Genomic alterations and the incidence of brain metastases in advanced and metastatic non-small cell lung cancer: a systematic review and meta-analysis

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- 2 metastatic non-small cell lung cancer: a systematic review and meta-analysis
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72 **ABSTRACT**

73 Background

Brain metastases (BM) in patients with advanced and metastatic non-small cell lung cancer
(NSCLC) are linked with poor prognosis. Identifying genomic alterations associated with BM
development could influence screening and determine targeted treatment. We aimed to
establish prevalence and incidence in these groups, stratified by genomic alterations.

78 Patients and Methods

79 A PRISMA-compliant systematic review and meta-analysis was conducted (PROSPERO ID

80 CRD42022315915). Articles published in MEDLINE, EMBASE, and Cochrane Library between

81 January 2000-May 2022 were included. Prevalence at diagnosis, and incidence of new BM

82 per year were obtained, including patients with *EGFR*, *ALK*, *KRAS*, and other alterations.

83 Pooled incidence rates were calculated using random effects models.

84 Results

85 Sixty-four unique articles were included (24,784 NSCLC patients with prevalence data from

86 forty-five studies and 9,058 NSCLC patients with incidence data from forty studies). Pooled

87 BM prevalence at diagnosis was 28.6% (45 studies, 95% Confidence Interval [CI] 26.1-31.0),

and highest in patients that are *ALK*-positive (34.9%) or with *RET*-translocations (32.2%).

89 With a median follow-up of 24 months, per-year incidence of new BM was 0.13 in the wild-

90 type group (14 studies, 95% CI 0.11-0.16). Incidence was 0.16 in the EGFR group (16 studies,

95% CI 0.11-0.21), 0.17 in the ALK group (5 studies, 95% CI 0.10-0.27), 0.10 in the KRAS

92 group (4 studies, 95% CI 0.06-0.17), 0.13 in the ROS1 group (3 studies, 95% CI 0.06-0.28),

93 and 0.12 in the *RET* group (2 studies, 95% CI 0.08-0.17).

94

95 Conclusions

96 Comprehensive meta-analysis indicates a higher prevalence and incidence of BM in patients

97 with certain targetable genomic alterations. This supports brain imaging at staging and

98 follow-up, and the need for targeted therapies with brain penetrance.

99 INTRODUCTION

100 Lung cancer is a major global health problem, with an estimated 2 million new cases every year and 1.8 million deaths.¹ Non-small cell lung cancer (NSCLC) is the commonest form and 101 102 accounts for 85% of all lung cancers.² Advanced (Stage III) and metastatic (Stage IV) NSCLC 103 confer the worst prognosis, with 5-year survival rates of 15% and 5% respectively.³ The survival is improving due to a combination of novel targeted agents, earlier diagnosis, and 104 105 other treatment advances such as immunotherapy.⁴ Recent trials have demonstrated 106 improved overall survival (OS) with targeted therapies for tumors carrying specific genomic alterations, such as EGFR⁵ and ALK.^{6,7} 107

Up to 60% of patients with NSCLC are expected to have central nervous system (CNS) 108 involvement at some point during their disease.⁸ Development of brain metastases (BM) 109 specifically in NSCLC is associated with reduced OS, progression-free survival (PFS), and 110 quality of life,^{9,10} although earlier detection seems to improve survival.¹⁰ Screening 111 programmes to detect asymptomatic BM and the use of prophylactic cranial irradiation (PCI) 112 to reduce the risk of BM development remain controversial.^{11,12} There is a knowledge gap 113 around the prevalence of BM, the rate at which they develop, and the factors that drive the 114 process.¹³ Although the discovery of genomic alterations in NSCLC has facilitated the 115 development of targeted agents, the impact of these alterations (such as EGFR, ALK, KRAS, 116 ROS1, RET, and others) on BM development remains mostly unclear. 117

A systematic review and meta-analysis of the incidence and prevalence of BM in NSCLC both 118 119 overall and stratified by genomic alterations is valuable. It would help clinicians understand 120 the full burden of disease, quantify the potential benefits of BM screening programmes and to individualize treatment and monitoring in any subgroups at higher risk. The following 121 questions were therefore addressed in this review: 1. In patients with advanced and 122 metastatic NSCLC, what is the prevalence of BM at diagnosis and the incidence of new BM 123 per year, and 2. Do these figures differ by the presence of the most common genomic 124 alterations? 125

