found that GPX mRNA was 134% higher in menstruating females than after ovariectomy<sup>[1]</sup>. Wang *et al.* found that female rats had 80% higher GPX activity than females after maturity<sup>[7]</sup>. For GCL, McConnachie *et al.* found somewhat less than a 100% increase in female mice<sup>[17]</sup>, and Dabrosin *et al.* found that estrogen causes an increase in GCL activity in human breast cells *in vitro*<sup>[5]</sup>. Given these results, we decided to choose 80% as the "normal" or average increase in activity of GCL and GPX for females in our model for both of the enzymes GPX and GCL. Thus, we multiply the  $V_{max}$  values of GCL and GPX by a number, *S*, where *S* = 1 for males and *S* = 1.8 for females. In Section 3.2, we show that the steady-state concentration of GSH varies as *S* varies over a wide range, 1-3.5, but is fairly homeostatic near 1.8.

None of the studies cited above controlled for where the women or animals were during the menstrual (or estrus) cycle when the measurements were made. Nevertheless, by using our model, we can compute GSH during the entire human period of 28 days. We have good information on estradiol,  $E_2(t)$ , during the cycle; see Panel A of Figure 2. For women,  $E_2(t)$ , varies from 0.135 to 1.156 nM over the course of the cycle<sup>[24,25]</sup>, and for men,  $E_2$  is a constant 0.09 nM<sup>[26]</sup>. We assume that the function, S(t), which multiplies the  $V_{max}$  values of GCL and GPX, is a linear function of  $E_2(t)$  as follows:

(1)  $S(t)=1+\frac{(0.8)}{0.4368-0.09}(E 2(t)-0.09)$ 

where 0.4368 is the average value of  $E_2(t)$  during the cycle (calculated from Panel A of Figure 2). Thus, S = 1 for males, and for females, S = 1.8 for the average female  $E_2$ , consistent with the 80% choice above. When we discuss the menstrual cycle in Section 3.3, S(t) is given in terms of  $E_2(t)$  by the formula (1).  $E_2(t)$  itself is a piecewise linear function found by applying the spline function in Matlab to the data in Panel A of Figure 2 for estradiol as a function of day of the cycle for the average woman. For the enzymes affected by estradiol in one-carbon metabolism (yellow enzymes), as estradiol varies during the menstrual cycle, the multiplier of the  $V_{max}$  of the enzyme is scaled between the male value and the female value in table 3 in<sup>[22]</sup>.

In Section 3.4, we study the difference in response to acetaminophen (APAP) overdose in males and females after an overdose. To do this, we used a previous program to study whole-body acetaminophen metabolism<sup>[10]</sup>. We run the GSH program and the APAP program together - they share the substrate GSH, which is drawn down by the overdose and replenished by the GSH synthesis pathway. The integrated code consists of 61 differential equations that are solved in Matlab. The GSH system has 31 differential equations for the substrate concentrations in the rectangular boxes in Figure 1. The schematic diagram for the acetaminophen part of the program can be seen in<sup>[10]</sup>, Figure 1. Full names of the substrates and enzymes are given in the Supplementary materials table of acronyms. Concentrations are in  $\mu$ M and velocities in  $\mu$ M/hr.

# RESULTS

#### Sex differences in glutathione metabolism at steady state

We begin by comparing male and female differences in the model at steady state. Figure 1, Panel A and Figure 1, Panel B show the steady state for a male and a female, respectively. The rectangular boxes indicate substrates, and the blue or yellow ovals give the names of the enzymes catalyzing the reactions. A yellow oval in Panel B indicates that the enzyme is affected by estradiol and/or testosterone, and therefore, its activity is different in females than males. In folate and methionine metabolism, the increases or decreases



**Figure 2.** Consequences of the GSH regulatory motif. Panel B shows the GSH regulatory motif (taken from Figure 1), including the effects of estradiol and the inhibition of GCL and glutathione synthetase (GS) by GSH. Panel A shows the steady state value of GSH as a function of the parameter S, which increases with estradiol concentration and is defined in formula (2). The GSH curve goes up for low estradiol values, reaches a peak and descends for high estradiol values. The reasons for this behavior are discussed in the text.

of the enzymes in the yellow ovals are given in<sup>[11]</sup>. In the Methods, we discussed why, based on experimental and clinical studies, we chose 80% as the increase in average activation of GCL and GPX by estradiol. Thus, the factor, *S*, multiplying the  $V_{max}$  values of GCL and GPX, will be S = 1 for males and S = 1.8 for females. The red arrows in Figure 1 show what we call "long-range interactions", in which substrates allosterically affect distant enzymes in the network. There are even more allosteric interactions in the folate and the methionine cycles, but, for simplicity, we are not showing all of them. Note also that GSH inhibits both GCL and GS, so it is not clear by inspection of the diagram what the effect of raising the activities of GCL and GPX will be.

