- 1 Earlier initiation of community-based palliative care is associated with fewer unplanned
- 2 hospitalisations and emergency department presentations in the final months of life: a
- 3 population-based study amongst cancer decedents.
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- 17 Number of Figures: 3
- 18 Numbers of Tables: 2
- 19 Number of references: 42
- 20 Word count: 3,353

#### 22 Abstract

- 23 Context: While community-based palliative care (CPC) is associated with decreased acute care
- use in the lead up to death, it is unclear how the timing of CPC initiation affects this association.
- 25 Objectives: We aimed to explore the association between timing of CPC initiation and hospital
- use, over the final 1, 3, 6 and 12 months of life.
- 27 *Methods:* We conducted a retrospective, population-based study in Perth, Western Australia.
- 28 Linked administrative data including cancer registry, mortality, hospital admissions,
- 29 emergency department (ED) and CPC records were obtained for cancer decedents from 1
- 30 January 2001 to 31 December 2011. The exposure was month of CPC initiation; outcomes
- 31 were unplanned hospitalisations, emergency department (ED) presentations and associated
- 32 costs.
- 33 Results: Of 28,331 decedents residing in the CPC catchment area, 16,439 (58%) accessed CPC,
- mostly (64%) in the last three months of life. Initiation of CPC prior to the last six months of
- 35 life was associated with a lower mean rate of unplanned hospitalisations in the last six months
- of life (1.4 versus 1.7 for initiation within six months of death); associated costs were also
- 37 lower (\$(A2012) 12,976 versus \$13,959, comparing the same groups). However, those
- 38 initiating CPC earlier did show a trend towards longer time in hospital when admitted,
- 39 compared to those initiating in the final month of life.
- 40 Conclusions: When viewed at a population-level, these results argue against temporally
- restricting access to CPC, as earlier initiation may pay dividends in the final few months of life
- 42 in terms of fewer unplanned hospitalisations and ED presentations.
- 43 Key Words: Palliative care; Hospital costs; Community health Services; linked administrative
- 44 data

45 Running title: The timing of community-based palliative care initiation.

## Introduction

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The World Health Organization's definition of palliative care, <sup>1</sup> encourages its availability early in the illness course. A 2013 Cochrane review <sup>2</sup> assessing 23 studies found community-based palliative care (CPC) increased the likelihood of death at home, as opposed to in hospital, and reduced symptoms. <sup>4</sup>However, in some settings access to CPC is restricted by expected time until death. For example, expected time until death of three months or less is required in Queensland, Australia, <sup>3</sup> while many insurance plans in the United States, including Medicare, require an expected time to death of six months.<sup>4</sup> Given an expected increasing need to provide palliative care through alternative non-hospital settings, <sup>5, 6</sup> CPC may appeal to health planners. <sup>7</sup> This is partly because hospital care at the end-of-life also accounts for a disproportionate amount of health spending. 8-10 Cost analysis of the United States, Belgium, Canada, England, Germany, The Netherlands and Norway, shows between 33% and 50% of health-specific purchasing power parity adjusted hospital expenditure in the last six months of life is accounted for in the month prior to death. 11 Previous work has shown a similar scenario amongst cancer patients in Australia, 12, 13 where people are likely to spend time in hospital in the lead up to death, and are most likely to die in hospital. 14 This is despite a preference for dying at home, <sup>15-19</sup> and for receiving out-of-hospital palliative care. 8, 9, 20 10-12 Admission complexity means costs may exceed activity-based funding reimbursements to Australian hospitals. <sup>21, 22</sup> <sup>15</sup> <sup>7,89</sup>In Perth, Western Australia (WA), CPC is provided by a single non-Government provider free of charge at the point of care. This is an uncapped, home-based, multidisciplinary service available to those with a progressive, life-limiting illness requiring symptom management following medical practitioner referral. In a recent study using data from this service. <sup>22</sup> we found that the use of CPC, relative to no CPC, was associated with an increased odds of cancer decedents dying out of hospital (adjusted odds ratio of 3) and decreased unplanned

hospitalisation (adjusted hazard ratio of 0.94 in the last year of life). Unlike WA, in other health settings a limit is placed on CPC initiation based on expected time to death, to reduce service costs. Considering evidence from other health systems, studies from Canada have found that the initiation of home-base palliative care (CPC) greater than six months prior to death reduced the risk of needing acute care in the last fortnight of life, in a dose-dependent manner, <sup>23</sup> and that end-of-life nursing reduced emergency department (ED) presentations in the subsequent week over the final six months of life. <sup>24</sup>

lead up to death, an important policy question that has not been adequately explored to date is: what is the added benefit in terms of unplanned hospitalisations and ED presentations, if any, from initiating CPC (i.e. home-based ) very much before this time? This is worth exploring, since the cost-effectiveness of CPC, from a health system perspective, is driven by offsetting costs elsewhere is the health system. To date, the majority of research on the impact of specialist palliative care has focused on hospital and hospice-based services. The aims of this study were therefore to: 1) examine the association between timing of initiation of CPC and unplanned hospital use, ED presentations and associated costs, and; 2) assess how this association is affected by the 'end-of-life' period over which these outcomes are measured.

### Methods

The reporting of this population-based retrospective study was based on items in the REporting of studies Conducted using Observational Routinely-collected health Data (RECORD) statement (see Appendix 1). <sup>25</sup> The study was approved by the WA Department of Health Human Research Ethics Committee (2013/40), which exempted the study from requiring individual patient consent.

# 95 <u>Data sources and linkage</u> 96 Person-level linked data 97 December 2011 were extended

Person-level linked data for WA cancer decedents who died between 1 January 2001 and 31

December 2011 were extracted from the WA Cancer Registry, WA Mortality System, WA

Hospital Morbidity Data Collection (HMDC), WA ED Data Collection and CPC records linked

and extracted via the WA Data Linkage System. <sup>26</sup>

# Description of participants

Only those living within the CPC catchment area in Perth and dying after one month of age

were included.

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## Outcomes, exposure and covariates

104 <u>Unplanned hospital admissions, ED presentations, length of stay and associated costs</u>

105 (outcomes)

Time prior to death was categorised to several look-back periods: 1, 3, 6 and 12 month(s) prior

to the date of death. Hospitalisations were allocated to look-back periods based on the

admission date for unplanned hospitalisation or presentation date for ED presentations. The

admission status variable in the HMDC data was used to determine if hospitalisations were

planned or unplanned. In this study hospitalisations coded as 'emergency' were classified as

111 unplanned. <sup>27</sup>

Episodes of hospitalisation were constructed taking into account inter-hospital transfers to

avoid double counting. Transfer adjusted lengths of stay in days <sup>28</sup>, for each inpatient

hospitalisation were used to calculate: (i) the total number of bed days spent in hospital due to

initiation of unplanned admissions to hospital during each look-back, and; (ii) the average

length of stay (ALOS) of unplanned admissions to hospital initiated in each look-back period.

Deceased on arrival or purely administrative ED presentations (e.g. 'placeholders' for transfers,

not presenting) were excluded.