126

127

128 MATERIAL AND METHODS

129

130 Search strategy and selection criteria

We conducted a systematic review and meta-analysis according to the Preferred Reporting
ltems for Systematic Reviews and Meta-Analyses (PRISMA) guidelines.¹⁴ The review was
registered in PROSPERO (CRD42022315915) and the protocol changed once to allow a
combined rate of BM among NSCLC populations at the end of follow-up to be calculated.
We searched Medline, Embase, and the Cochrane database of systematic reviews for fulltext articles published in English, between the publication date 1st January 2000 and 30th
May 2022. The date of last search was 30th April, 2022. Search terms used a combination of

the words 'lung', 'met', and 'incidence' (Supplementary Table 1, 2, and 3). The Population,

139 Intervention, Comparator, Outcome, Study Design (PICOS) criteria was used (Supplementary

Table 4). We included studies of adults (≥16 years) with either advanced (Stage III) or

141 metastatic (Stage IV) NSCLC that reported either the prevalence of BM at diagnosis,

incidence, or both. We excluded studies that were conference abstracts, and studies

143 published before January 2000 (to exclude the pre-MRI era as this greatly affects BM

144 detection).¹⁵ We excluded studies with selective populations (including studies of only BM),

and if stage specific data was unavailable. For studies that were randomized control trials

146 (RCTs), we excluded treatment arms if they included PCI as an intervention, as PCI is

147 currently not standard of care and could affect BM incidence.

148

Three reviewers (CSG, MAM, GER) independently screened titles, abstracts and full-text to
include articles. If reviewers failed to reach consensus, a pair of senior authors, one a
trained medical statistician (DH, RZ) made a final determination.

152

153 Data extraction

154 Data extraction was completed in full and in duplicate by at least two authors per paper.

155 The following data were gathered about included studies: year published, journal, type of

study (RCT and observational), and stages of NSCLC included (Stage III, Stage IV, or mixed). If
the study was an RCT, the intervention and type of treatment were recorded (e.g. Tyrosine
Kinase Inhibitors [TKI], chemotherapy, PCI).

Numerical data extracted from each study: total population with NSCLC, number of patients with BM at diagnosis, prevalence at diagnosis, median follow-up time (months), total number of patients without BM who had follow up, total number of patients developing BM, overall incidence of BM, and incidence per year of patient follow up. Median time to development of BM from NSCLC diagnosis was extracted if available. It was specifically noted if a screening programme to detect BM was used during follow-up.

165

166 **Quality assessment**

Retrospective studies were classified according to the Newcastle Ottawa Scale,¹⁶ and RCTs
 were assessed according to the Cochrane Risk of Bias 2.0 tool.¹⁷ For studies that were *post- hoc* analyses of prior RCT data, we assessed the original trial publication from which data
 was extracted.

171

172 Definitions

A study was defined as a 'mixed' cohort if it included both Stage III and Stage IV patients 173 together – this was often studies that described 'advanced' lung cancer without specifying 174 stage. Studies were recorded as having a screening program in place to detect BM during 175 176 follow-up if they specified the time when patients were scanned regardless of symptoms (which were often as part of standardized imaging protocols). Annual incidence rates were 177 calculated by dividing the number of patients who developed BM during follow-up/number 178 179 of patients without BM at start of study period, divided by the length of that follow up period in months then multiplying by 12. 180

181

182 Statistical analysis

For the meta-analysis, we used a random effects model for pooled proportions estimates for 183 prevalence at diagnosis, and meta-analysis of single incidence rates for per-year 184 incidence.^{18,19} This was repeated for each molecular subgroup, with two or more included 185 studies required to perform meta-analysis. We generated forest plots for incidence based 186 187 on a random intercept generalized linear mixed model. For each random effects model, we 188 tested heterogeneity using the maximum restricted likelihood estimator. Prevalence was calculated using pooled proportions methods using the inverse variance method. Total 189 heterogeneity and I² characteristics were calculated. Publication bias was evaluated and 190 191 presented as funnel plots.

Sensitivity analysis was performed to assess the effect of the following variables in our
analysis: Screening programmes, high risk of bias, and Stage. For the *ALK*-positive subgroup,
since it is known that second and third generation TKIs such as Alectinib, Brigatinib, and
Lorlatinib significantly reduce BM incidence^{7,20} we analyzed the data for all patients, then
excluding those receiving such agents.

All statistical analysis was supervized by a senior academic statistician (DMH). Data analysis
of descriptive statistics was performed using SPSS (Version 27; IBM; Armonk; NY; USA). R
statistics (Rstudio Version 4.0.1) was used to perform meta-analysis, and create figures,
forest, and funnel plots (ggplot2 and meta packages).

