

Clinical outcomes, predictors of prognosis and health economics consequences in IBD patients after discontinuation of the first biological therapy

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Abstract

Background: In real-world clinical practice, biologics in inflammatory bowel diseases (IBD) may be discontinued for a variety of reasons, including discontinuation initiated by gastroenterologists. The aims of the study are to report outcomes after discontinuation and predictors of prognosis after a minimum follow-up of 24 months; outcomes of gastroenterologist-initiated discontinuation with resulting direct cost implications on the health system were also studied.

Methods: IBD patients who discontinued their first-use biologics between January 2013 and December 2016 were identified at our tertiary centre. Reasons for discontinuation and pre-defined adverse outcomes (AO) were recorded. Data were analysed using univariable and multivariable logistic regressions within a machine learning technique to predict AO. Gastroenterologist-initiated discontinuations were analysed separately, and Kaplan-Meier survival analysis performed; direct costs of AO due to discontinuation were assessed.

Results: A total of 147 patients discontinued biologics (M = 74; median age 39 years; Crohn's Disease = 110) with median follow-up of 40 months (range 24–60 months). In the total cohort, there were fewer A0 among gastroenterologist-initiated discontinuations compared with patient-initiated; 54% (of the total group) had A0 within 6 months. Among 59 gastroenterologist-initiated discontinuations, 23 (40%) had IBD-related A0 within 6 months and 53 (90%) patients had A0 by end of follow-up. Some 44 (75%) patients needed to restart biologics during follow-up, and direct costs due to A0 and restart of biologics were high.

Conclusions: The proportion of patients who have AO following discontinuation of biologics is high; clinicians need to carefully consider predictors of poor prognosis and high relapse rates when discussing discontinuation. The direct costs of managing AO probably offset theoretical economic gains, especially in the era where cost of biologics is reducing. Biologics should probably be continued without interruptions in most patients who have achieved remission for the duration these remain effective and safe.

Keywords: biologics discontinuation, biologics withdrawal, Crohn's disease, direct costs, health economics, IBD, predictors of prognosis, ulcerative colitis

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Background

Inflammatory bowel diseases (IBD) are increasing in incidence and prevalence, including in newly industrialised countries, and are now considered a global disease.^{1,2} The use of biological therapies for management of patients with IBD is part of guidelines from all societies, including the European Crohn's and Colitis Organisation (ECCO) as well as the British Society of Gastroenterology, UK.3,4 The approval of drugs as well as guidance are based on pivotal trials,5-10 and have given clinicians multiple options to treat patients. However, real-world data suggest response rates as low as 30%, with a significant proportion needing to discontinue biologics due to a variety of adverse events;11,12 some patients choose to discontinue due to personal choice (e.g. pregnancy, patient-perceived risk of malignancy). Further, the 2019 updated guidance from the National Institute for Health and Care Excellence (NICE) in the UK says: 'Biologics should only be started by clinicians with experience of their use in IBD and their clinical benefit should be reviewed regularly'. 13 Review of biologic therapy for patients in remission is advised to be undertaken every 12 months,14 audited by local commissioning groups, and hence this practice is common in most hospitals managing IBD. NICE, however, does not give any recommendations about specific investigations prior to the decision.15 ECCO guidance on treatment withdrawal (exit strategies) has been published to help clinicians make rational cost-effective decisions while managing patients, but the recommendations are based on limited evidence.16 Most often in the UK, payers follow the NICE guidance.

It is known that biologics have been the main driver of expenditure of healthcare costs in IBD in the past decade,17 and such guidelines aim to rationalise therapy and ensure maintenance of economic feasibility, but also bring challenges to both clinicians and patients alike. In accordance with the NICE guidance clinicians often consider biological discontinuation based on absence of clinical symptoms, and we wished to understand the consequences of such practice in terms of costs and outcomes. There is a real and definite risk of relapse of disease, although current evidence shows considerable variation in the proportion of patients who relapse within a year of discontinuation. As per ECCO review on biologic therapy, the risk of relapse after anti-TNF withdrawal is between 30% and 40% at 1 year, and

>50% beyond 2 years. ¹⁶ This ranges from 30% to as high as 60% in some studies, depending on follow-up periods. ^{18–20}

Based on current evidence, patients who have 'deep' remission confirmed objectively prior to biologic withdrawal are more likely to remain in remission at 12 months of follow-up, and this is more often seen in Ulcerative Colitis (UC) than Crohn's Disease (CD).²¹ To help aid the decision of withdrawal, some studies have attempted to identify risk factors for relapse after discontinuation of therapy¹⁸ but at present there are no controlled studies to confirm the best strategy and benefits of withdrawal.¹⁶

Aims

In clinical practice, patients with IBD have their biologic therapies withdrawn for a variety of reasons. The aims of the study were:

- to report adverse outcomes following discontinuation of biologics
- to identify predictors of prognosis
- to study direct cost implications on the health system following gastroenterologist-initiated discontinuation of first-use biologics.