Panels A and B of Figure 1 show the steady state values for the male and female substrates, respectively, and the velocities for CBS, GS, and GPX. We will discuss several interesting aspects of the two figures. First, homocysteine (Hcy) is quite a bit lower in females than in males. The two reasons are that CBS is activated by estradiol and betaine (Bet), which is twice as high in females compared to males because the enzyme PEMT [Figure 1] is activated by a factor of 2.3 in menstruating females. This is not quite the whole story. The methionine input (in our model) is 40  $\mu$ M/hr, and if the mass leaving via the polyamine pathway (AMD1) is subtracted, the CBS flux is obtained because at steady state, the mass has nowhere else to go. Therefore, when CBS is activated by estradiol and betaine, the Hcy concentration must decrease to maintain the CBS flux at the correct level. Notice that CBS fluxes do not differ much between males and females, so this is not the reason that GSH differs so dramatically in males and females.

So, why is GSH so much higher in females than in males? The velocity of GS, the synthesizing enzyme, is not affected by estradiol. However, GCL is upregulated by estradiol, leading to a higher concentration of glutamyl-cysteine (Glut-Cys) in females, thereby driving increased GS flux. However, this is not the entire explanation, as estradiol also stimulates GPX, resulting in higher GPX flux that removes more mass from GSH. It is the balance between these two changes that determines the concentration of GSH [Table 1]. In this "average" female computation, GPX and GCL are upregulated by 80%. In the next section, we discuss the implications of stronger or weaker effects of estradiol.

S (relative estradiol)	1(male)	1.104	1.4	1.6	1.8	2	2.5	3.31
GSH	4,971	5,624	7,403	8,220	8,516	8,303	6,547	4,151
GSSG	38.91	47.5	76.9	100.4	125.5	150.6	203	248
bGSH	11.6	12.1	13.0	13.2	13.3	13.2	12.7	10.4
Velocity of GS	1,111	1,178	1,300	1,351	1,391	1,420	1,439	1,286
Velocity of GPX	448	520	724	853	970	1,070	1,244	1,367
Velocity of CBS	30.9	33.0	33.0	33.0	33.0	33.0	33.0	33.0

Table 1. Steady state cellular concentrations ( $\mu$ M) and reaction velocities ( $\mu$ M/hr) as S varies. Notice that GSH goes up for low estradiol values, reaches a peak and descends for high estradiol values

GSH: glutathione; GSSG: glutathione disulfide; bGSH: Plasma GSH; GPX: glutathione peroxidase; CBS: glutathione pathway.

#### Variation of GSH steady state depending on S

In our model, we take the activation of GCL and GPX by estradiol to be 80%, which is a reasonable choice supported by the experimental and clinical data discussed above. However, it is worth considering what would happen if we had chosen a different value, such as 60% or 100%. In the Methods, we explain why we take the multiplier, *S*, of the  $V_{max}$  values of GCL and GPX to have the following dependence on estradiol, *E*2:

(2)  $S=1+\frac{(0.8)}{0.4368-0.09}(E 2-0.09)$ 

Thus, since male *E*<sub>2</sub> is 0.09 nM<sup>[26]</sup>, S = 1 for the male. For the average female, *E*<sub>2</sub> varies from 0.135 to 1.156 nM during the menstrual cycle<sup>[24,25]</sup>. Thus, for a female, the multiplier *S* will vary between 1.104 to 3.31 and S = 1.8 if  $E_2 = 0.4368$  nM. This number, 0.4368 nM, is the average *E*<sub>2</sub> over the menstrual cycle computed from the data in Panel A of Figure 2. The steady state values of GSH and other variables for different values of S are shown in Table 1.