The cost of each episode of care was assigned based on average cost of the Australian Refined Diagnosis Related Group (AR-DRG) code recorded using the National Hospital Cost Data Collections for WA specific to the date of separation of each hospital record. <sup>29, 30</sup> ED presentations were costed using the Urgency Related Group values. <sup>30</sup> These reflect the costs paid to hospitals for admissions by the State Government. All costs were adjusted to 2012 prices, using relevant health price indices <sup>31</sup>. In addition, an expected cumulative length of stay (LOS) was calculated (defined as the average length of stay recorded for the AR-DRG in the relevant national cost data collection table). <sup>30</sup>

# Community-based palliative care service (exposure)

CPC service data were used to identify which members of the cohort had accessed CPC (defined as having at least one in-home visit), the date of first access and the number of visits. For those who had "ever" used the service, the timing of first-time service utilisation was categorised in months prior to death ranging from less than one months prior to death, ascending to 12 months or earlier.

The exposure was also dichotomised as initiation before or after each look back period (e.g. within the final three months of life, versus prior to this for the three month look back). In summary, CPC provided by Silver Chain in Perth comprises a multi-disciplinary team providing palliative care services to patients at their 'usual place of residence', which may differ with time. The team is usually comprised of doctors with palliative care training, nurses and other allied health and people to provide non-health-related support (e.g. chaplains). The frequency of visits is based on clinical need and is uncapped.<sup>32</sup>

## Socio-demographic data and cancer history (covariates)

Sex, age, marital status, postcode-based residential location and type of cancer causing death were extracted from the WA Mortality system. Postcode-based Socio-economic Index for

Areas (SEIFA) index of relative social disadvantage <sup>33</sup>, CPC service catchment area (north, south, east), country of birth, whether more than one cancer was diagnosed, the length of time living with cancer and whether cancer was the cause of death were ascertained using the Cancer Registry. Indigenous status was determined via the WA Data Linkage Branch. <sup>34</sup> Comorbidity was ascertained using the Multipurpose Australian Comorbidity Scoring System (MACSS) <sup>35</sup> in the last 12 months of life using all principal and co-diagnosis codes on the HMDC, with the exclusion of cancer.

## Statistical analysis

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The relationship between first-time use of the CPC (in months prior to death, and for initiation before or after the look back period) and the rate of unplanned hospitalisation and ED presentation was evaluated using multivariate negative binomial regression, due to the over dispersed nature of the data. Multivariable exponential Cragg-hurdle models with a lower limit of zero and no upper limit were used for bed days, ALOS and costs. Hurdle model combine two models: (i) a selection model that determines if an individual has an outcome of interest, and; (ii) an outcome model that determines the positive amount of that outcome (i.e. bed days, ALOS or cost). The covariates for the selection model were determined using binary logistic regression with unplanned hospitalisation as the dependent variable. The covariates deemed as significant (p<0.05) were used in the hurdle selection model. The Cragg-hurdle outcome model and the negative binomial regression model used the full set of potential covariates as follows: sex, year of death, age at death (<50 years, 50 - 74 years, 75 + years), born in Australia/New Zealand or elsewhere, Indigenous status, partnered at death, multiple cancer diagnoses, time between cancer diagnosis and death (in days), socio-economic status, CPC catchment area, comorbidity recorded on hospitalisations in previous 12 months (yes/no), cancer type causing death and the number of CPC home visits in the last 12 months of life. The inclusion of covariates was determined based on the effect they had on the model, and reflected those in the

administrative data likely to have different distributions for those accessing CPC early and late. The average effect of initiation time was obtained by post estimation of the marginal effects. For the number of unplanned hospitalisations and ED presentations, the marginal estimates were reported as rates per person-time for the relevant lookback period (i.e. only whilst out of hospital were patients considered 'at risk'). For total bed days, ALOS and cost, means at the person-level for each look back period were reported. The mean difference (coefficient) between actual and expected LOS (based on AR-DRG grouping) per person, between initiation before or after the lookback period was estimated using linear regression, adjusted for the above covariates.

Those not receiving CPC or with no CPC initiation date were excluded from the analyses, though we did perform a sub-analysis of the negative binomial and Cragg-hurdle modelling for months prior to death, with 'no CPC use' as the reference. Stata SE (Version 14, College Station, Texas) was used to conduct the analyses.

#### Results

During the study period, 39,247 people died from cancer in WA. Of those, 28,331 (72%) resided in the CPC catchment area at the time of death and had a recorded initiation date. The majority (58%, 16,439) accessed CPC at some time prior to death; differences in characteristics between those accessing and not accessing CPC have been discussed elsewhere. <sup>22</sup> For those who did access CPC, the majority (64%) initiated the service in the last three months of life (Table 1). Only 1,534 (9%) of those using CPC accessed the service earlier than nine months prior to death.

Assessing the last 12 months of life, there was not a clear association between the mean rate of unplanned hospitalisations per person-time at risk and the month of initiation prior to death (range 2.1 to 2.8 – Figure 1 a), Appendix 1), or of ED presentations (Figure 1 b), Appendix 2).

For the last 6 months of life, earlier initiation (before 6 months prior to death) of CPC was associated with a lower rate of unplanned hospitalisations and ED presentations; with a similar trend for the last three months of life. Table 2 shows the CPC initiation dichotomised to initiation within or before the look back period. Over each look back period, the mean rate of unplanned hospitalisation and ED presentation was less with earlier initiation.

Over the last year of life, patients who initiated earlier than in the final month of life spent more time in hospital for unplanned admissions ( $\sim 20-27$  days, Figure 2 a), Appendix 2). Earlier initiation did not seem associated with a lower ALOS (Figure 2 b), Appendix 2). Considering the number of unplanned hospitalisations and mean number of days in hospital for unplanned admissions/ALOS together (Figures 1 and 2), in the last six months of life, there was a lower number of hospitalisations for patients initiating >6 months prior to death, but relatively similar time spent in hospital (Table 2). Table 2 also shows that the mean 'unexpected days' spent in hospital per-person were greater for earlier initiation of CPC.

Figure 3 shows the estimated unplanned hospitalisation (a)) and ED presentations costs (b)). While earlier initiation seems in some cases associated with higher costs, Table 2 shows that broadly for early versus late initiation, there is a trend toward lower associated costs with earlier initiation of CPC.

Appendix 2 contains the marginal estimates used to construct Figures 1 to 3. We also ran the models including patients not initiating CPC and found the trends observed in the main analysis remained.

#### Discussion

The results of this study suggest an association between earlier initiation of CPC and fewer unplanned hospitalisations and ED presentations and associated costs in the final six months of life, with lower apparent reductions in the final 12 months of life. However, for those patients

initiating CPC earlier, there was an association with greater LOS, in terms of cumulative, average and mean days in excess of that expected based on AR-DRG-related reimbursements to hospitals over the relevant lookback period. The marginal estimates for unplanned hospital admissions occurring in the last six months of life (Appendix 2) were between 1.2 and 1.9 admissions for the six month period per persontime at risk (time up to six months, as persons were only considered 'at risk' of hospitalisation when not admitted to hospital). Authors of a recent Australian study reported 3.1 hospitalisations per-person in the last six months of life <sup>12</sup>. The discrepancy is likely due to the different study population and that our analysis considered only unplanned hospitalisations. The reason for including only unplanned hospitalisations, was that only admissions to specialist hospital-based palliative care services are coded as "palliative". Thus, to reduce the risk of including admissions with curative intent, we restricted the analysis to only unplanned hospitalisations. Twenty-five to 34% of estimated unplanned hospitalisation costs in the last six months of life in our study, occurred in the final month of life. The corresponding proportion was 40% in the study by Langton and colleagues <sup>12</sup>. Previous work by Moorin and Holman <sup>36</sup> showed a trend toward more expensive hospital admissions in the final month of life, particularly for patients aged under 85 years. <sup>36</sup> However, the marked peak in hospitalisation costs during the final month of life shown recently by Reeve and colleagues, 13 was not apparent in our study. The costing in our study was based on reimbursement to hospitals, which may under-estimate the actual cost to hospitals, and in part explain the different costing patterns observed. However, the DRG-related costs reflect those incurred by the State Government for hospital admissions. Previous research has demonstrated a peak in the use of hospital services immediately prior to the transition to palliative care. <sup>37</sup> This may partly explain the increase in hospitalisation in the

