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## Forcing a dynamic model for oil production and EROI evolution: The Oil Game

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#### Abstract

Since 1940, many attempts to model world oil production have been proposed. Those approach, using increasing complexity, consider the growing and decay of production independently of external, time-varying, causes. It is here proposed to extend the production equation by modelling a dynamic dependency between oil production and its Energy Return On (Energy) Invested (EROI), using Lotka-Volterra equations and to apply the model to all liquid fossil fuels. The model obtained, after comparison with oil extraction and EROI evolution on the period 1960-2010, illustrates the production dynamic and the existence of an external, controlling parameter: the production/exploration effort which account for the re-investment in the production and exploration processes. The evolution of this parameter provides some possible explanations about the progress of the oil shocks and also some possible explanations about the peak prediction issues of the classical Hubbert model. Studying this evolution also suggests an attempt to control the oil production in order to obtain a linear time evolution on the period 1960-2010 through an apparently linearly growing production/exploration effort: the oil game. Since the end of the oil shocks, this control has been slightly inflected for the first time around 2000-2005, what could explain the evolution in fossil fuel investment from that time. Unfortunately, in order to keep a linearly growing production at long time scale, the production effort has actually to evolve exponentially: the linear growth is in fact a short time scale approximation of the control required to play the oil game. Therefore the production effort will require more frequent and stronger inflection in the future, what suggests more frequent and stronger recession period, since the economy seems strongly correlated to the production effort, as an oil price

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chart comparison with the production effort suggests. Finally, playing the oil game until the end would lead to a peak of all liquid fossil fuels between 2080 and 2090, when EROI=1, followed by a quick collapse of oil production. Hence production will be strongly asymmetric regarding the peak, contrary to the prediction suggested by Hubbert's model.

Keywords: Oil production, EROI, dynamic model, production effort

#### 1 Introduction

Models that account for oil production have been published from 1962 [1], 2 with increasing complexity ([2, 3, 4], citing only very few of them). These 3 models rely on a production dynamic with constant parameters. The aim of 4 this study will be to evaluate how the parameters could evolve in time, based 5 on a coupling between oil production and its Energy Return On (Energy) 6 Invested (EROI), as primarily defined in [5] or [6]. Through this dependency, 7 it is expected to explain why the prediction of peak is always delayed. The 8 model suggested is based on a Lotka-Volterra set of equations, linking an oil g production Q with its mean EROI. In this approach, Q is the EROI predator 10 as the production "feeds" on EROI to grow. 11

The article is organised as follow: A first part is dedicated to a pre-12 sentation of an assumption on the oil distribution as a function of EROI, 13 suggesting why the model applies to the production of all liquid fossil fuel. 14 It also presents a discussion on a "physical" meaning of a mean EROI, as 15 presented in studies like [7] where EROI is derived based on thermodynamics 16 assumptions. The model itself and the set of equation are then presented, 17 along with the meaning of the parameters that appear in the model. Some 18 sub-models are here suggested for these parameters. A fitting of the model 19 parameters based on historical evolution of oil production and mean EROI 20 is then performed. Finally, an analysis of the production effort, a forcing 21 parameter, is done, suggesting the existence of a benefit/production opti-22 mization: the oil game. 23

A second part is dedicated to the projection of the production effort that followed the same trend from the mid eighty's to 2000. An extension to the year 2020 is also discussed, showing an evolution of the production dynamic and a need to update the dynamic in 2020 in order to keep a linearly growing production. A business as usual scenario is also studied, to evaluate the ultimate peak (which is reached when EROI=1) and the following collapse of oil production.

Finally, a relation is suggested between long time scale oil price evolution and
 production effort.