Patients and methods

All IBD patients who discontinued their first biologic between January 2013 and December 2016 were identified from electronic medical records at University Hospitals Birmingham, UK, which is a tertiary referral centre. To capture adverse outcomes with sufficient follow-up period after discontinuation of therapy, we ensured at least 24 months follow-up for each patient, until end of December 2018, but most patients had a longer duration of follow-up.

Data on reasons for discontinuation of biologics were recorded; relevant clinical information was collected using the hospital biochemistry, radiology and endoscopy databases. A set of pre-defined adverse outcomes that included steroid and other rescue therapies, hospitalisations, and surgery including perianal were recorded. We also included patients who were classed as primary or secondary non-responders to their first biologic, if they had not been switched to another biologic for a period more than 12 weeks since discontinuation. For purposes of our study, primary

non-response was defined as no improvement in clinical symptoms and/or biomarkers at 12 weeks since start of biologics, as recorded by the clinician; secondary loss of response was defined as relapse of clinical symptoms and/or worsening biomarkers after a period of remission on biologic therapy, as recorded by the clinician.

The outcomes of patients were recorded and analysed in two different contexts:

- as an entire cohort (gastroenterologist-initiated + patient-initiated discontinuation) to investigate predictors of prognosis
- as a sub-group who had gastroenterologistinitiated discontinuation only.

The gastroenterologist-initiated cohort was considered separately as this was the principal focus of the study. In this cohort, patients in clinical remission had the drug discontinued as per guidance by NICE, UK. We were interested in investigating the outcomes after discontinuation and also wanted to assess the direct costs after discontinuation of biologic; the burden of these outcomes on the healthcare system were recorded in the form of 'episodes', during the follow-up period. Each pre-defined adverse outcome (including any form of unscheduled patient contact with the hospital) was considered an episode which required some form of action to be taken by healthcare professionals to resolve it. Only those episodes which were related to IBD were considered after assessing the details available for each episode, and unrelated contacts with health care were not counted as an episode.

Statistical analysis

The data were analysed using multivariable and univariable logistic regressions within a machine learning technique in order to predict adverse outcomes, within the stated timeframe by means of R [R Core Team (2019)] package CARRoT Alina Bazarova and Marko Raseta, 2019.²² The latter combines principles of good practice from machine learning, such as cross-validation²³ and those in medical statistics, such as best subset regression²⁴ restricted by the rule of ten events per variable ('one in ten rule').²⁵ CARRoT has been previously successfully used for outcome prediction in the clinical outcomes.^{26,27} Results of

this analysis were used as a guide to stratify patients in the survival analysis. The outcomes stricturing disease, surgery and hospitalisation were merged together and analysed separately by means of univariable regression. We tested the significance of the identified predictors and performed analysis for confounders using bivariate regression for those predictors that were significant. We performed Kaplan-Meier²⁸ and Cox proportional hazards²⁹ survival analysis to compare patients with gastroenterologist-initiated versus patient-initiated discontinuation of biologics. The patients who had their biologics electively discontinued were analysed again as a separate group to detect any differences in their outcomes. Survival analysis and likelihood-ratio test to assess the separation between survival curves were performed by R package survival and visualised via the package R survminer.³⁰

Ethical considerations

This study was registered with the hospital research governance and ethics committee and was given ethical clearance in April 2019 (Reference number CARMS-15164).

Results

Overall discontinuations (Gastroenterologistinitiated + patient-initiated discontinuation of biologics)

A total of 147 patients who discontinued biologics (M=74, median age 39 years; CD=110) were identified. Follow-up ranged from 24 to 60 months (median 40 months). The details of demographics and patient characteristics are given in Table 1.

Fifty-nine (40%) patients had their therapy discontinued by their gastroenterologist, recorded as a joint decision by the treating clinician and patient. This decision was based on assessment of clinical remission using global assessment and blood markers of activity of disease [C-reactive protein (CRP), full blood counts]. In our cohort we noted that endoscopy, cross-sectional imaging or histology were used at the discretion of the clinician but not routinely used before discontinuation of the drug. Details of definitions used for each reason behind discontinuation as well as to definitions used for adverse outcomes are as given in Table 2.

Table 1. Patient demographics characteristics n = 147.