201

202 **RESULTS**

203 Systematic Review and Characteristics

204 After full-text assessment, 132 studies were assessed as possibly suitable for inclusion. An additional 70 studies were then excluded (Supplementary Table 5). An additional two 205 206 studies were identified by hand searching, resulting in 64 total studies being included in the analysis after applying inclusion and exclusion criteria (Figure 1). In total, six studies were 207 RCTs, ²¹⁻²⁷ four studies were *post-hoc* analyses of RCTs, ^{20,28-31} and 54 were observational 208 studies. In total, forty-five studies included prevalence data, and forty studies included 209 incidence data. Of the forty-five studies with prevalence data, twenty one included 210 incidence rates, giving 64 unique studies in total. 211

212

213 Baseline characteristics

- 214 The baseline characteristics of included studies are shown in detail (Supplementary Table 6).
- The median number of patients included per study was 199 (IQR 111-472, range 4-6,545). Of
- these, 45 studies had brain metastatic status at diagnosis available (24,784 patients), and 40
- studies had BM incidence available for patients without BM at presentation (9,058 patients).
- 218 Included studies used a variety of methods to assay for genomic alterations including FISH,
- 219 next generation sequencing (NGS), arrays, and/or combinations of these. No studies used
- 220 liquid biopsies to detect genomic alterations.
- 221

222 Screening and follow-up

223 Eleven studies (16.9%) reported screening patients for BMs as part of follow-up protocols.

Among the 40 studies with incidence data, the median follow-up period was 24 months (IQR

- 225 16-36 months).
- 226

227 Prevalence of BM at diagnosis

- 228 Forty-five studies including 24,784 patients reported BM prevalence at diagnosis of
- metastatic NSCLC, with a prevalence of 28.4% (95% CI 26.0-30.9) (Supplementary Table 6).
- 230 Pooled prevalence among Stage IV studies was 26.8% (95% CI 24.0-29.6). The pooled
- prevalence for mixed studies containing both Stage III and Stage IV was 33.1% (95% CI 27.3-
- 232 39.2).
- 233

234 BM prevalence in patients with specific genomic alterations

- 235 Pooled prevalence forest plots are shown in Table 1 and Supplementary Figure 1. Pooled
- prevalence was 29.4% in the *EGFR*-positive group (22 studies, 3990 patients, 95% CI 24.5-
- 237 34.5), 34.9% in the ALK-positive group (9 studies, 782 patients, 95% CI 23.4-47.3), and 30.2%
- in the *KRAS*-positive group (8 studies, 695 patients, 95% CI 24.4-36.2). Prevalence was 29.4%
- in the ROS1-positive group (3 studies, 141 patients, 95% CI 29.5-34.5), 32.2% in the RET-

positive group (3 studies, 203 patients, 95% CI 18.6-47.3), and 28.8% in the wild-type group
(9 studies, 14,447 patients, 95% CI 23.7-34.2).

242

243 Pooled incidence of BM

244 The pooled incidence is shown in Table 2 (Supplementary Table 7). Forty studies including

245 9,058 patients without BM at diagnosis of advanced NSCLC reported cumulative incidence.

The pooled incidence per year was 0.11 (95% CI 0.09-0.13) (Supplementary Figures 2 and 3).

The pooled incidence per year among Stage IV studies was 0.12 (95% CI 0.09-0.15). The

pooled incidence among Stage III studies was 0.11 (95% CI 0.08-0.15).

249

250 Pooled incidence stratified by genomic alterations

Pooled incidence plots are shown in Figures 2 and 3 (Supplementary Table 8). Using random 251 effects models, pooled incidence of new BM was 0.16 per-year in the EGFR-positive group 252 (16 studies, 2556 patients, 95% CI 0.11-0.21), and 0.12 per-year in the ALK-positive group (6 253 254 studies, 630 patients, 95% CI 0.07-0.17). When removing patients treated with second or 255 third generation TKIs in the ALK-positive cohort, the incidence increased to 0.17 per year 256 (95% CI 0.10-0.27) (Figure 3). Incidence was 0.10 per-year in the KRAS-positive group (4 studies, 286 patients, 95% CI 0.06-0.18). One study provided information on types of TKI 257 treatment: 8 patients received no treatment (12.3%), 55 (84.6%) chemotherapy at any 258 point, 2 (3.1%) EGFR-TKI, and 16 on EGFR-TKI at any point in treatment. 259