#### <sup>33</sup> 1. Modelling the interaction between oil production and EROI

# An assumption about the oil production distribution as a function of EROI

This section is dedicated to the description of the interactions between 36 production of all liquid fuel Q and EROI. This description is based on the 37 assumption that the EROI considered is representative of the mean EROI of 38 all liquid fossil fuel at a given time. Therefore, it is suggested that this value 39 can only decrease with time, even if at a given time some oil sources with 40 higher EROI than the mean value can exist. Also, the following assumption 41 is suggested: if there is no oil (in any form) available at a given EROI, 42 there will always be some existing oil at a lower EROI. This description 43 does not exactly fit the reality of "measured" EROI, nevertheless it has some 44 "physical" meaning which presents some interest for modelling purpose. The 45 value of this mean EROI should be close to actual oil sources EROI as those 46 presented in [5]. 47

A good candidate to represent this quantity could be the thermodynamic model suggested by [7], which behave as described above and presents values at different times which are consistent with actual, measured values. Using the values of [7] to calibrate this model will certainly not allow to estimate precisely the time evolution of oil production effort, but it should allow to evaluate its global trend over the last decades to estimate its evolution in the forthcoming decades.

#### <sup>55</sup> 1.2. A dynamic model for oil production and EROI evolution

The approach suggested in this study considers oil production Q (in billion barrels) as a predator of its mean EROI. Indeed, in a prey/predator analogy, oil production is feeding on EROI to grow, as suggested by the following set of equations.

The oil production Q is suggested to be growing proportionally to EROI and Q, and has a natural decay due to the mortality rate of oil sources, therefore proportional to Q only, as the mortality rate (also called decay or depletion rate) defined in [8] suggests. The production time derivative is

composed of two terms: the growing term and the decaying term. The grow-64 ing term can be justified the following way: At a given time t, a production 65 Q is available, so that the largest quantity that can be extract on time t + dt66 is equal to  $Q \cdot EROI$ , according to the EROI definition of [6]. The maximum 67 growth dQ during a time dt is equal to  $(Q \cdot EROI - Q) \cdot dt = Q \cdot (EROI - 1) \cdot dt$ . 68 Let's consider a parameter  $k_0$  (in year<sup>-1</sup>), called production effort. Hence, 69 the effective growth dQ during a time dt is equal to  $k_0 \cdot Q \cdot (EROI - 1) \cdot dt$ , 70 with  $k_0$  in [0; 1]. 71

The decaying term of Q is simply equal to  $k_1 \cdot Q \cdot dt$ , where  $k_1$  is the mean oil source mortality (in year<sup>-1</sup>), as defined in [8].

The prey is decreasing proportionally to EROI and Q, and is supposedly 74 growing due to the renewal of fossil fuels, which can be considered as happen-75 ing at geological times. This effect is therefore neglected. The EROI decay 76 can be explained the following way: For each unit of Q that is extracted, 77 the relative EROI variation is proportional to a parameter  $k_2$  (in (billion 78 barrels.year)<sup>-1</sup>), the EROI decaying term is then equal to  $k_2 \cdot Q \cdot EROI \cdot dt$ . 79 Parameter  $k_2$  is expected to decrease in time, as our ability to extract oil prop-80 erly increase, and according to the natural distribution of oil as a function of 81 its availability on earth. In order to model  $k_2$ , the following dependency is 82 proposed:  $k_2 = C/(t - t_0)$  where C is a constant (in (billion barrels)<sup>-1</sup>) and 83  $t_0$  (in year) is a time offset.  $C^{-1}$  can be interpreted as a technology evolution 84 rate. 85

<sup>86</sup> The following equations are obtained for production and EROI dynamic:

$$\dot{Q} = k_0 \cdot Q \cdot (EROI - 1) - k_1 \cdot Q , \qquad (1)$$

87

$$E\dot{R}OI = -k_2 \cdot Q \cdot EROI \,. \tag{2}$$

It is noticed that, amongst these parameters,  $k_1$  and  $k_2$  seem to represent some effective "physical" properties of the system, whereas  $k_0$  represents a forcing parameter on which oil producers can play to adapt the oil extraction to their need.

#### <sup>92</sup> 1.3. Fitting the model parameters on the period 1960-2010

Since  $k_1$  represents the oil sources mean mortality, it is assumed it should fit measured data. For instance, according to [8], the mean value lies in the range 4.1 - 6.7%. Therefore,  $k_1$  is taken as a constant and  $k_0$  and  $k_2$  are fitted for the different values of  $k_1$ , within the range 4 - 7%. Now, based on <sup>97</sup> Eq.(1) and (2), setting a value for  $k_1$ , it is possible to plot  $k_0$  and  $k_2$  time <sup>98</sup> evolution, based on historical data of Q and EROI:

$$k_0 = \frac{\dot{Q}}{Q \cdot (EROI - 1)} + \frac{k_1}{(EROI - 1)},$$
 (3)