Age and gender	Total group <i>n</i> = 147	
Median age	39 years (range 21–82 years)	
Gender	Male = 74; Female = 73	
Follow-up duration		
24 months	147 (100%)	
24 months	80 (54.5%)	
Disease type	Ulcerative colitis	Crohn's disease
Number of patients	37 (25.2%)	110 (74.8%)
Classification		NA
Ulcerative colitis extent	E1 = 1	
	E2=9	
	E3 = 18	
	Unknown = 9	
Montreal classification for CD	NA	
Age		37
A1		70
A2		0
А3		3
Unknown		
Location	NA	
L1		24
L2		34
L3		39
L4		12
Unknown		5
Behaviour	NA	
B1		3
B2		26
В3		17
Perianal		23
Unknown		41
Race		
Caucasian	20 (54%)	83 (74.5%)
Asian	11 (29.7%)	12 (10.9%)
Afro-Caribbean	2 (5.3%)	2 (1.8%13/110)
Unknown/Unreported	4 (11%)	13 (11.8%)

Gastroenterologist-initiated versus patientinitiated discontinuation of biologics

Among patients who had their biologics discontinued, 60% of discontinuations were patient-initiated. The most common reason in this group of patients was side effects (not otherwise specified). Details of other reasons definitions used and proportion of patients are given in Table 2. Using data from all 147 patients, multivariable logistic regression analysis was performed to identify significant predictors of poor and favourable outcomes. These are presented in Table 3. A separate analysis done for patients with CD only has been included in Supplemental Material Table 8.

In this overall cohort, gastroenterologist-initiated discontinuation resulted in fewer IBD-related predefined adverse outcomes compared with patient-initiated (p=0.01). Figure 1 shows Cox Proportional Hazards curves comparing the two cohorts.

There is good separation between the two groups initially; it was noted that a significant proportion of patients had adverse outcomes within 6 months of biologic discontinuation in both groups and the curves merge at about 40 months, which was the median duration of follow-up in this study.

In the total cohort, significant number of patients (n=96, 65%) needed biologics to be restarted by the end of the study follow-up period.

Gastroenterologist-initiated discontinuation of first-use biologic

Of the total cohort, 59 patients had their therapy discontinued electively; median duration of therapy prior to discontinuation was 24 months (range 1 month–96 months); median CRP at point of discontinuation was 1 mg/L (IQR 5 mg/L) and median haemoglobin at discontinuation was 138 g/L (range 111–169 g/L) This group was analysed separately to better understand outcomes. The decision to discontinue biologics was made by the treating clinician after discussion with the patient, keeping in line with guidance provided by NICE, UK. Further clinical details were collected for these 59 patients, which are as given in Table 4.

Among these patients, all had been on anti-TNFs; 44 (75%) had received therapy for more than 12 months with no differences noted between infliximab and adalimumab and are therefore considered together.

Table 2. Criteria/study definitions used for reasons for discontinuation and adverse outcomes in the study.

Reason for discontinuation	Criteria used to define reason in this study	Proportion of patients
Primary non-response	No improvement in disease status despite at least 12 weeks of therapy	10%
	 Delay of >12 weeks to start next biologic 	
Secondary non-response	Worsening disease status while on biologic therapy	12%
	 Delay of >12 weeks to start next biologic 	
Immunogenicity	Documented proven antibodies to biologic with loss of response	2%
Adverse effects to biologics	No other specific reason mentioned by clinician	14%
Elective discontinuation	 Biologic discontinuation as planned by clinician if patient had been in clinical remission for >12 months 	40%
Pregnancy	 Patient choice to discontinue biologic when pregnancy confirmed (at any trimester) 	2.5%
Patient choice	Patient choice to discontinue biologic (personal choice)	6.8%
Patient non-compliance/ Non-attendance	Patient non-attendance for infusions on >3 consecutive sessions	2.0%
Other	Reasons not falling into any of the above	10.7%
Adverse outcomes	Criteria used to define adverse outcomes in this study	
Flare-up of disease	Flare-up as recorded by clinician	
Steroid therapy	Patient started on either topical +/- oral OR intravenous steroids	
Hospitalisation	Treated as inpatient for IBD-related complications	
Rescue therapy with biologics	Reintroduction of biologic to manage worsening disease activity	
Stricturing disease	Disease progression to new or recurring stricture	
Fistulising disease	Disease progression with new or worsening fistulating disease	
Perianal disease	Disease progression with new or worsening perianal disease	
Surgery	 Surgical procedure indicated for IBD-related complications (included EUA + seton placements, perianal abscess drainage, defunctioning loop ileostomy formation, ileo-caecal resection, sub-total colectomy with ileostomy in our cohort) 	

Some 26 (44%) patients continued thiopurines after biologic stoppage. Patients not on thiopurines had a trend towards lower probability of adverse outcomes during the follow-up period; however, the difference between two groups of patients was not statistically significant (p = 0.32, likelihood ratio = 0.98) (Figure 2).

In this sub-group, 23 (40%) patients had IBD-related adverse outcomes within 6 months after stoppage and 53 (90%) patients had at least one adverse outcome recorded by the end of follow-up. It was also noted that 44 (75%) patients needed to restart biologics at some point during the follow-up period of this study. The proportion of patients

Table 3. Predictors of outcomes in entire cohort.