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final 12 months for those initiating CPC at or around 12 months prior to death. The timing of CPC initiation/non-initiation in relation to time living with cancer (less time with cancer associated with less CPC) may also reflect that less aggressive cancer types/stages facilitate better planning of CPC. More aggressive cancer or cancer diagnosed later may lend itself more to hospital management in the lead up to death. While there is no staging information in the linked administrative data, in addition to type of cancer we adjusted for the number of CPC visits (i.e. intensity of CPC following initiation), presence of multiple cancer types, and the length of time between cancer diagnosis and death. The use of person-level whole of population linked data reduces issues of recall bias, the single CPC provider in Perth reduces the risk of 'contamination' from other services and the risk of selection bias being reflected in the results is reduced by adjustment for several relevant covariates with potential to differ based on timing of CPC initiation. Though the study period extends to 2011, there have been no local policy changes to CPC access in the areas under study in the intervening period that would limit generalisability to the current day. Our study has several limitations. The assignment of some covariates at death does introduce the risk of changes from the beginning of each look back period. However any changes to modifiable covariates (such as a partnered person marrying in the lead up to death), are unlikely to affect interpretation. Inclusion of only metropolitan cancer decedents limits generalisability to patients palliated for non-cancer reasons, or living in a non-metropolitan area. The effect of potential survival non-equivalence between those accessing CPC at different times – an issue of contention in the literature <sup>38</sup> – increases with increasing time counting backwards from death. Thus, we have not examined the impact of CPC initiation before 12 months prior to date of death. The study of cancer decedents does introduce the risk of studying people prior to a diagnosis of cancer, particularly for aggressive cancer types and for the last 12 months of life, though we adjusted for length of time since cancer diagnosis for all analyses. This can affect

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interpretation compared to prospective study forward from a date of diagnosis. <sup>39</sup> Our decision to consider four look back periods, consistent with the approach in a previous study using these data, <sup>22</sup> aimed to assess the robustness of different timing of initiation of unplanned hospitalisation and ED presentation. The adjustment covariates in the model were determined by those likely to be different between people initiating CPC at different times. While there may still be differences, this adjustment makes the comparison as robust as possible given the data available, and the analyses reflect observed trends amongst a large population of 16,439 cancer decedents.

Our approach uses readily available data, similar to that available to health policy makers, and yields useful insights into patterns of CPC and unplanned hospital use. A previous study, also conducted in Perth <sup>40</sup> evaluated the effect of early (between 91 and 365 days before death) versus no or late admission (i.e. no admission or within 90 days of death). These authors found a reduced number of ED presentations in the 3 months before death. <sup>40</sup> However, evaluating timing of access in terms of early versus non/late access as undertaken in these authors' study does not allow the effect of early versus late access to be differentiated, as those using CPC have been found to have differing characteristics to those who do not. <sup>22</sup> Analyses from Canada have found that the initiation of home-base palliative care (CPC) greater than six months prior to death reduced the risk of needing acute care in the last fortnight of life, in a dose-dependent manner, <sup>23</sup> and that end-of-life nursing reduced emergency department (ED) presentations in the subsequent week over the final six months of life. <sup>24</sup> These results are consistent with these findings. Our study adds to these findings by analysing data from a different health system, and by assessing timing of initiation by month of initiation prior to death and with different lookback periods.

The important implications of this study are for health systems where CPC initiation is restricted to a certain time prior to death, as is the case for the United States' Medicare

program.<sup>4</sup> While it is simplistic to consider hospitalisation at the end of life a 'problem', <sup>41</sup> there is a strong body of evidence indicating the hospital use at the end of life is resource intensive, <sup>11</sup> and as populations age strategic planning of palliative care will be important to ensure quality and sustainability.

In conclusion, earlier CPC initiation (with more than six months to live) was associated with fewer unplanned hospitalisations in the last six months of life. Though we cannot suggest causation, these findings support a hypothesis that initiation of CPC at >6 months prior to death can reduce the number of unplanned hospitalisations at a population-level in the six months before death. Other considerations, such as patient preference are important, <sup>42</sup> but will require alternate study designs.

301 Authors' contributions: RM and DY conceived the study; RM and CW conducted the 302 analyses and modelled the data; RM, DY and CW interpreted the data analysis; RM wrote the 303 draft manuscript; CW revised the paper; RM, DY and CW critically appraised the manuscript for important intellectual content. 304 305 Disclosures 306 Associate Professor Rachael Moorin was employed as Principal Investigator at the Silver Chain 307 Group which delivers the community based palliative care service evaluated in this study at the 308 time the study was conducted. 309 Acknowledgements 310 The authors wish to thank Mr David Lamour Director of the Hospice Care Service at Silver 311 Chain and Mr Mark Cockayne, General Manager, Health, Silver Chain Group for their support 312 during this project. The authors wish to thank the staff at the Western Australian Data Linkage 313 Branch, and the data custodians of the WA Cancer Registry, WA Mortality System, WA 314 Hospital Morbidity Data System, and WA Emergency Department Data Collection. 315 **Funding** 316 This research received no specific grant from any funding agency in the public, commercial, 317 or not-for-profit sectors. 318

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Table 1. Characteristics of decedents according to broad timing of first-time use of the community palliative care service.