99

$$k_2 = -\frac{E\dot{R}OI}{Q \cdot EROI} \,. \tag{4}$$

The oil production data is extracted from [9] and the EROI data is extracted from [7]. The analysis is performed on the period 1960-2010 using a three-year averaging on Q and a second order upwind method to calculate Qand EROI derivatives. The evolution obtained for  $k_2$  is presented in Fig.1. The continuous line represents the model  $k_2 = C/(t - t_0)$ , with C = 0.06036(billion barrels)<sup>-1</sup> and  $t_0 = 1950.5$  year.

The model seems to fit adequately the data, with a mean relative error 106 of 1.05%. The evolution shows two periods: The first one, before the first 107 oil shock, corresponds to a rapid and smooth evolution of  $k_2$ . The second 108 one, after the second oil shock, shows some jumps which could correspond to 109 technological jumps, or simply the exploitation of fossil fuels that were not 110 exploited before due to their low EROI, in comparison with the mean EROI 111 of the moment. When these sources become of interest and start being 112 exploited, the value of  $k_2$  suddenly drops because exploiting these sources 113 does not affect much the mean EROI. 114

#### 115 1.4. Studying the production effort

This section aims at studying the evolution of the investment in pro-116 duction/exploration. This investment can be evaluated through the value 117 of  $k_0$ , which lies in the range [0, 1]. It is nevertheless suggested to study 118  $k_{eff} = k_0 (EROI - 1) / EROI$  rather than  $k_0$ , as  $k_{eff}$  lies in the range  $[0; +\infty]$ , 119 in order to have a broader choice of function that could fit the data. The 120 parameter  $k_{eff}$ , which represents the forcing of the system is plot over time 121 in Fig.2 for  $k_1 = 5\%$ . Its analysis provides some possible characteristics of 122 the oil extraction strategy, which are presented below. 123

On the period 1960-1968,  $k_{eff}$  shows a relatively linear behaviour. This period corresponds to an evolution of oil extraction that begin to behave as exponential around 1965. Due to the laws of market, and the oil price at this period which is rather low, keeping an exponential growth for Q could have been responsible for an important decrease in oil price. In order to keep

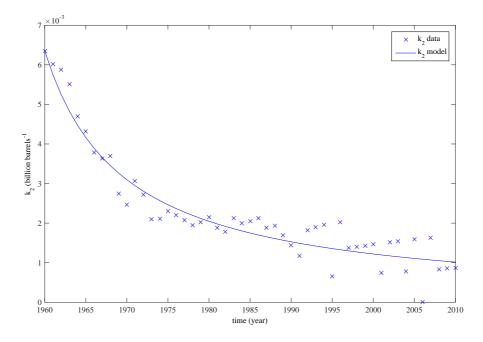


Figure 1:  $k_2$  time evolution

a decent benefit without using too much of their resources, producers have to reduce Q, by reducing  $k_{eff}$ . This strategy begins in 1969, according to Fig.2. However, due to the behaviour of  $k_2$  at this time, the system shows a great inertia and damping  $k_{eff}$  is not sufficient to control instantaneously Q. Any reasons could have been sufficient to suddenly reduce  $k_{eff}$  and adapt Q. Three years after the first inflection of  $k_{eff}$ , the first oil shock happen and  $k_{eff}$  is adapted.

After the first shock,  $k_{eff}$  is surprisingly constant, with a linear time evolution for Q. The second shock corresponds to another, longer drop of  $k_{eff}$ .