The concentrations of GSH in animal cells are in the range of 500-10,000  $\mu$ M<sup>[27,28]</sup>. The ratio GSH/GSSG is thought to be around 100 for cells that are not under oxidative stress<sup>[29]</sup>, which aligns closely with the values presented in Table 1. Plasma GSH (bGSH) concentrations are typically measured in the range of 2-20  $\mu$ M<sup>[28,30,31]</sup>, consistent with the values in Table 1. Finally, as discussed in the previous section, we have elucidated why the velocity of CBS does not vary much between males and females.

The most interesting aspect of the data in Table 1 is the non-monotone behavior of GSH as *S* increases from 1 to 3.31 [Figure 2A]. *S* is calculated from estradiol by formula (2). In the lower range of values of *S*, GSH increases rapidly as *S* increases. GSH reaches a maximum at S = 1.8 (8,516 µM) and then descends to 4,151 µM for S = 3.31. This effect arises because of the nonlinear inhibition of GCL and GS by GSH [Figure 2B]. This is a kind of end-product inhibition that prevents the GSH concentration from rising too high. To understand the non-monotone behavior of GSH, it is crucial to consider that there are two incoming fluxes to GSH, GS and GR, and two outgoing fluxes, GPX and a large flux out into the blood [Figure 2B]. At a steady state, the incoming fluxes must balance the outgoing fluxes. When *S* is low, 1-1.4, the GS flux rises more rapidly than the GPX flux, pushing GSH up. Around S = 1.4, the GS flux starts to increase more slowly while the GPX flux still increases at roughly the same rate as *S* increases, so the GSH curve starts to level off and reaches a maximum at S = 1.8. After that, the increase in the GPX flux dominates as the GS flux increases more and more slowly and eventually declines. This behavior of the GS flux is caused by the competition between the higher inhibition of GCL by GSH and the higher stimulation of GCL by estradiol [Figure 2].

The steady-state concentration of GSH remains relatively stable between S = 1.4 and S = 2, corresponding to increases in stimulation ranging from 40% to 100% compared to males. Therefore, we could have chosen any percentage within the 40% to 100% range to represent the average estradiol in females. We opted for an 80% increase in stimulation based on the consensus reached in several experimental studies conducted on rats and mice<sup>[7,17,23]</sup>. It is natural to speculate whether the inhibition of GS and GCL is an important evolutionary mechanism to keep GSH high, but not too high, in females during the childbearing years.

# The stability of GSH during the menstrual cycle

Since we know how estradiol varies during the menstrual cycle (Figure 3, Panel A), formula (1) provides insights into the value of the multiplier, *S*, for every day. It might seem intuitive, albeit incorrect, to calculate GSH levels over the cycle by calculating the steady-state GSH for each day of the cycle. This calculation would suggest that GSH levels vary between all the steady state values ranging from 4,151 to 8,516  $\mu$ M [Table 1 and Figure 2A]. However, this prediction is inaccurate; actual GSH values fluctuate within a much narrower range, as illustrated in Panel B of Figure 3.

We compute GSH during the cycle as follows. Starting at any initial values, we use our GSH program to compute GSH(t) for 20 × 28 days, i.e., for twenty 28-day months. For the first few months (approximately 6), the solution is not periodic but gets closer and closer to a periodic function. During the 19th month, the solution is the same as that of the 20th month, indicating that the solution during the 20th month represents GSH(t) during the menstrual cycle. The periodic solution in Panel B of Figure 3, GSH(t), is quite stable, fluctuating only between 5,500 and 8,000  $\mu$ M (even though the steady state values vary between 4,151 and 8,516  $\mu$ M). We verified this calculation in two ways. Firstly, we confirmed that the solution during the 19th month (and indeed for many earlier months) matches that of the 20th month. Secondly, by initiating the program with many different initial conditions, we consistently arrived at the same periodic solution after a few months.

The intuitive reason that GSH(t) is fairly stable is that GSH changes quite slowly when estradiol and S(t) vary. Table 2 shows an example. We began with the steady state for S = 1.8, but changed the value of S to 1.3 at t = 0, where the steady state of GSH is 6,842 µM. Table 2 shows the h and days as GSH slowly descends to 6,842 µM. The transition takes about 28 days.

Because GSH changes very slowly when estradiol and S change, the GSH concentration at each time is a weighted average of both low and high GSH concentrations corresponding to many different *S* values; this is the reason why GSH is so homeostatic. Note that the only significant deviation of GSH in Panel B of Figure 2 occurs during days 10-14 when estradiol and *S* become very high, thus depressing the GSH concentration [Table 1].