Predictors of poor outcomes	Time interval when significant	AUROC	Odds ratio (OR) and confidence interval (CI)	Statistical significance
Asian race	• <6 months	• 0.6283	• OR 0.68 95% CI (0.49, 0.95)	• p=0.02
Secondary non- response	<6 months6-12 months>24 months	0.61100.67150.6412	 OR 4.46 95% CI (1.37, 13.7) OR 7.09 95% CI (1.60, 29.97) OR 1.82 95% CI (1.98, 19.03) 	 p = 0.01 p = 0.01 p = 0.001
Steroid therapy	• 12-24 months	• 0.6219	• OR 0.24 95% CI (0.04, 0.88)	• $p = 0.06$
Predictors of good ou	ıtcomes			
Male sex	• >24 months	• 0.638	• OR 0.31 95% CI (0.09, 0.85)	• $p = 0.03$
Elective stop	• <6 months	• 0.6398	• OR 0.24 95% CI (0.05, 0.77)	• $p = 0.03$
Other predictors				
Sex	<6 months6-12months12-24 months	0.51310.53140.5147	 OR 1.11 95% CI (0.42, 2.97) OR 0.78 95% CI (0.19, 3.06) None of the women experienced adverse outcomes 	 p = 0.83 p = 0.72
Race	6-12 months12-24 months>24 months	0.58610.50520.5201	 OR 1.51 95% CI (0.87, 2.84) OR 1.05 95% CI (0.73, 1.58) OR 0.97 95% CI (0.69, 1.4) 	 p = 0.18 p = 0.79 p = 0.84
Rectal 5-ASA at baseline	 <6 months 6-12 months 12-24 months >24 months 	0.56640.56160.53210.5664	 None of the patients who were on this treatment experienced adverse outcomes OR 0.45 95% CI (0.02, 2.42) None of the patients who were on this treatment experienced adverse outcomes 	 NA NA p=0.45 NA
Thiopurine at baseline	 <6 months 6-12 months 12-24 months >24 months 	0.56110.63650.50810.5296	 OR 1.66 95% CI [0.62, 4.41] OR 0.2 95% CI [0.01, 1.14] OR 0.93 95% CI [0.3, 2.61] OR 0.77 95% CI [0.26, 2.09] 	 p = 0.31 p = 0.13 p = 0.9 p = 0.62
Steroid therapy	<6months6-12months>24months	0.51010.50000.5403	 OR 0.91 95% CI (0.30, 2.48) OR 1 95% CI (0.2, 3.97) OR 0.68 95% CI (0.21, 1.91) 	 p = 0.86 p = 1.0 p = 0.49
Endoscopic activity	 <6 months 6-12 months 12-24 months >24 months 	0.50470.51340.53440.5260	 OR 0.99 95% CI (0.73, 1.41) OR 0.94 95% CI (0.62, 1.55) OR 1.06 95% CI (0.76, 1.56) OR 1.05 95% CI (0.76, 1.54) 	 p = 0.96 p = 0.79 p = 0.76 p = 0.77
First biologic	 <6 months 6-12 months 12-24 months >24 months 	0.51920.62970.62650.5055	 OR 1.56 95% CI (0.85, 2.42) OR 1.5 95% CI (0.68, 2.88) OR 1.57 95% CI (0.89, 2.66) OR 0.85 95% CI (0.4, 1.56) 	 p = 0.15 p = 0.25 p = 0.1 p = 0.64
Primary non- response	 <6 months 6-12 months 12-24 months >24 months 	0.56230.50480.52440.5284	 OR 2.84 95% CI (0.72, 9.54) OR 1.11 95% CI (0.06, 6.71) OR 0.52 95% CI (0.03, 2.86) OR 0.45 95% CI (0.02, 2.47) 	 p = 0.11 p = 0.93 p = 0.54 p = 0.46

(Continued)

Table 3. (Continued)

Predictors of poor outcomes	Time interval when significant	AUROC	Odds ratio (OR) and confidence interval (CI)	Statistical significance
Secondary non- response	• 12-24 months	• 0.5638	• OR 2.55 95% CI (0.65, 8.42)	• p=0.14
Side effects	 <6 months 6-12 months 12-24 months >24 months 	0.52160.57610.54750.5518	 OR 0.67 95% CI (0.10, 2.62) None of the patients who had side effects experienced adverse outcomes OR 0.34 95% CI (0.02, 1.84) OR 0.3 95% CI (0.02, 1.59) 	 p = 0.62 NA p = 0.31 p = 0.25
Elective stop	12-24 months>24 months	0.56060.5794	OR 0.59 95% CI (0.18, 1.68)OR 0.49 95% CI (0.15, 1.36)	 p = 0.34 p = 0.19
Rectal 5-ASA following discontinuation	 <6 months 6-12 months 12-24 months >24 months 	0.51270.53990.50900.5430	 OR 0.66 95% CI (0.03, 3.74) None of the patients who were on this treatment experienced adverse outcomes OR 0.75 95% CI (0.04, 4.32) None of the patients who were on this treatment experienced adverse outcomes 	 p = 0.70 NA p = 0.79 NA
Thiopurine following discontinuation	 <6 months 6-12 months 12-24 months >24 months 	0.56210.66670.54390.5286	 OR 1.72 95% CI (0.62, 4.60) None of the patients who were on this treatment experienced adverse outcomes in this time frame OR 0.64 95% CI (0.17, 1.95) OR 0.76 95% CI (0.23, 2.13) 	 p = 0.28 NA p = 0.47 p = 0.62