After the second shock,  $k_{eff}$  seems to evolve (globally) linearly, with raises and plateaus during the period 1985-2000. The solid line corresponds to the equation  $k_{eff} = 0.00349 + 0.000173 \cdot (t-1985)$ , which fits the data with a mean relative error of less than 1%. This behaviour allows Q to grow linearly in time. Also, since the system inertia has evolved in time with  $k_2$ , the plateaus are responsible every time for a slow damping of Q, which corresponds to

past predictions of a nearby peak, using Hubbert's curves. This phenomenon 145 leads every time to an economical recession and a raise in oil price (this can 146 be shown in comparing Fig.2 with an oil price chart), at the moment where 147 producers need to increase their investment to keep  $k_{eff}$  close to the solid line 148 that ensure a linearly growing Q. The origin of this raise/plateaus dynamic 149 can be explained the following way: With time, the production of an oil 150 source eventually decreases, meaning that exploration is firstly needed to 151 extract more oil. It means that if exploration does not suggests new sources 152 to exploit, the production stagnates because it is not possible to invest in new 153 sources, therefore  $k_{eff}$  is constant or slightly decreasing. When new sources 154 become available, the production effort can quickly increase until the new 155 sources become less available and then exploration has to start again. 156

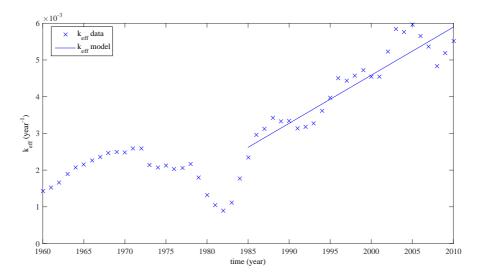


Figure 2:  $k_{eff}$  time evolution for  $k_1 = 5\%$ 

It is here noticed that  $k_{eff}$  depends on the choice of  $k_1$  according to Eq.(1), hence the parameter  $k_{eff}$  has been fitted for different values of  $k_1$  in the range 4 - 7%. A numerical sensitivity study is conducted on  $k_1$ , using a Runge-Kutta 4 method with a 0.5 year time step to solve Eq.(1) and (2) from 1960 to 2010. It leads to various results in test simulations, always in a 5% range of previsions for production and EROI evolution, for  $k_1$  in the range 4 - 6%.  $k_1 = 7\%$  is discarded in this study since it leads to slight underestimation of production and peak, suggesting 7% is an overestimation of the actual value of  $k_1$ . Since the value of  $k_1$  cannot be set with a greater accuracy, all the results presented in this study will be calculated with  $k_1$  in the range 4 - 6%.

#### <sup>168</sup> 2. Projections of the production effort

#### <sup>169</sup> 2.1. Projections based on the constant 1985-2000 dynamic

Following this line using raises and plateaus, allow to optimize the oil 170 benefit and production: It could be compared to a game where  $k_{eff}$  should be 171 kept on this line to optimize benefits. This strategy can then be extended to 172 for the forthcoming years. One can observe nevertheless that  $k_{eff}$  begins to deviate 173 on the period 2000-2010. It seems that, in order to keep a constant derivative 174 for Q,  $k_{eff}$  should not follow the same trend any more. Extending the data 175 using Eq.(1) and Eq.(2) to fit Q values allows to evaluate the evolution of 176 this slope. On the period 2000-2020, the slope seems to be different from 177 the one observed on the period 1985-2000. Instead of plateaus, between 2005 178 and 2010, drops are required on  $k_{eff}$  to fasten the effect on Q, and the mean 179 slope has to be higher than before. 180

#### 181 2.2. The limit of the 2000-2020 dynamic

The extension of that game actually shows the real rule: in order to 182 keep a linearly growing Q,  $k_{eff}$  has to evolve exponentially in time. To 183 keep playing that game the way it started,  $k_{eff}$  should follow the equation 184  $k_{eff} = 1.3839 \cdot 10^{-27} \exp{(t/\tau)}$  with  $\tau = 34.57$  years  $\pm 0.8$  year. Fig.3 shows 185 the extension of  $k_{eff}$  on the period 2005-2020 along with a projection using 186 the exponential fit. This projection suggests that the slope has again to be 187 inflected, by strongly inflecting the shoots between the plateaus/drops. It 188 also requires exploration to be more and more efficient, to ensure that the 189 plateaus won't last for too long. According to [10] for instance, the exact 190 opposite is expected for exploration, but such studies do not take into account 191 that  $k_{eff}$  represents for the moment less than 1% of the available investment, 192 which suggests that oil producers could invest way more in exploration. It is 193 nevertheless in accordance with [7] and [10] on one point: This is the end of 194 cheap oil, in the sense "it is the end of cheap oil extraction". 195