# Sex differences in the toxicity of acetaminophen

Acetaminophen (APAP) is the most widely used over-the-counter and prescription painkiller in the world<sup>[32]</sup>. While safe at therapeutic doses of up to 4 g per day for adults, APAP overdoses, either accidental or intentional, are one of the leading causes of acute liver failure in the United States<sup>[33]</sup>. APAP is metabolized by conjugation with sulfate and glucoronidate; these conjugates are inert and are excreted in the urine. Depending on the dose, a fraction of APAP is converted into a highly reactive toxic intermediate, N-acetyl-p-benzoquinone imine (NAPQI), by several P450 cytochromes<sup>[34]</sup>. Substantial amounts of NAPQI are effectively eliminated by conjugation with glutathione (GSH). However, after a large dose of APAP, the sulfonation reaction becomes saturated and the build-up of NAPQI depletes GSH in the liver, causing further accumulation of NAPQI. Unconjugated NAPQI binds to proteins and subcellular structures and induces rapid cell death and necrosis that can lead to liver failure.

20

25



Table 2. GSH ( $\mu$ M) changes slowly after S switches from 1.8 to S = 1.3. This is the reason that GSH varies less in the menstrual cycle than the steady states of GSH would suggest

**Figure 3.** The stability of GSH. Panel A shows the 95th percentile (blue), the mean (green), and the 5th percentile (red) of estradiol during the menstrual cycle. The curves are drawn by interpolation of data from<sup>[24,25]</sup>. Panel B shows the relative stability of GSH during the cycle (varying from 5,500 to 7,900  $\mu$ M). This is true despite the wide range of steady state values [Table 1 and Figure 2A]. See the text for an explanation.

15 Time (days)

10

ົດ

5

Many experimental studies have shown that female mice are less susceptible to APAP hepatotoxicity than males and that the sex differences are substantial<sup>[17,18,35]</sup>. Many of the mechanisms have been elucidated by the Jaeschke group in Kansas<sup>[18,36,37]</sup>. Here, we combine our APAP model<sup>[10]</sup> with the one-carbon and glutathione model described in Methods. We show that, indeed, the sex differences are substantial, and we give an explanation. Our APAP model is a whole-body model of APAP that includes transport from the gut to the liver, the liver metabolism described in the previous paragraph, transport out of the liver to the blood, and excretion in the urine. The physiological basis of our model is the reaction diagram [Figure 1] and the  $K_m$  values for the enzymes; we choose human values when they are available. We choose compartment sizes and doses corresponding to humans. It should be noted that we do not include mitochondrial glutathione, which the Jaeschke group has found to be fundamental in APAP pathophysiology<sup>[36]</sup>. To replicate specific mitochondrial GSH mechanisms and data from in vivo mice models, a mitochondrial compartment needs to be added. Nonetheless, our modeling study<sup>[10]</sup> showed that the model results compare well to several experimental and clinical studies (figure 2, figure 6, figure 13 in<sup>[10]</sup>). In particular, we showed that our predictions of life and death after overdose correspond well to a clinical study in the University of Utah Hospital; see figure 13 in<sup>[10]</sup>. Our APAP model, combined with our GSH model, gives predictions about humans.

The epidemiological data on sex differences in acetaminophen-induced liver injury in humans is inconsistent, which can be attributed to confounding factors such as variations in age, dosage, time elapsed from ingestion to hospitalization, and time from ingestion to N-acetylcysteine administration. For example, in a United States retrospective study<sup>[20]</sup>, it was found that women have a higher risk of adverse outcomes than men in cases of acetaminophen-induced acute liver injury. However, a prospective study in Iceland<sup>[19]</sup> reported that the prevalence of hepatoxicity was higher in men than in women. In this same study, older age, not sex, was associated with the risk of acute liver failure. Another population-based study done in

Asia<sup>[21]</sup> found a significant association of hepatoxicity with ethnicity, while it found no such association with sex or age.