260 Pooled incidence of new BM was 0.13 per-year in the *ROS1*-positive group (3 studies, 117

patients, 95% CI 0.06-0.28), and 0.12 per-year in the *RET*-positive group (2 studies, 113

262 patients, 95% CI 0.08-0.17). In the *RET*-positive group, one study referenced Multikinase

inhibitor treatment that included multiple agents.³² In one study, 46 (78%) had permetrexed

- 264 based chemotherapy, 19 (32.3%) vandetanib, 12 (20.3% EGFR TKI), and 13 (22.0%)
- 265 immunotherapy.³³ In the C-MET exon skipping mutation group, the rate was 0.08 per-year
- 266 (2 studies, 72 patients, 95% CI 0.06-0.11). Pooled incidence of new BM was 0.13 per-year in
- the wild-type group (14 studies, 2156 patients, 95% CI 0.11-0.16).

Incidence amongst other genomic subtypes- BRAF, PI3CK, HER-2, FGFR1

As all other genomic subtypes included fewer than 2 studies, their results are presented descriptively (Supplementary Table 9 and Figure 4). Of these, the *HER-2* positive group had the highest per-year incidence rate (0.23). Forty-three percent of the patients in the *HER-2*-group (42 of 98) received *HER-2*-targeted therapy at diagnosis (afatinib, neratinib, ado-trastuzumab emtansine, trastuzumab, and/or dacomitinib).³⁴

Combined prevalence and incidence at the end of follow-up period

21 studies including 6425 patients reported both a prevalence and number developing BM at the end of the follow-up period. Among these, the combined incidence and prevalence at the end of the study period – median 2 years - was 55.0% (IQR 42.2-67.8).

Assessment of bias

The assessment of bias for retrospective cohort studies, using the Newcastle-Ottowa Scale, is shown (Supplementary Figure 4). The mean score (out of 9) for all studies was 7.5, and 11 studies were classified as high risk of bias. For the RCTs and post-hoc analysis of RCTs, one study was classified as high risk of bias (Supplementary Figure 5). The funnel plots for each forest plot generated are shown (Supplementary Figure 6).

Sensitivity analysis

The results of the 3-step sensitivity analysis are shown (Supplementary Table 10). There was no difference in the rates of incidence of BM when comparing Stage 3 to Stage 4 NSCLC. Removing the ten retrospective studies and one RCT classified as high risk of bias increased the incidence per year to 0.12 (95% CI 0.10-0.14) from 0.07 (95% CI 0.05-0.11). Studies that actively used a screening programme had no difference in BM incidence compared to studies without a screening programme (0.10, 95% CI 0.07-0.13 vs 0.11, 95% CI 0.09-0.13).

DISCUSSION

This is the first systematic review and meta-analysis to combine data about the prevalence and incidence of BM in both advanced and metastatic NSCLC with targetable genomic alterations. Of the 24,784 included patients, almost 30% with advanced NSCLC were found to have BM at the time of diagnosis. Among those without BM at diagnosis, approximately 11% will develop BM per year. At a median of two years from diagnosis, 55% of patients with advanced and metastatic NSCLC will have BM, either because they had them at presentation or they developed them in the intervening period. *ALK*-positive (17.0%/year) and *EGFR*-positive (15.8%/year) NSCLC have higher rates of BM development than wild type (12.5%/year).

BM are frequently encountered in NSCLC, with primary lung cancers being responsible for 50% of all diagnosed BM.^{35,36} Prior to this study, population estimates of prevalence at diagnosis varied between 20 and 60%.^{37,38} This study provides clarification of this figure to approximately 30%. The high prevalence at diagnosis indicates that cranial imaging during baseline staging, particularly in metastatic lung cancer, should be considered. Existing guidelines do not advocate this practice, often citing low prevalence for this recommendation.³⁹⁻⁴² There have been few studies investigating the cost-benefit of these programmes, but it is clear that BM in NSCLC carry a significant symptomatic and economic burden.^{29,43,44} Detection while asymptomatic could improve quality of life, expedite treatment decisions and increase the pool of patients eligible for surgical and non-surgical treatments.^{29,45-47} At 2 years after diagnosis, 55% of patients will have BM. Therefore, the burden of BM in the natural disease course of advanced and metastatic NSCLC is high. Resources and scientific funding should reflect this high prevalence, incidence, and burden-with studies focussed on preventing, managing, and treatment of BM.