		Initiatio	n of comm	unity base	ed palliativ	e care in l	ast year of	life						
Characteristic		<b>Up to 1 month</b> 9 (4 – 17)		> 1 to 3 months > 21 (12 – 36)		> 3-6 m	onths	> 6-9 m	onths	> 9 to 12 months		At 12 rearlier	months or	
Median number of visits (IQR)						37 (22- 64)		53 (31 -89)		60 (35 – 107)		67 (38 – 118)		
		n	Percenta	n	Percenta	n	Percenta	n	Percenta	n	Percenta	n	Percenta	p-value <sup>b</sup>
Sex	Male	2,933	59.4	3,167	57.4	1,714	55.7	686	50.2	259	48.6	481	48.1	< 0.0001
Age at Death	Under 50 years	407	8.2	441	8.0	268	8.7	116	8.5	29	5.4	85	8.5	< 0.465
	50-74 years	2,470	50.0	2,816	51.0	1,550	50.3	710	52.0	285	53.5	509	50.8	
	75+ years	2,061	41.7	2,265	41.0	1,261	41.0	540	39.5	219	41.1	407	40.7	
Marital status at death	Partner recorded	3,126	63.3	3,292	59.6	1,834	59.6	794	58.1	309	58.0	539	53.8	< 0.0001
Socio-economic status	Highest disadvantage	790	16.0	837	15.2	475	15.4	229	16.8	83	15.6	156	15.6	0.926
(at death)	High disadvantage	932	18.9	1,038	18.8	556	18.1	265	19.4	95	17.8	199	19.9	
	Moderate disadvantage	986	20.0	1,088	19.7	621	20.2	264	19.3	118	22.1	188	18.8	
	Less disadvantage	877	17.8	1,030	18.7	573	18.6	237	17.3	105	19.7	175	17.5	
	Least disadvantage	1,353	27.4	1,529	27.7	854	27.7	371	27.2	132	24.8	283	28.3	
Time living with cancer responsible for death	Less than 1 year	2,781	56.3	2,773	50.2	1,319	42.8	517	37.8	165	31.0	47	4.7	<0.0001
	1-5 years	1,541	31.2	2,003	36.3	1,302	42.3	603	44.1	263	49.3	689	68.8	
	More than 5 years	616	12.5	746	13.5	458	14.9	246	18.0	105	19.7	265	26.5	
Multiple cancers diagnosed	Yes	1,123	22.7	1,197	21.7	634	20.6	302	22.1	111	20.8	198	19.8	<0.0001
Type of cancer <sup>c</sup>	Female Breast	358	7.2	364	6.6	192	6.2	119	8.7	60	11.3	146	14.6	<0.0001
	Prostate	202	4.1	284	5.1	221	7.2	120	8.8	35	6.6	104	10.4	< 0.0001
	Colorectal	588	11.9	707	12.8	412	13.4	172	12.6	76	14.3	123	12.3	0.364
	Lung, bronchus and Trachea	1,043	21.1	1,293	23.4	711	23.1	317	23.2	117	22.0	169	16.9	<0.0001
	Melanoma	231	4.7	284	5.1	129	4.2	38	2.8	14	2.6	15	1.5	< 0.0001
Total in exposure group <sup>d</sup>		4,938	30.0	5,522	33.6	3,079	18.7	1,366	8.3	533	3.2	1,001	6.1	

n = Number of decedents, IQR = interquartile range

a) Percent is percentage of total decedents in the exposure category having the characteristic specified. Totals may not add to 100 due to rounding.

b) Chi-squared test, comparing percentage in each category for each time period.

c) Selected cancer types shown in this table. Thus, total percentage does not add to 100. P-values compared proportion with to without that cancer type, by time period.

d) Percent is calculated as the percentage of the entire cohort (i.e. used the service at some time in the last 12 months, N = 16,439, 58% of total 28,331 decedents in cohort). Totals may not add to 100 due to rounding.

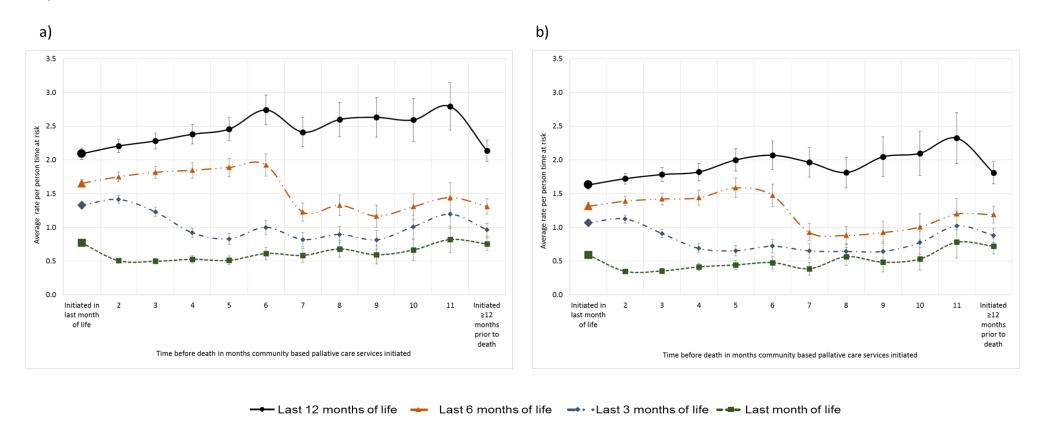
Table 2. Acute care rate and associated cost for cancer decedents enrolled with community-based palliative care (CPC) at some prior to death, by initiation of CPC before or after the lookback period. a

	Mean rate of unplanned hospitalisations per person-time at risk (95% CI) <sup>b</sup>	Mean rate of emergency department presentations per person-time at risk (95% CI) <sup>b</sup>	Mean cumulative length of stay in days, per person (95% CI) <sup>b</sup>	Average length of stay in days, per person (95% CI) <sup>b</sup>	Mean difference in actual versus expected length of stay in days (95% CI) <sup>b, c</sup> , per person	Mean cost of unplanned hospitalisations in 2012 Australian dollars, per person (95% CI) <sup>a</sup>	Mean cost of emergency department presentations in 2012 Australian dollars, per person (95% CI) <sup>b</sup>
1. Last month of life Initiation within last month	0.8 (0.8 – 0.8)	0.6 (0.6 – 0.7)	3.5 (3.3 – 3.7)	3.0 (2.8 – 3.1)	Ref	3,851 (3,703 – 3,998)	216 (208 – 224)
Initiation prior to last month	0.5(0.5-0.6)	0.4(0.4-0.4)	3.6 (3.4 – 3.7)	3.2 (3.1 – 3.4)	1.30 (1.1 – 1.5)	3,834 (3,706 – 3,963)	208 (201 – 214)
2. Last 3 months of life							
Initiation within last 3 months	1.4 (1.3 – 1.4)	1.1 (1.0 – 1.1)	10.3 (10.0 – 10.7)	6.6 (6.4 – 6.8)	Ref	9,311 (9,055 – 9,567)	511 (498 – 524)
Initiation at or prior to last 3 months	1.0 (1.0 – 1.0)	0.8 (0.7 – 0.8)	10.7 (10.3 – 11.1)	7.3 (7.1 – 7.6)	3.4 (2.9 – 3.9)	9,026 (8,753 – 9,299)	467 (453 – 480)
3. Last 6 months of life							
Initiation within last 6 months	1.7 (1.7 – 1.8)	1.4 (1.4 – 1.4)	16.1 (15.6 – 16.5)	8.3 (8.1 – 8.5)	Ref	13,959 (13,641 – 14,277)	761 (745 – 778)
Initiation at or prior to last 6 months	1.4 (1.3 – 1.5)	1.1 (1.0 – 1.2)	15.7 (14.9 – 16.5)	8.8 (8.5 – 9.2)	4.4 (3.5 – 5.2)	12,976 (12,433 – 13,519)	708 (681 – 734)
4. Last 12 months of life							
Initiation within last 12 months	2.3 (2.2 – 2.4)	1.8 (1.7 – 1.8)	21.2 (20.7 – 21.7)	8.9 (8.7 – 9.1)	Ref	18,642 (18,250 – 19,034)	1,040 (1,019 – 1,060)
Initiation at or prior to last 12 months	2.0 (1.9 – 2.2)	1.7 (1.6 – 1.9)	20.3 (18.7 – 22.0)	9.1 (8.6 – 9.7)	6.8 (5.1 – 8.5)	17,236 (16,037 – 18,436)	1,001 (939 – 1,062)