The maximal therapeutic dose recommended by the FDA is 4 g/day. With this therapeutic dose, there is little cell death and little change in GSH for both males and females. A 20 g dose without treatment is considered possibly lethal<sup>[38]</sup>. It is important to note that there is variability among human clinical data and our model only makes predictions for the "average" human. We have found that the greatest differences between the male and female responses are in the moderate to high range, which is why we show responses to 15 and 18 g in Figure 4. A very high dose of 30 g shows little difference between males and females.

In Figure 4, we show the percentage of healthy liver cells still alive and the GSH concentration in the liver for the male and for the female for the first 80 h after ingestion of an overdose. Panels A, B, and C show the percentage of surviving hepatocytes for a 15 g dose, for an 18 g dose, and for a 30 g dose for males and females, respectively. The grey bar represents the 30% level of functional hepatocytes below which liver failure is thought to occur<sup>[38]</sup>. In Panel A, one can see that the 15 g dose has a relatively small effect on the percentage of surviving hepatocytes in females, descending only from 1 to 0.9. In males, by contrast, the percentage declines below 0.4, dangerously close to the 0.3 survival line. Panels D, E, and F show that GSH levels plunge to near zero in all cases, but that GSH recovers more rapidly in females. Panel B shows the time course of functional hepatocytes after an 18 g dose of APAP. In this case, the female curve descends below 0.6 and the male curve descends well below 0.3. Therefore, without treatment, the female is predicted to die. Again, we see in Panel E that female GSH recovers more quickly than male GSH. This reproduces a result found by Du *et al.*<sup>[18]</sup>. With the 30 g dose, both males and females die and there is not much difference between the curves<sup>[37]</sup>. These are the results of APAP overdose without treatment; we consider intervention in the next section.

Our computations show that the sexual dimorphism in one-carbon metabolism plays only a small role in the glutathione pathway (the velocity of CBS is not much different in the two cases, Table 1). So, it is the estradiol and the regulatory motif (Figure 2, Panel B) that increases the synthesis velocity and the concentration of GSH in the female liver.

GSH is a tripeptide consisting of glutamate, glycine, and cysteine. Of the three, cysteine has a far lower concentration in liver cells than glutamate and glycine. Thus, intravenous N-acetylcysteine (NAC) is the antidote for APAP overdose given in Emergency Departments. NAC limits the hepatoxicity of APAP by increasing the synthesis of GSH in the liver<sup>[39]</sup>. Our APAP program allows us to investigate the consequences of different dosing protocols of NAC on the recovery of GSH after an APAP overdose<sup>[10]</sup>. We illustrate this by attempting to rescue the male [Figure 5] after an 18 g overdose of APAP. A typical dose of NAC is 300 mg/kg, which is approximately 18 gm for a 60 kg person, or 36,000  $\mu$ M of NAC. We give 1/3 of this dose over the first 2 h and 2/3 of this dose over the next 3 h. The results are shown in Figure 5.

The black curve in Figure 5 shows the response of the male to an 18-gm dose of APAP if not treated. The result is almost certain liver failure because he has less than 30% of his hepatocytes over an extended time. The green curve shows the rescue of the male by the protocol described above, starting 10 h after ingestion. Since the green curve stays above the 30% line, the man will likely survive. The pink curve shows rescue by NAC starting at 16 h after ingestion. Rescue is possible but problematic since the pink curve descends somewhat below 30%. The contrasting outcomes of rescue at 10 h *vs.* 16 h underscore the widely acknowledged clinical observation that early intervention is crucial<sup>[40,41]</sup>. It is important to highlight the variability of clinical data; for instance, case reports have demonstrated survival after a 25 g overdose<sup>[42]</sup>, and



**Figure 4.** Sexual differences in responses to APAP. Panels A, B, and C show the percentage of surviving hepatocytes for females (blue curves) and males (red curves) for a 15 g dose, an 18 g dose of APAP, and a 30 g dose of APAP, respectively, over the first 80 h after ingestion. The 15 g dose is not lethal, the 18 g dose is marginally lethal, and the 30 g dose is definitely lethal without N-acetyl cysteine (NAC) rescue in the ER. The 15 g and 18 g doses show large differences between males and females, while at 30 g, the responses are similar. At 4 g, the daily maximal dose recommended by the FDA, there is also no difference between the sexes (simulations not shown). Panels D, E, and F show the corresponding concentration curves for GSH. As shown in the literature<sup>[18]</sup>, for moderate to high doses, female GSH recovers more quickly than male GSH.