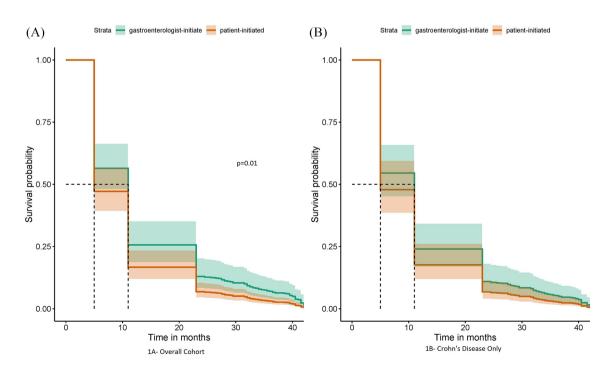


Figure 1. Survival without pre-defined adverse outcomes (gastroenterologist-initiated *versus* patient-initiated discontinuation); (A) overall cohort and (B) for Crohn's disease only.

Table 4. Details of patients with gastroenterologist-initiated discontinuation of biologics (n = 59).

32 (54%) 27 (46%) 9 (15%) 50 (85%) 18 27 5 0 10 17 22 7
9 (15%) 50 (85%) 18 27 5 0 10 17 22
50 (85%) 18 27 5 0 10 17 22
50 (85%) 18 27 5 0 10 17 22
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27 5 0 10 17 22
5 0 10 17 22
0 10 17 22 7
10 17 22 7
17 22 7
17 22 7
22 7
7
n
0
1
14
8
8
29
0
2
7
59/59
9 (15%)
6 (10%)
16 (27%)
11 (19%)
17 (29%)
1 mg/L (IQR 5 mg/L)
138 g/L (IQR 111–169)
59/59
26 (44%)
33 (56%)
44/59
44/59 9 (20%)
44/59

without any adverse outcomes after gastroenterologist-initiated discontinuation is demonstrated in using a Kaplan–Meier survival curve (Figure 3). More than 50% of patients had to restart biological drugs within 2 years of discontinuation.

Episodes of contact with healthcare team

In this cohort of gastroenterologist-initiated discontinuations, we also studied the number of IBD-related unscheduled contacts (triggered by adverse outcomes) these patients had with the healthcare team following gastroenterologist-initiated discontinuation of biologics. Each contact was termed as an 'episode' (included telephone consults + face-to-face reviews + hospitalisations) and data were collected for pre-specified time frames. Each patient could have had more than one episode during the follow-up period, and this was collected as cumulative data. The pre-defined adverse outcomes were flare-up, corticosteroid prescription, hospitalisation, rescue therapy (using urgent biologic therapy as inpatient or urgent ambulatory care) and surgery (including procedures for perianal disease). Only those episodes which were related to IBD were considered after assessing the details available for each episode, and unrelated contacts with health care were not counted as an episode.

Consequently, each patient could have had multiple episodes over the follow-up period. These data were collected in a cumulative fashion to assess the economic burden on the healthcare system as a result of these multiple episodes. The costing was calculated using data from 'unit pricing' at a national level, and service and drug costs at our centre.

For purposes of the study and to calculate financial burden, we made the following assumptions:

- all episodes which followed discontinuation of biologics were a consequence of the discontinuation itself
- all of the episodes could have been avoided had the biologic been continued.

While these are assumptions, these allow calculations that are likely to be a close reflection of the real-world experience of most teams caring for patients with IBD.

The breakdown of the number of episodes at prespecified time points and the cumulative total is

given in Table 5. In our cohort, it was noted that an episode of contact recorded due to a flare-up was the commonest, followed by rescue therapy with biologics. The number of episodes varied with time points, but was noted to increase beyond 24 months of follow-up. Similar detailed follow-up data for episodes of contact with the healthcare team for the physician-initiated discontinuations were not collected, as this was not the focus of our study.

The estimated economic burden of episodes following discontinuation of biologics was calculated using the National Health Service's UK unit-price costs for health and social care list for 2017.³¹ A similar approach has been reported by previous studies that have investigated the economic aspects.³²

A pragmatic approach was used to calculate the direct costs. In our centre, flare-up of disease generally triggers a telephone call by the patient to the dedicated IBD helpline for advice. The unit cost is calculated using the costing for a telephone clinic. The total cumulative cost for all gastroenterologist-initiated discontinuations by type of episode is given in Table 6.