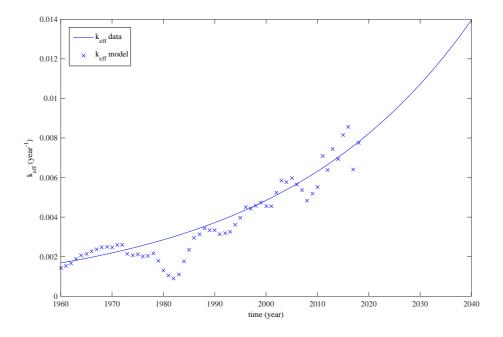


Figure 3:  $k_{eff}$  time evolution for  $k_1 = 5\%$ 

#### <sup>196</sup> 3. A business as usual scenario

Supposing the exponential investment dynamic could be sustained until 197 the mean liquid fossil fuel EROI drops to 1 represents a business as usual 198 scenario where oil is extracted until the energetic benefit drops to zero. It 199 would allow a linear growth of Q until 2088-2090, depending on the actual 200 value of mortality rate  $k_1$ : 2088 is the limit for the highest realistic value of 201 mortality rate  $(k_1 = 6\%)$  and 2090 is the limit for the lowest realistic value 202  $(k_1 = 4\%)$ . This linear growth is followed by a quick collapse of Q down to 203 zero in 12 to 18 years, again depending on the value of  $k_1$ . This scenario 204 supposes that oil can be extracted until  $k_0 = 1$ , i.e. when oil extraction 205 cannot generate benefits any more. It does not take into account all the 206 marginal costs of the oil business, hence collapse of oil production will occur 207 before  $k_0$  reaches 1. In order to let the reader evaluates by herself/himself 208 the oil peak based on a threshold value of  $k_0$ , a plot of  $k_0$  as a function of 209 time is presented in Fig.4 for the extreme values of  $k_1$ . 210

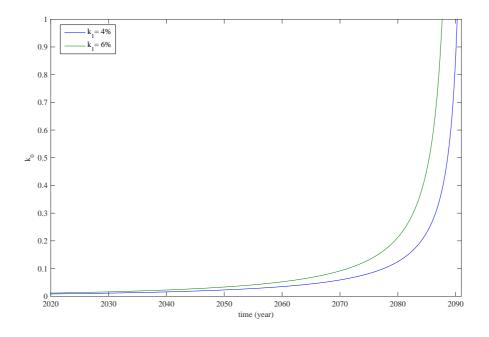


Figure 4:  $k_0$  time evolution for  $k_1$  in the range 4-6%

#### 4. A relation between production effort and oil price

The origin of oil price variation is a highly discussed topic. According 212 to some authors as [11], it might not follow the law of market any more. It 213 is also discussed as being a consequence of geopolitical events, as discussed 214 in [12] or [13] for instance. In this article, it is suggested, as mentioned in 215 section 1.4, that rapid increase in oil price are due to drops or plateaus in 216 investment, what is likely linked to geopolitical events. It is now suggested 217 that long time scale oil price variations should follow the same global trend 218 as the production effort, in order to keep a constant relative benefit for oil 219 producers. 220

Looking at a long time scale history of primary resource prices (such as metal to begin with) suggests the existence of an average value over time, as observed in [14] for iron, with variations around this value due to geopolitical events. For oil, history begins the same way, but after the oil shocks of the 70's happen, the price never went down to its former, "usual", average value, as it can be observed in data such as [15] or [16]. It is here suggested that oil shocks happen also because the production effort finally reached a value that could not be neglected any more. Said otherwise, the cost of oil production itself was negligible in the global cost of the oil business, hence there was no link between price and production effort until the late 60's.

The evolution of a "mean" oil price is now discussed, meaning that only the global trend is discussed, without considering short time scale variations due to geopolitical events. After the shocks of the 70's, it seems necessary for this mean price to follow the same trend as the production effort, to keep a constant benefit per barrel. This suggests oil price should rise exponentially, starting in the 70's, with a characteristic time of roughly 35 years.