**Figure 5.** Rescue by N-acetyl Cysteine. The black curve shows the response of the male to an 18-gm dose of APAP if not treated. The result is almost certain liver failure. The green curve shows the NAC rescue of the male by the protocol described in the text starting 10 h after ingestion. The pink curve shows rescue by NAC starting at 16 h after ingestion; rescue is possible but problematic.

current guidelines in the United States and Canada indicate a high-risk ingestion to be ingestion of at least 30 g of APAP<sup>[43]</sup>.

# DISCUSSION

By combining previous models and making a few parameter changes, we have created a new model of glutathione metabolism that we have used to investigate sexual dimorphism in the glutathione pathway in the liver. Although many enzymes in one-carbon metabolism are affected by the sex hormones testosterone and estradiol, the main reasons for sexual dimorphism in glutathione metabolism are the effects of estradiol and the GSH regulatory motif, which includes the inhibition of GS and GCL by GSH itself [Figure 2B]. To understand the effects of estradiol on such a complicated network, mathematical computation is required.

We defined S to be a factor multiplying the  $V_{max}$  values of GCL and GPX representing the activation of GCL and GPX, so S = 1 for males and S = 1.8 for females for average estradiol, since we make a case based on experimental and clinical results that the activation is by 80%. Then, we showed in Figure 1 that the male steady-state concentration of GSH is 4,971 µM, while the female steady-state concentration of GSH is 4,971 µM, while the female steady-state concentration of GSH is 8,516 µM. In addition, the rate of synthesis of GSH, GS, is higher in females. In Section 2, we computed how the steady-state concentration of GSH in females depends on the size of *S*. Interestingly, the female steady-state is low for *S* near 1 and also low for S = 3.31, but at intermediate values of *S*, the female steady-state is considerably higher than that the male's. We explained that this non-monotone behavior of the female GSH curve is caused by the inhibition of GCL and GS by GSH.

GSH is the main antioxidant and detoxicant in the body. Using a previous model<sup>[10]</sup>, we explained how this works in the case of acetaminophen (APAP) which is hepatotoxic. Our model suggests that the large male-female differences in GSH concentration and the velocity of its synthesis cause females to be less sensitive to APAP toxicity compared to males. This is consistent with experimental data in mice<sup>[17,18]</sup> and in the human study<sup>[19]</sup>. We note, however, that human studies are controversial on this point.

We also investigated the behavior of GSH(t) during the menstrual cycle, and showed that GSH remains stable during the menstrual cycle, which was completely unexpected given the wide range of GSH steady states seen in Figure 2. We explained that this important result arises from the very slow change of GSH as S(t) is varied, and suggest that this may be an important evolutionary adaptation.

# LIMITATIONS

Our models are based on the underlying physiology and the kinetics of the enzymes, but no model can encompass the entirety of biological complexity. Thus, our model necessarily incorporates simplifications. In our model, serine and glycine in the cell remain constant, as is methionine input (important for the synthesis of cysteine). For simplicity, we assume that the activations of GCL and GPX are equal, though that may not be the case. There is a lot of variance in gene expression levels, even for identical genes in different individuals<sup>[44-46]</sup>. The amount of estradiol produced during the menstrual cycle varies a lot in different women (see Panel A of Figure 3). Our APAP model<sup>[10]</sup> is simple because it does not include the processing of GSH in the mitochondria that has been shown to be fundamental for liver cell death in the presence of APAP<sup>[36]</sup>. We also take 30% of surviving hepatocytes to be the boundary between surviving and dying without NAC rescue<sup>[38]</sup>. Human responses are variable, and the outcomes may depend on the overall health of the patient. In fact, it has been reported that some mice die even though they retain 70% of their hepatocytes<sup>[37]</sup>. Finally, we have concentrated on the effect of estradiol on glutathione metabolism and have not include the effects of progesterone<sup>[47-49]</sup>.

# DECLARATIONS

# Authors' contributions

Developed the model, ran simulations and analyses, interpreted the findings, and contributed to the writing and editing of the manuscript: Cruikshank A, Reed MC, Nijhout HF

# Availability of data and materials

Computer models and codes used in this paper can be obtained from the authors by request.

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#### **Conflicts of interest**

All authors declared that there are no conflicts of interest.

#### Ethical approval and consent to participate

Not applicable.

#### **Consent for publication**

Not applicable.

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