Discussion

Biologics are routinely used in IBD. With a large number of IBD patients now on biologics, they account for a major proportion of costs incurred. Hence the expenditure in health systems, for management of IBD is now driven by medical therapies which are expensive.³³ As a result, healthcare agencies such as NICE in the UK provide guidance to

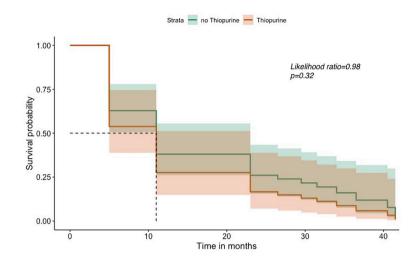


Figure 2. Survival without any pre-defined adverse outcomes in thiopurine *versus* no thiopurine.

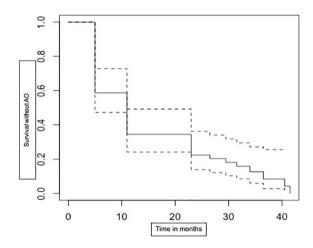


Figure 3. Survival without any pre-defined adverse outcomes among gastroenterologist-initiated discontinuations. A0, adverse outcomes.

Table 5. Details of episodes at pre-specified time points and cumulative total.

Adverse outcomes ('Episodes')	<6 months	6-12 months	12-24 months	>24 months	Total for each adverse outcome
Flare-up	20	18	20	24	82
Corticosteroid therapy	6	5	5	5	21
Rescue therapy (using biologics)	10	14	14	20	58
Hospitalisation	1	0	1	5	7
Progress of disease (Stricturing, penetrating or perianal complication)	3	3	5	5	16
Surgery	2	0	3	3	8
TOTAL EPISODES as per time frame	42	40	48	62	

Table 6. Details of estimated immediate direct costs following gastroenterologist-initiated discontinuation.

Episode	Services utilised	Unit price in GBP (£)	Total number of episodes	Total cumulative cost
Flare-up	Telephone call/clinic	25	82	2050
Corticosteroid therapy	Prescription	9	21	189
	Outpatient attendance	137	11	1507
Rescue therapy using biologics	Outpatient attendance	137	58	7946
	Multi-disciplinary team meeting	243	58	14,094
	Cost of drug/s			
	Infliximab*	1200	66 infusions (11 pts)	79,200
	Adalimumab**	140	754 injections (29 pts)	105,560
	Ustekinumab***	2150	24 injections (4 pts)	51,600
	Day-case unit for infusion (only for IV drugs)	300	66	19,800
Hospitalisation	Inpatient stay	727	7	5089
Surgery including hospital stay		3900	8	31,200
GRAND TOTAL				266,635

^{*}Calculated for 12 months at 8 weekly infusions (presumed avg dose of 300 mg/dose).

clinicians to rationalise therapies.¹⁵ One of the ways this is done is by reviewing need for biologic therapy every 12 months and encouraging gastroenterologist-initiated discontinuation in patients who have achieved disease remission. No specific standards to define remission are recommended. In practice, this enables clinicians to suggest discontinuation of biologic based on clinical symptoms. In this study, we included only the first biologic used in a patient and therefore there was no experience of previous discontinuation. While this practice is encouraged keeping economic feasibility in mind, it is debatable whether the strategy does in fact pay dividends. Although expensive, it has been shown that among patients who respond to biologics, a significant proportion remain in sustained remission for up to 5 years, 34,35 with a reduction in need for surgery and hospitalisation,³⁶ and over years the direct expenditure on the health system reduces.³⁷ Despite the high perceived costs it could be argued that these drugs bring net benefits and should be continued without forced elective interruptions. The rates of relapse and resulting

need for high-intensity care in patients who have had their drugs discontinued probably offset the costs saved by gastroenterologist-initiated discontinuation. This is especially true given the changing landscape, with the introduction of biosimilar drugs driving down the cost of medications.

Apart from gastroenterologist-initiated discontinuation, there is a proportion of patients in whom treatment has to be discontinued for reasons that have been discussed before. In patients with primary non-response, secondary loss of response or drug intolerance, the treatment is usually switched to another approved agent. However, despite the best efforts of most teams managing patients with IBD, it is seldom possible to ensure that the switch is done in a timely manner. There could be multiple reasons that lead to a delay, for example, delays due to patient-related factors, delays in the system, lack of therapeutic options on offer and many more. Regardless of reasons for the delay, it could be argued that delays have the same detrimental effect as discontinuations, invariably leading to a

^{**}Calculated for 12 months at fortnightly injections (presumed avg of 40 mg/dose).

^{***}Calculated for 12 months at 8 weekly injections (avg dose of 90 mg; induction dose excluded).

higher rate of complications. Also, discontinuations for other reasons are generally unplanned events, as a result of which a switch to another agent can be delayed due to the healthcare set-up. This is far from ideal, but unfortunately a reality in practice.