CI = confidence interval

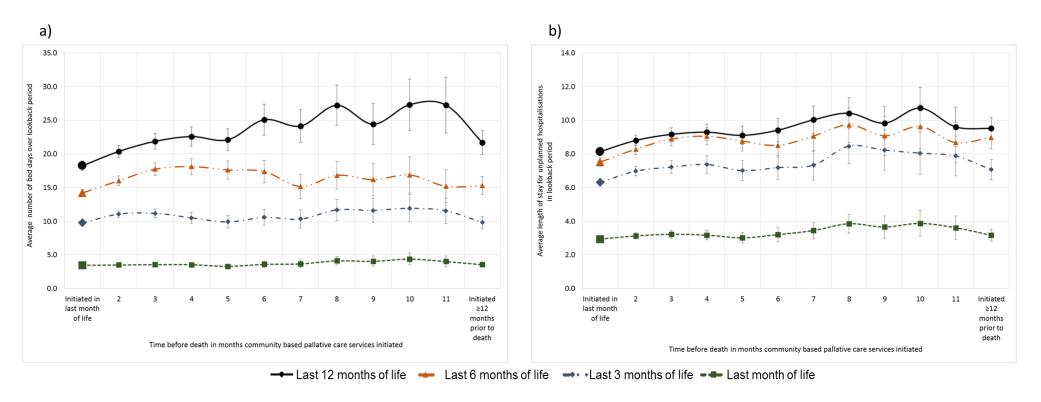
- a) For each look back period (1 4, highlighted in grey) initiation prior to the lookback (i.e. for 1. Initiation before the final month of life) is compared to initiation after the lookback (i.e. for 1. Initiation within the final month of life).
- b) Adjusted for, sex, year of death, age at death (<50 years, 50 74 years, 75+ years), born in Australia or New Zealand (yes/no), Indigenous (yes/no), partner at death (yes/no), multiple cancer diagnoses (yes/no), time between cancer diagnosis and death (in days), socio-economic status, CPC service centre (north, east or south), comorbidity recorded on hospitalisations in previous 12 months (yes/no), cancer type causing death (dummy variables for Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas versus 'other' not entered into model), and the number of CPC home visits in the last 12 months of life.
- c) Coefficients represent the difference in actual versus expected stay in hospital based on diagnostic reference groupings, a positive coefficient indicates a greater positive difference (i.e. more unexpected days in hospital), with data modelled using linear regression adjusted for the covariates in b, only for patients admitted to hospital during the last 12 months of life.

Figure 1. Time of initiation of community based palliative care services by the mean rate per person-time at risk of a) unplanned hospitalisations, and; b) emergency department presentations in the last year of life.



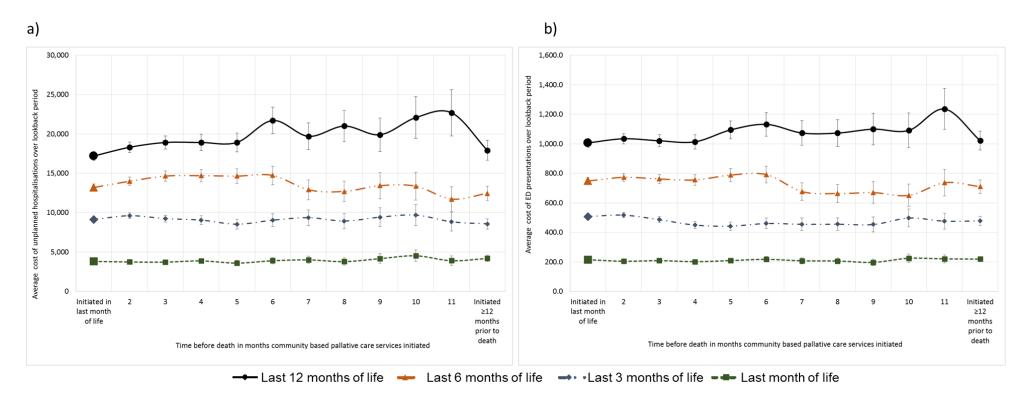
Adjusted for, sex, year of death, age at death (<50 years, 50 – 74 years, 75+ years), born in Australia or New Zealand (yes/no), Indigenous (yes/no), partner at death (yes/no), multiple cancer diagnoses (yes/no), time between cancer diagnosis and death (in days), socio-economic status, CPC service centre (north, east or south), comorbidity recorded on hospitalisations in previous 12 months (yes/no), cancer type causing death (dummy variables for Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas versus 'other' not entered into model), and the number of CPC home visits in the last 12 months of life.

Figure 2. Time of initiation of community based palliative care services by: a) mean per-person total number of days spent in hospital, and; b) per-person average length of stay (in days) for unplanned admissions in the last year of life (note different scales).



Adjusted for, sex, year of death, age at death (<50 years, 50 – 74 years, 75+ years), born in Australia or New Zealand (yes/no), Indigenous (yes/no), partner at death (yes/no), multiple cancer diagnoses (yes/no), time between cancer diagnosis and death (in days), socio-economic status, CPC service centre (north, east or south), comorbidity recorded on hospitalisations in previous 12 months (yes/no), cancer type causing death (dummy variables for Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas versus 'other' not entered into model), and the number of CPC home visits in the last 12 months of life.

Figure 3. Time of initiation of community based palliative care services by the mean per-person cost (A\$2012) of: a) unplanned hospitalisations, and; b) emergency department presentations (note different scales).



Adjusted for, sex, year of death, age at death (<50 years, 50 – 74 years, 75+ years), born in Australia or New Zealand (yes/no), Indigenous (yes/no), partner at death (yes/no), multiple cancer diagnoses (yes/no), time between cancer diagnosis and death (in days), socio-economic status, CPC service centre (north, east or south), comorbidity recorded on hospitalisations in previous 12 months (yes/no), cancer type causing death (dummy variables for Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas versus 'other' not entered into model), and the number of CPC home visits in the last 12 months of life.

Appendix 1. The RECORD statement – checklist of items, extended from the STROBE statement, that should be reported in observational studies using routinely collected health data.

	Item	STROBE items	Location in	RECORD items	Location in
	No.		manuscript where		manuscript where
			items are reported		items are reported
Title and abstract					
	1	(a) Indicate the study's design with a	Described in title and	RECORD 1.1: The type of data used should	1.1 Title and in
		commonly used term in the title or	abstract.	be specified in the title or abstract. When	abstract/
		the abstract (b) Provide in the		possible, the name of the databases used	
		abstract an informative and balanced		should be included.	1.2 Title and
		summary of what was done and what			abstract.
		was found		RECORD 1.2: If applicable, the geographic	
				region and timeframe within which the	1.3 Abstract.
				study took place should be reported in the	
				title or abstract.	