The high rates of development of BM in patients who did not have them at presentation – 11% overall, 12.5% for wild type NSCLC - indicate that BM remain a significant component of the advanced and metastatic NSCLC disease course.⁴⁸ There was no difference in cumulative incidence in Stage III and Stage IV groups- suggesting that brain imaging should be considered in patients already with stage III disease and beyond. Our analysis illustrates that patients with *ALK*-positive and *EGFR*-positive NSCLC had higher rates of BM development

than other genomic alterations and wild type tumours, which is supported by the literature.^{49,50} The association of BM with particular subgroups may drive novel preclinical research around mechanisms of BM development even if initial studies suggest NSCLC lung driver mutations may lack concordance in subsequent BM.⁵¹ Other genomic alterations have been postulated to be associated with metastasis development- such as *ROS1*, *MET*, and *RET*.⁵²⁻⁵⁵ However, our study does not support a higher rate of BM in these cases compared to wild-type cohorts^{52,56,57} perhaps due to these series having a high usage of TKIs and targeted treatments.

There is ongoing debate regarding the use of whole brain radiotherapy (WBRT) to reduce BM incidence, and the balance between significantly reducing new BM incidence,²⁴ and risk of cognitive decline.^{11,12} We explicitly excluded studies using PCI in this analysis. Stereotactic radiosurgery (SRS) for confirmed BM may extend survival whilst mitigating cognitive effects with the aim of reduced morbidity from BM.⁵⁸ Nonetheless, this study was not designed to examine the effects of different forms of radiotherapy on BM incidence or development and this question has been addressed in other studies.⁵⁹

Significant differences were noted between groups with different driver mutations- most notably *EGFR* and *KRAS* having increased rates of BM development (0.16 and 0.17 respectively) and *MET* (0.08) having the lowest. It has been established in previous studies that many patients with BM have *EGFR*, *ALK*, and *KRAS* mutations, but the explanations behind this association are yet to be fully elucidated.⁶⁰ Lower rates could be the result of a lack of studies in the lesser encountered mutations,^{28,61} or the presence of more effective treatments that may penetrate the blood-brain barrier.²⁸ We also observed significant differences within included studies of the same genomic alteration. In the *EGFR* group, one study had a incidence rate of 0.04 per-year,⁶⁰ and three studies had rates of 0.4 per-year.⁶²⁻⁶⁴ Likewise, for *KRAS*, one study had an incidence rate more than double the pooled rates.³¹ This study included patients treated with crizotinib, a first generation TKI, which is known to be less efficacious at preventing BM compared to second and third generation TKIs.^{6,30} Variations in treatment paradigms, monitoring and surveillance, and study quality may all affect the differential rates observed in our review.

In summary, our results have important implications for clinical practice and future research. BMs are a significant cause of morbidity and mortality in NSCLC, and close

monitoring of higher risk groups or imaging for the presence of BM at diagnosis could allow earlier detection of asymptomatic BM which may be more amenable to therapies such as radiosurgery, surgery or targeted agents. Identifying the factors that drive the process of BM and identifying genomic targets could help prevent CNS spread and subsequent progression.^{51,65,66} Trials of both *EGFR* and *ALK* inhibitors have shown reduced risk of BM and improved overall survival.^{67,68}

Limitations

This study has several limitations. Firstly, many studies were retrospective, and some were excluded due to not having a median follow-up time, or stage-specific data. Additionally, this study did not include incidence for Stage I and Stage II lung cancer. While these populations have longer survival, the incidence of BM is much lower, and therefore the clinical benefits of detection are reduced.^{69,70} We also did not include articles in languages other than English – this excluded at least one study from inclusion.⁷¹ In order to obtain pooled estimates of prevalence and incidence, studies including patients on mixed kinase inhibitors and in some cases immunotherapy were pooled. This is certainly a confounder as the effects of these therapies on BM in treatment naïve patients is poorly understood and indeed CNS penetrance of many novel agents is unknown. This may explain the lower rates of incidence in ALK and ROS groups reported here compared to existing literature.⁷² We mitigated this by analysing separately the data for patients treated with known CNS penetrant TKIs, but detail about agents and incidence rates was not given in all studies and individual patient data to allow survival analyses was not available. There was also significant intra-genomic variation in BM incidence for studies that examined the same mutation- this may also be influenced by experimental treatment paradigms offered by the studies, differences in case mix, and other factors. We also used median follow up time rather than mean follow up time to calculate cumulative incidence. Since survival times are often skewed, this may have underestimated the person time at risk and overestimated incidence. However, we are unable to assess the extent to which this is the case without individual patient data.