This remark seems in accordance with observation, since a sudden raise 23 in oil price, similar to the oil shocks, occurred around 2000-2005. If the 238 link suggested in this section actually exists, the time gap between the two 239 major raises of oil price is somehow a measurement of the production effort 240 characteristic time  $\tau$ . This suggests the model led to a slight overestimation 241 of  $\tau$ , most likely due to the difference between actual EROI history and the 242 data used in this study to calibrate  $\tau$ . It means  $\tau$  is rather in the range 30-35 243 years and that the higher estimation of  $k_0$  on Fig.4 should reach 1 around 244 2080 rather than around 2088. 245

As a consequence, considering a business as usual assumption, oil price is expected to stabilize around 75 \$2014 per barrel in the forthcoming years, until 2030-2040 where a peak around 200 \$2014 should occur, followed by a stabilization around 150 \$2014. A rapid raise should happen again between 2060 and 2075 around 400 \$2014 followed by a continuous raise until the end of oil production.

#### 252 Conclusion

This study proposes a model which allow to study the oil extraction dynamic. This dynamic, which was constant in the period 1985-2000, seemed to deviate for a new dynamic from 2000 to 2020, what could be considered in agreement with the evolution of the energy economy since 2000.

<sup>257</sup> Nevertheless, this inflection in investment is not sufficient to ensure enough <sup>258</sup> oil production, as production/exploration investment in liquid fossil fuel ac-<sup>259</sup> tually requires an exponential growth (with a characteristic time of roughly <sup>260</sup> 30-35 years) to keep a constant growth of Q. As business usually grows using <sup>261</sup> a linear increase in investment, this required exponential behaviour of  $k_{eff}$  suggests major crisis in oil extraction every 30-35 years. Indeed a piecewise
linear approximation of this curve shows a slope roughly 3 times steeper every 30-35 years, meaning that investment rate has to triple every 30-35 years
instead of being kept constant.

It is also worth noticing that previous previsions of oil peak were due to local, momentary damping of the production effort. Every time, the predicted peak has been postponed through a control of the production effort. It means that oil peak has been postponed several times in history and can be postponed again, possibly until 2090, based on the will of oil producers to increase the production effort up to a maximum value that would still allow to generate some benefits.

Finally, the comparison between oil price chart and production effort at long time scale suggests a need for the oil price to follow the same trend as the production effort. As a consequence, oil price is expected to rise exponentially, also with a characteristic time of 30-35 years.

#### 277 **References**

- [1] M. Hubbert, Energy resources: A report to the Committee on Natural Resources of the National Academy of Sciences–National Research Council (1962).
- [2] A. Bartlett, An analysis of U.S. and world oil production patterns using
   Hubbert-style curves, Mathematical Geology 1 (2000).
- [3] A. Cavallo, Predicting the peak in world oil production, Natural
   Ressources Research 3 (2002).
- [4] R. Duncan, Three world oil forecasts predict peak oil production, Oil and gas journal 14 (2003).
- [5] C. Cleveland, Net energy from extraction of oil and gas in the United States, Energy (2004) 1–14.
- [6] D. Murphy, A. Hall, Year in review-EROI or energy return on (energy) invested, Annals of the new york academy of sciences (2010) 102–118.
- [7] B. Hill, Deplation A determination of the world's petroleum reserve, Hill's group (2015).

- [8] S. Sorrell, J. Speirs, R. Bentley, R. Miller, E. Thompson, Shaping the
  global oil peak: A review of the evidence on field sizes, reserve growth,
  decline rates and depletion rates, Energy 37 (2012) 709 724. 7th
  Biennial International Workshop Advances in Energy Studies.
- [9] J. Rodrigue, C. Comtois, B. Slack, The geography of transport systems,
   2016.
- [10] M. Auzanneau, The European Union can expect to suffer oil depletion
  by 2030, The shift project (2020).
- [11] M. Heun, M. DeWit, Energy return on (energy) invested (EROI), oil
   prices, and energy transitions, Energy Policy 40 (2012) 147–158.
- [12] J. Hamilton, Historical Oil Shocks, University of California, San Diego
   (2011).
- <sup>305</sup> [13] OPEC and Oil Opportunities, Top Of Mind 52 (2012) 16.
- [14] R. Cartman, Commodity prices: A 100-year history, Fastmarkets MB
   Research (2016).
- $_{308}$  [15] British Petroleum (2014).
- <sup>309</sup> [16] NBER /Federal Reserve Bank of St. Louis (2014).