				RECORD 1.3: If linkage between databases was conducted for the study, this should be clearly stated in the title or abstract.	
Introduction					
Background	2	Explain the scientific background	Introduction.		
rationale		and rationale for the investigation			
		being reported			
Objectives	3	State specific objectives, including	End of introduction.		
		any prespecified hypotheses			
Methods					
Study Design	4	Present key elements of study design	Methods section.		
		early in the paper			
Setting	5	Describe the setting, locations, and	Methods section.		
		relevant dates, including periods of			
		recruitment, exposure, follow-up,			
		and data collection			

Participants	6	(a) Cohort study - Give the eligibility	Retrospective study	RECORD 6.1: The methods of study	6.1 Data linkage
		criteria, and the sources and methods	with outcome of	population selection (such as codes or	used described in
		of selection of participants. Describe	unplanned hospital/ED	algorithms used to identify subjects) should	'data sources and
		methods of follow-up	use and associated cost,	be listed in detail. If this is not possible, an	linkage' section of
		Case-control study - Give the	with exposure of	explanation should be provided.	method.
		eligibility criteria, and the sources	month of CPC		
		and methods of case ascertainment	initiation prior to death.	RECORD 6.2: Any validation studies of the	6.2 Appropriate
		and control selection. Give the	Cohort defined at death	codes or algorithms used to select the	references cited in
		rationale for the choice of cases and	(i.e. a study of	population should be referenced. If	the methods section.
		controls	decedents).	validation was conducted for this study and	
		Cross-sectional study - Give the		not published elsewhere, detailed methods	6.3. Data linkage
		eligibility criteria, and the sources		and results should be provided.	used described in
		and methods of selection of			'data sources and
		participants		RECORD 6.3: If the study involved linkage	linkage' section of
				of databases, consider use of a flow diagram	method.
				or other graphical display to demonstrate	
				the data linkage process, including the	

		(b) Cohort study - For matched		number of individuals with linked data at	
		studies, give matching criteria and		each stage.	
		number of exposed and unexposed			
		Case-control study - For matched			
		studies, give matching criteria and			
		the number of controls per case			
Variables	7	Clearly define all outcomes,	Defined in methods	RECORD 7.1: A complete list of codes and	Defined in methods
		exposures, predictors, potential	section.	algorithms used to classify exposures,	section and again, in
		confounders, and effect modifiers.		outcomes, confounders, and effect	detail, below
		Give diagnostic criteria, if		modifiers should be provided. If these	Figures 1, 2 and 3.
		applicable.		cannot be reported, an explanation should	
				be provided.	
Data sources/	8	For each variable of interest, give	Described in the		
measurement		sources of data and details of	methods section.		
		methods of assessment			
		(measurement).			

		Describe comparability of		
		assessment methods if there is more		
		than one group		
Bias	9	Describe any efforts to address	Adjustment described	
		potential sources of bias	in the 'statistical	
			analysis' part of the	
			methods.	
Study size	10	Explain how the study size was	Population-based	
		arrived at	study, so all eligible	
			records included	
			(>16,000 patients).	
Quantitative	11	Explain how quantitative variables	Described in the	
variables		were handled in the analyses. If	'statistical analysis'	
		applicable, describe which	part of the methods.	
		groupings were chosen, and why		

Statistical methods	12	(a) Describe all statistical methods,	Described	in the	
		including those used to control for	'statistical	analysis'	
		confounding	part of the me	ethods.	
		(b) Describe any methods used to			
		examine subgroups and interactions			
		(c) Explain how missing data were			
		addressed			
		(d) Cohort study - If applicable,			
		explain how loss to follow-up was			
		addressed			
		Case-control study - If applicable,			
		explain how matching of cases and			
		controls was addressed			
		Cross-sectional study - If applicable,			
		describe analytical methods taking			
		account of sampling strategy			
		(e) Describe any sensitivity analyses			

Data access and		RECORD 12.1: Authors should describe	12.1 Data linkage
cleaning methods		the extent to which the investigators had	used described in
		access to the database population used to	'data sources and
		create the study population.	linkage' section of
			method.
		RECORD 12.2: Authors should provide	
		information on the data cleaning methods	12.2 Described in
		used in the study.	the methods section,
			when defining
			people to be
			included in the
			analysis.
Linkage		RECORD 12.3: State whether the study	12.3 Linkage
		included person-level, institutional-level, or	described in the
		other data linkage across two or more	'data sources and
		databases. The methods of linkage and	linkage section',

				methods of linkage quality evaluation	person-level data
				should be provided.	used.
Results					
Participants	13	(a) Report the numbers of	Described in the first	RECORD 13.1: Describe in detail the	13.1 Described in
		individuals at each stage of the study	part of the results	selection of the persons included in the	the first part of the
		(e.g., numbers potentially eligible,	section, with further	study (i.e., study population selection)	results section, with
		examined for eligibility, confirmed	detail in a previous	including filtering based on data quality,	further detail in a
		eligible, included in the study,	study referenced.	data availability and linkage. The selection	previous study
		completing follow-up, and analysed)		of included persons can be described in the	referenced.
		(b) Give reasons for non-		text and/or by means of the study flow	
		participation at each stage.		diagram.	
		(c) Consider use of a flow diagram			
Descriptive data	14	(a) Give characteristics of study	Described in the first		
		participants (e.g., demographic,	part of the results		
		clinical, social) and information on	section, with further		
		exposures and potential confounders	detail in a previous		
			study referenced.		

		(b) Indicate the number of participants with missing data for each variable of interest (c) Cohort study - summarise follow-		
		up time (e.g., average and total amount)		
Outcome data	15	Cohort study - Report numbers of outcome events or summary measures over time  Case-control study - Report numbers in each exposure category, or summary measures of exposure  Cross-sectional study - Report numbers of outcome events or	section, Figures 1- 3, Tables 1 - 3, Appendix	
Main results	16	summary measures  (a) Give unadjusted estimates and, if	Described in the results section, Figures 1- 3,	

		estimates and their precision (e.g.,	Tables 1 – 3, Appendix				
		95% confidence interval). Make	2 and 3.				
		clear which confounders were					
		adjusted for and why they were					
		included					
		(b) Report category boundaries when					
		continuous variables were					
		categorized					
		(c) If relevant, consider translating					
		estimates of relative risk into					
		absolute risk for a meaningful time					
		period					
Other analyses	17	Report other analyses done—e.g.,	Described in the last				
		analyses of subgroups and	sentence of the results				
		interactions, and sensitivity analyses	section.				
Discussion							

Key results	18	Summarise key results with	Discussed in the first		
		reference to study objectives	paragraph of the		
			discussion.		
Limitations	19	Discuss limitations of the study,	Study limitations have	RECORD 19.1: Discuss the implications of	19.1. Discussed in
		taking into account sources of	been described in the	using data that were not created or collected	strengths and
		potential bias or imprecision.	discussion section.	to answer the specific research question(s).	limitations section
		Discuss both direction and		Include discussion of misclassification bias,	that single service
		magnitude of any potential bias		unmeasured confounding, missing data, and	provider reduces
				changing eligibility over time, as they	bias; some
				pertain to the study being reported.	limitations also
					described in this
					section.
Interpretation	20	Give a cautious overall interpretation	Conclusions drawn in		
		of results considering objectives,	discussion, taking into		
		limitations, multiplicity of analyses,	account study		
		results from similar studies, and	limitations.		
		other relevant evidence			

Generalisability	21	Discuss the generalisability (external	Addressed in the study		
		validity) of the study results	limitations section.		
Other Information					
Funding	22	Give the source of funding and the	This research received		
		role of the funders for the present	no specific grant from		
		study and, if applicable, for the	any funding agency in		
		original study on which the present	the public, commercial,		
		article is based	or not-for-profit		
			sectors.		
Accessibility of				RECORD 22.1: Authors should provide	Appendices
protocol, raw data,				information on how to access any	provided, code is
and programming				supplemental information such as the study	available upon
code				protocol, raw data, or programming code.	request.