The studies included in the meta-analysis also demonstrated significant heterogeneity and publication bias. However, we aimed to include all studies in our analysis to best ascertain the natural history and rates of BM and mitigated the between-study heterogeneity by running random effect models. Finally, while we included over 15 *EGFR*-positive studies, the rarer the alteration, the fewer the studies were available for the meta-analysis. This is to be expected given the nature of these alterations, but is nonetheless a significant limitation which can hopefully be addressed in future with accrued data.

CONCLUSION

This is the first systematic review and meta-analysis to evaluate the prevalence and incidence of BM in advanced and metastatic NSCLC, stratified by molecular and genomic alterations. The high prevalence at diagnosis (around 30%) and incidence during follow up (11% per year) indicates careful attention to the current brain screening and follow up arrangements both locally and nationally are needed and consideration to personalising such pathways in higher risk patients (*ALK* and *EGFR*-positive) is needed.

CONFLICT OF INTEREST STATEMENT

The authors have declared no conflicts of interest.

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DATA SHARING STATEMENT

All files and manuscript data are available, by contacting the corresponding author.

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FIGURE LEGENDS

Figure 1. PRISMA Flow diagram, of study selection for inclusion in this review and metaanalysis.

Figure 2. Forest plot of incidence per year in *EGFR*-positive advanced NSCLC.

Figure 3. Panel of forest plots of incidence rates per year in ALK (all patients), ALK (with patients receiving TKI removed), KRAS, ROS-1, RET, and MET-positive advanced NSCLC.

Figure 4. Violin plot (fixed width 1) and histogram of combined raw incidence rates per year, stratified by genomic alteration (diamond= mean, red line= comparative line across Wildtype mean [0.14], dots=each study). *Note BRAF, HER-2 not included due to having one study with data available.

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TABLES

Table 1: Incidence and prevalence of brain metastases in advanced NSCLC, stratified by genomic alterations. *=TKI removed.

	Included studies	Number with BM (%)		Pooled Prevalence			
	(Number of patients)			(%; 95% CI)			
Prevalence	Prevalence						
All studies	45 (24,784)	6544	(26.4)	28.6 (26.1-31.1)			
Stage IV	31 (19,381)	4958	(25.6)	26.8 (24.0-29.6)			
Stage III	2 (396)	NA		NA			
Mixed	12 (5007)	1480 (29.6)		33.1 (27.3-39.2)			
EGFR	22 (3990)	1082 (30.6)		29.4 (24.5-34.5)			
ALK	9 (782)	248 (31.7)		34.9 (23.4-47.3)			
KRAS	8 (695)	208 (30.0)		30.2 (24.4-36.2)			
ROS1	3 (141)	43 (34.3)		30.1 (21.4-39.5)			
RET	3 (203)	57 (28.0)		32.2 (18.6-47.3)			
Wild-type	9 (14447)	3689 (25.6)		28.8 (23.7-34.2)			
Incidence per year							
	Included studies	Median follow-	Number	Pooled Incidence			
	(Number of patients)	up in months	developing BM	(%; 95% CI)			
		(IQR)	(%)				
All studies	40 (9058)	24.0 (16.3-36.0)	1745 (19.3)	0.11 (0.09-0.13)			
Stage IV	14 (2760)	18.6 (14.8-29.0)	398 (14.4)	0.12 (0.09-0.15)			
Stage III	11 (1949)	24.0 (21.0-38.3)	449 (23.0)	0.11 (0.08-0.15)			
Mixed	15 (4349)	24.1 (16.4-36.0)	898 (20.6)	0.10 (0.08-0.13)			
EGFR	15 (2556)	20.3 (12.5-25.2)	638 (25.0)	0.16 (0.11-0.21)			
ALK*	7 (794)	36 (24.0-36.0)	284 (31.2)	0.17 (0.11-0.26)			
KRAS	4 (286)	21.4 (15.8-26.8)	44 (15.4)	0.10 (0.06-0.17)			
ROS1	3 (117)	30.0 (22.1-NA)	36 (30.8)	0.13 (0.06-0.28)			

RET	2 (113)	39.5 (19.5-NA)	44 (38.9)	0.12 (0.08-0.18)
C-MET	2 (72)	40.0 (39.0-NA)	17 (23.6)	0.08 (0.07-0.11)
Wild-type	14 (2156)	22.5 (14.8-32.6)	474 (22.0)	0.13 (0.11-0.16)
	Pooled proportion			
				(%; 95% CI)
All studies 21 (6425)				



Journal Pression







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