Predictors of poor and favourable outcomes after discontinuation

The outcomes after discontinuation have been reported by other studies previously, most of which have been assessed in patients who have objective confirmation of remission prior to discontinuation. As per a systematic review by Torres *et al.*, the rates of relapse after discontinuation range from 20% to as high as 80%, particularly in some high-risk patients.³⁸

In our total cohort, a larger proportion of patients had patient-initiated discontinuation of therapy. The predictors of poor outcomes were Asian race, secondary loss of response (at any time point), and need for steroid therapy at 12 months or more after discontinuation, all of which reached statistical significance (Table 3). The category of poor outcomes due to secondary loss of response is perhaps not unexpected, and could represent refractory or aggressive disease. This highlights the group of patients who need closer monitoring and a more proactive management plan. This is also true of patients requiring steroid therapy, and such patients should be considered for a swift change to a different biologic or other interventions as appropriate.

The analysis also showed male sex and gastroenterologist-initiated discontinuation as predictors of good outcomes, reaching statistical significance. Although patients who have gastroenterologist-initiated discontinuation have been shown to have slightly better outcomes, ³⁹ male patients doing better after discontinuation has so far not been reported commonly. Male sex was strongly associated with absence of relapse (good prognostic factor) in our cohort both when analysed together for disease type (UC + CD) and separately for CD (as they constituted the majority). Though the numbers in our study are limited, this is an interesting finding and underlying reasons need to be explored further.

It is possible that gastroenterologist-initiated discontinuations do better mainly because the

patients are more likely to have achieved clinical remission and are also more likely to have biomarker assessments undertaken prior to withdrawal of therapy.

There have been reports on different aspects of discontinuation (including patients at risk of discontinuation itself), and several investigators have attempted to recognise predictors of outcomes. The STORI study stratified patients and identified those at low risk of relapse using predictive factors. 40 A recent study published in 2019 reported that female sex was associated with a higher risk of discontinuation of anti-TNF therapy in IBD due to higher rates of drug intolerance.⁴¹ In the same study, other factors such as greater age at start of anti-TNF therapy and dose escalation were found to be associated with discontinuation.⁴¹ Similar findings were reported by another study where a greater age of patient was associated with higher risk of discontinuation and treatment failure.42 Our cohort identified some new risk factors which predict poor outcomes after discontinuation of biologics which could guide decision making.

Gastroenterologist-initiated discontinuation of anti-TNF therapy

This group of gastroenterologist-initiated discontinuations was the focus of further analysis in our study to explore the true benefits of discontinuation to patients as well as the health economic consequences.

In our centre, patients were assessed for clinical remission based on symptoms and serum biomarkers prior to discontinuation of therapy. Mucosal assessment by way of endoscopy was not always undertaken and faecal calprotectin was available only after 2017, hence not used in this cohort. Among the gastroenterologist-initiated discontinuations in our cohort we made some interesting observations. Patients who continued to remain on thiopurine therapy after withdrawal of biologic had more adverse outcomes recorded during follow-up period (Figure 2). This is contrary to most reports which show thiopurines to have a protective effect, particularly in CD.³⁹

The cause for concern is the large number of patients who have adverse outcomes within a very short duration after discontinuation of therapy. About 40% of patients had at least one or more adverse outcome within 6 months of

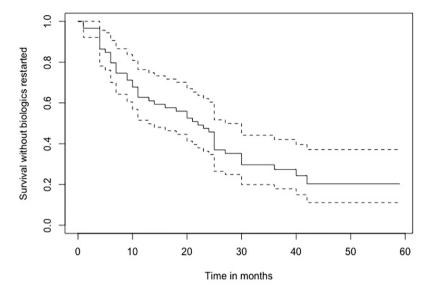


Figure 4. Survival without biologic restart among gastroenterologist-initiated discontinuations.

discontinuation and this number steadily increased with time, with nearly 90% of patients having at least one adverse outcome at the end of follow-up period (Figure 3). Also, a very high proportion of patients (71%) required restart of biologics during the follow-up period to manage adverse outcomes (Figure 4). The relapse rate in our cohort was much higher than reports in most studies, including a systematic review by Gisbert *et al.*⁴³

It is unclear whether these patients had relapsed due to underlying disease activity which was asymptomatic and not detected on serum biomarkers. It is now well established that patients who achieve mucosal healing are more likely to remain in remission for longer durations as well as have lower rates of hospitalisation and surgery;^{44–46} it is also recommended that treatment should be withdrawn only after objective confirmation of mucosal healing.¹⁶ The significantly high number of patients with adverse outcomes in this cohort emphasises the importance of objective confirmation of mucosal healing in order to reduce rates of relapse.