<sup>\*</sup>Reference: Benchimol EI, Smeeth L, Guttmann A, Harron K, Moher D, Petersen I, Sørensen HT, von Elm E, Langan SM, the RECORD Working Committee. The REporting of studies Conducted using Observational Routinely-collected health Data (RECORD) Statement. *PLoS Medicine* 2015; in press.

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**Appendix 2.** Marginal estimates of: (a) mean rate per person-time at risk of unplanned hospital admissions; (b) mean rate per person-time at risk of ED presentations; (c) mean per-person total number of days spent in hospital; (d) per-person average length of stay (in days) for unplanned admissions; (e) mean per-person cost (A\$2012) of unplanned hospitalisations, and; (f) mean per-person cost (A\$2012) of emergency department presentations.

a) mean rate per person-time at risk of unplanned hospital admissions <sup>a</sup>

	La	Last month of life		Last	t 3 months o	f life	Last	t 6 months o	f life	Last 12 months of life			
Initiation of													
community		Lower	Upper		Lower	Upper		Lower	Upper		Lower	Upper	
palliative care		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI	
(months		93 /0 C1	93 /0 CI		93 /0 CI	93 /0 CI		93 /0 CI	93 /0 CI		93 /0 CI	93 /0 CI	
before death)													
1	0.8	0.7	0.8	1.3	1.3	1.4	1.7	1.6	1.7	2.1	2.0	2.2	
2	0.5	0.5	0.5	1.4	1.4	1.5	1.7	1.7	1.8	2.2	2.1	2.3	
3	0.5	0.5	0.5	1.2	1.2	1.3	1.8	1.7	1.9	2.3	2.2	2.4	
4	0.5	0.5	0.6	0.9	0.9	1.0	1.8	1.7	2.0	2.4	2.2	2.5	
5	0.5	0.4	0.6	0.8	0.7	0.9	1.9	1.8	2.0	2.5	2.3	2.6	
6	0.6	0.5	0.7	1.0	0.9	1.1	1.9	1.8	2.1	2.7	2.5	3.0	
7	0.6	0.5	0.7	0.8	0.7	0.9	1.2	1.1	1.4	2.4	2.2	2.6	
8	0.7	0.6	0.8	0.9	0.8	1.0	1.3	1.2	1.5	2.6	2.3	2.9	
9	0.6	0.5	0.7	0.8	0.7	1.0	1.2	1.0	1.3	2.6	2.3	2.9	
10	0.7	0.5	0.8	1.0	0.8	1.2	1.3	1.1	1.5	2.6	2.3	2.9	
11	0.8	0.6	1.0	1.2	1.0	1.4	1.4	1.2	1.7	2.8	2.4	3.1	
≥12	0.8	0.7	0.9	1.0	0.9	1.1	1.3	1.2	1.4	2.1	2.0	2.3	

- a. Adjusted for: age at death, sex, number of hospice visits in last 12 months of life, year of death, place of birth (Australia/New Zealand, or elsewhere), Indigenous status, marital status, multiple cancer diagnoses (coded as yes/no), time between cancer diagnosis and death (in days), socioeconomic status, community palliative care catchment area (north, east or south), comorbidity recorded in previous 12 months (coded as yes/no) and cancer type causing death ((Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas) versus Other).
- b. CI = confidence interval

	La	ast month of	life	Las	t 3 months o	of life	Las	t 6 months o	of life	Last 12 months of life		
Initiation of community			•		_	•			•			•
palliative care		Lower	Upper		Lower	Upper		Lower	Upper		Lower	Upper
(months		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI
before death)												
1	0.6	0.6	0.6	1.1	1.0	1.1	1.3	1.3	1.4	1.6	1.6	1.7
2	0.3	0.3	0.4	1.1	1.1	1.2	1.4	1.3	1.5	1.7	1.6	1.8
3	0.4	0.3	0.4	0.9	0.8	1.0	1.4	1.3	1.5	1.8	1.7	1.9
4	0.4	0.4	0.5	0.7	0.6	0.8	1.4	1.3	1.5	1.8	1.7	2.0
5	0.4	0.4	0.5	0.7	0.6	0.7	1.6	1.4	1.7	2.0	1.8	2.2
6	0.5	0.4	0.6	0.7	0.6	0.8	1.5	1.3	1.6	2.1	1.9	2.3
7	0.4	0.3	0.5	0.7	0.5	0.8	0.9	0.8	1.1	2.0	1.7	2.2
8	0.6	0.4	0.7	0.6	0.5	0.8	0.9	0.7	1.0	1.8	1.6	2.0
9	0.5	0.3	0.6	0.6	0.5	0.8	0.9	0.8	1.1	2.0	1.8	2.3
10	0.5	0.4	0.7	0.8	0.6	0.9	1.0	0.8	1.2	2.1	1.8	2.4
11	0.8	0.5	1.0	1.0	0.8	1.2	1.2	1.0	1.4	2.3	1.9	2.7
≥12	0.7	0.6	0.8	0.9	0.8	1.0	1.2	1.1	1.3	1.8	1.6	2.0

a. Adjusted for: age at death, sex, number of hospice visits in last 12 months of life, year of death, place of birth (Australia/New Zealand, or elsewhere), Indigenous status, marital status, multiple cancer diagnoses (coded as yes/no), time between cancer diagnosis and death (in days), socioeconomic status, community palliative care catchment area (north, east or south), comorbidity recorded in previous 12 months (coded

as yes/no) and cancer type causing death ((Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas) versus Other).

b. CI = confidence interval

c) mean per-person total number of days spent in hospital a

	La	st month of	life	Las	t 3 months o	of life	Las	t 6 months o	f life	Last	12 months	of life
Initiation of community												
palliative care		Lower	Upper		Lower	Upper		Lower	Upper		Lower	Upper
(months		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI
before death)												
1	3.5	3.3	3.6	9.8	9.4	10.2	14.2	13.7	14.8	18.2	17.5	18.9
2	3.5	3.3	3.7	11.1	10.6	11.6	16.0	15.3	16.7	20.4	19.5	21.3
3	3.6	3.3	3.8	11.2	10.5	11.8	17.8	16.8	18.7	21.9	20.7	23.0
4	3.6	3.2	3.9	10.5	9.7	11.3	18.1	16.9	19.3	22.6	21.1	24.1
5	3.3	3.0	3.7	9.9	9.0	10.8	17.6	16.3	19.0	22.1	20.5	23.7
6	3.6	3.1	4.1	10.6	9.4	11.7	17.4	15.7	19.1	25.1	22.8	27.4
7	3.7	3.1	4.2	10.3	9.0	11.7	15.2	13.4	16.9	24.2	21.7	26.6
8	4.1	3.5	4.7	11.7	10.1	13.2	16.8	14.8	18.9	27.2	24.2	30.2
9	4.1	3.3	4.8	11.6	9.8	13.4	16.2	13.8	18.6	24.4	21.4	27.5
10	4.4	3.5	5.3	11.9	9.9	14.0	16.9	14.2	19.6	27.3	23.5	31.2
11	4.0	3.2	4.8	11.6	9.6	13.5	15.2	12.8	17.6	27.3	23.1	31.4
≥12	3.6	3.2	3.9	9.8	8.9	10.8	15.3	14.0	16.6	21.7	19.9	23.5

a. Adjusted for: age at death, sex, number of hospice visits in last 12 months of life, year of death, place of birth (Australia/New Zealand, or elsewhere), Indigenous status, marital status, multiple cancer diagnoses (coded as yes/no), time between cancer diagnosis and death (in days), socioeconomic status, community palliative care catchment area (north, east or south), comorbidity recorded in previous 12 months (coded as yes/no) and cancer type causing death ((Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas) versus Other).