Cost of treatment withdrawal/discontinuation

The number of episodes where patients came in contact with the healthcare team following gastroenterologist-initiated discontinuation brings cost implications. A calculation of cumulative direct costs for all patients showed a high expenditure in managing these episodes. We used the Unit costs of health and social care document for our cost calculations.31 These episodes also increase time pressures on teams as they consume valuable resources (Table 6). The indirect costs due to patient morbidity are probably higher, but this was not explored as it was outside the scope of this study. A very high proportion of patients also needed to restart biologics to manage relapses. Any theoretical economic benefits gained by discontinuation of therapy are offset by costs incurred in managing the adverse outcomes. These episodes and resulting costs probably outweigh the theoretical benefits of discontinuation. This is especially more relevant considering the introduction of biosimilars which are available at much lower prices, as well as the significant reduction in the cost of the originator drugs due to discounted pricing. The annual cost of maintaining patients on these drugs is now significantly less. The lower cost has to be capitalised on in the form of maintaining therapies to maintain remission for as long as the drug remains effective. The guidelines by health agencies to review use of biologics annually were partially driven by the high cost. However, since the approval of biosimilar agents for both infliximab and adalimumab, the health services are projected to make large savings.⁴⁷ The end of patent and the introduction of biosimilars have resulted in pharmaceutical companies offering heavy discounts of up to 70% on originator drugs, resulting in further reduction of costs. 48 Biosimilars have been reported to be as safe and effective as originators.⁴⁹ Hence, there has been a drastic overall reduction in the annual cost per patient in managing diseases without any compromise in efficacy. This brings into question whether treatment withdrawal in patients who have achieved remission is a sound strategy. ECCO guidelines do not recommend treatment withdrawal in high-risk patients (perianal disease, penetrating disease), but given the lowering cost and comparable safety profile of anti-TNF monotherapy to thiopurines, this should probably be extended to most patients who have been successfully and safely maintained in remission.

Our study has several limitations. As this was a retrospective study, there were some missing data, particularly data such as smoking status and faecal calprotectin levels. Another limitation of our cohort, which probably reflects real-world practice at the time, is that even when biologics were discontinued electively, the decision was not

always after confirming endoscopic or histological remission. This was more often based on clinical remission as identified by the clinician together with blood and serum biomarkers. This approach is unlikely to have been a reliable representation of true disease activity, but pressure on endoscopy services made ready access often challenging. For the patient-initiated discontinuations, lab results were not consistently recorded at time of discontinuation. There are various reasons for this including that some were unplanned events and some had tests in primary care but results inaccessible to us. About 22% of patients faced significant delays in switching to alternate biologic therapies after primary non-response or secondary loss of response was identified, due to various reasons, and this delay probably had an effect on frequency of adverse outcomes. Therapeutic drug-level monitoring was not available for routine care at the time of the study.

To assess the economic aspects the calculations of cost were based on a pragmatic approach where we assumed that a particular episode of adverse outcome would generally trigger certain services in the health system. It is quite possible that the estimates could be an underestimate, as it was difficult to track how each episode was resolved. Another limitation is the challenge in assessing direct costs of progression of disease or its behaviour. When patients have penetrating or perianal complications multiple services are inevitably utilised, but it may not always be possible to capture this in retrospective studies.

Conclusion

The discontinuation of biologics for a variety of reasons is a common clinical scenario in realworld practice. In our cohort, among patients who discontinued biologics, nearly 54% had at least one adverse outcome within 6 months of discontinuation. Our results show that there were fewer adverse outcomes when discontinuation was elective, even when disease assessment prior to discontinuation was based on clinical symptoms and serum biomarkers alone. However, despite gastroenterologist-initiated (planned) discontinuation, a large proportion of patients had adverse outcomes rapidly and about 75% required restart of biologics. These adverse outcomes resulted in an increased number of episodes of contact with the healthcare team, thereby resulting in added expenditure in managing them.

Clinicians need to be cautious when considering biologic discontinuation (including gastroenter-ologist-initiated) given the high proportion of patients who relapse and need re-escalation to biologics. This should be discussed with patients when considering discontinuation of biologics. It can be argued that the direct costs of increased frequency of contacts with the healthcare system offset the economic gains made by drug with-drawal. This is especially true considering the reducing costs of drugs and increasing use of biosimilars. Clinicians and health agencies should take cognisance of the changing economic equations in making decisions and policies.

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Critchlow, T – data collection, data analysis, writing and editing manuscript, revision and approval

Smith, SCL – writing sections of the manuscript, revision and final approval

Nardone, OM – data input, analysis, revision and approval of manuscript

Love, M – management of patient database, patient data selection, revision and approval

Davis, J – management of patient database, revision and approval

Ghosh, S – plan of study, critical review of manuscript, editing, revision, overall supervision and final approval

Iacucci, M – revision, critical review of manuscript, final approval

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Supplemental material

Supplemental material for this article is available online.

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