b. CI = confidence interval

d) per-person average length of stay (in days) for unplanned admissions <sup>a</sup>

	Last month of life		Las	t 3 months o	of life	Las	t 6 months o	of life	Last 12 months of life			
Initiation of												
community		T	<b>T</b> I		T	<b>T</b> .T		T	<b>T</b> .T		T	<b>T</b> I
palliative care		Lower	Upper		Lower	Upper		Lower	Upper		Lower	Upper
(months		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI
before death)												
1	2.9	2.8	3.1	6.3	6.1	6.5	7.5	7.3	7.8	8.1	7.9	8.4
2	3.1	2.9	3.3	7.0	6.7	7.3	8.3	8.0	8.6	8.8	8.5	9.1
3	3.2	3.0	3.5	7.2	6.8	7.6	8.9	8.5	9.3	9.2	8.8	9.6
4	3.2	2.9	3.5	7.4	6.9	7.9	9.1	8.5	9.6	9.3	8.8	9.8
5	3.0	2.7	3.3	7.0	6.4	7.6	8.8	8.2	9.3	9.1	8.6	9.7
6	3.2	2.8	3.6	7.2	6.5	7.9	8.5	7.8	9.2	9.4	8.7	10.1
7	3.4	3.0	3.9	7.3	6.5	8.2	9.1	8.2	10.0	10.0	9.2	10.9
8	3.8	3.3	4.4	8.5	7.4	9.5	9.7	8.7	10.8	10.4	9.5	11.4
9	3.7	3.0	4.3	8.2	7.0	9.4	9.1	7.9	10.2	9.8	8.8	10.8
10	3.9	3.1	4.6	8.1	6.8	9.3	9.6	8.3	11.0	10.7	9.5	12.0
11	3.6	2.9	4.3	7.9	6.7	9.1	8.7	7.5	9.9	9.6	8.4	10.8
≥12	3.2	2.8	3.5	7.1	6.5	7.7	9.0	8.3	9.7	9.5	8.9	10.2

a. Adjusted for: age at death, sex, number of hospice visits in last 12 months of life, year of death, place of birth (Australia/New Zealand, or elsewhere), Indigenous status, marital status, multiple cancer diagnoses (coded as yes/no), time between cancer diagnosis and death (in days), socioeconomic status, community palliative care catchment area (north, east or south), comorbidity recorded in previous 12 months (coded

as yes/no) and cancer type causing death ((Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas) versus Other).

b. CI = confidence interval

e) mean per-person cost (A\$2012) of unplanned hospitalisations <sup>a</sup>

	La	ast month of	life	Las	t 3 months o	of life	Las	t 6 months o	of life	Last 12 months of life		
Initiation of												
community			**		•	***		-	***		•	**
palliative care		Lower	Upper		Lower	Upper		Lower	Upper		Lower	Upper
(months		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI
before death)												
1	3,816	3,669	3,964	9,117	8,815	9,419	13,197	12,763	13,632	17,203	16,633	17,773
2	3,752	3,569	3,934	9,607	9,251	9,963	13,989	13,472	14,506	18,311	17,626	18,996
3	3,733	3,510	3,955	9,237	8,807	9,667	14,647	13,998	15,296	18,919	18,070	19,768
4	3,890	3,602	4,178	9,047	8,487	9,608	14,695	13,892	15,499	18,920	17,877	19,963
5	3,609	3,297	3,922	8,527	7,893	9,162	14,645	13,712	15,578	18,932	17,735	20,129
6	3,907	3,501	4,313	9,036	8,234	9,837	14,734	13,561	15,907	21,718	20,018	23,418
7	4,016	3,556	4,476	9,356	8,363	10,349	12,902	11,657	14,147	19,705	17,997	21,413
8	3,794	3,345	4,243	8,931	7,979	9,883	12,691	11,393	13,989	21,007	19,030	22,984
9	4,175	3,563	4,787	9,424	8,226	10,622	13,428	11,763	15,092	19,908	17,783	22,034
10	4,535	3,812	5,258	9,687	8,355	11,019	13,364	11,591	15,137	22,082	19,434	24,730
11	3,908	3,295	4,522	8,833	7,658	10,008	11,720	10,150	13,290	22,691	19,747	25,634
≥12	4,200	3,829	4,571	8,572	7,920	9,223	12,451	11,544	13,359	17,914	16,651	19,178

a. Adjusted for: age at death, sex, number of hospice visits in last 12 months of life, year of death, place of birth (Australia/New Zealand, or elsewhere), Indigenous status, marital status, multiple cancer diagnoses (coded as yes/no), time between cancer diagnosis and death (in days), socioeconomic status, community palliative care catchment area (north, east or south), comorbidity recorded in previous 12 months (coded as yes/no) and cancer type causing death ((Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas) versus Other).

b. CI = confidence interval

f) mean per-person cost (A\$2012) of emergency department presentations <sup>a</sup>

	Last month of life		Las	Last 3 months of life			t 6 months o	of life	Last 12 months of life			
Initiation of community palliative care		Lower	Upper		Lower	Upper		Lower	Upper		Lower	Upper
(months		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI		95% CI	95% CI
before death)												
1	215	207	222	507	492	523	748	726	770	1,006	976	1,037
2	204	195	213	516	499	534	773	747	799	1,034	999	1,069
3	208	197	219	486	466	506	762	732	792	1,021	980	1,062
4	201	189	213	450	425	474	755	719	791	1,014	964	1,063
5	209	195	223	442	414	470	788	744	832	1,094	1,033	1,156
6	217	199	235	460	423	497	791	735	848	1,132	1,052	1,212
7	207	186	227	455	413	497	677	618	736	1,073	991	1,156
8	206	186	225	456	412	499	663	601	725	1,073	981	1,164
9	197	175	219	453	403	503	670	597	743	1,100	993	1,206
10	224	196	252	497	437	557	651	575	727	1,091	974	1,208
11	220	193	247	476	422	530	737	646	827	1,236	1,096	1,376
≥12	219	204	234	478	447	508	710	665	755	1,021	958	1,085

a. Adjusted for: age at death, sex, number of hospice visits in last 12 months of life, year of death, place of birth (Australia/New Zealand, or elsewhere), Indigenous status, marital status, multiple cancer diagnoses (coded as yes/no), time between cancer diagnosis and death (in days), socioeconomic status, community palliative care catchment area (north, east or south), comorbidity recorded in previous 12 months (coded as yes/no) and cancer type causing death ((Bladder/urinary tract, Breast, Unknown, Cervix, Colorectal, Kidney, Laryngeal, Leukaemia, Liver, Lung/Bronchial, Lymphoma, Melanoma, Mesothelioma, Myeloma, Oesophageal, Ovarian, Prostate, Stomach, Testicular, Thyroid, Uterine, Pancreas) versus Other).

b. CI = confidence interval